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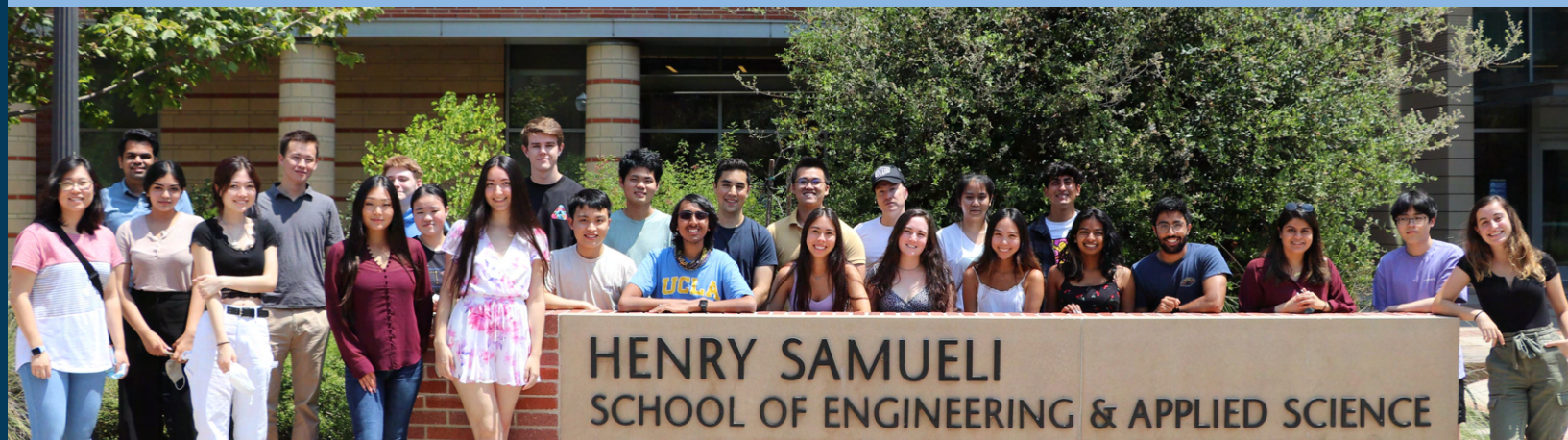
*Research Journal*



***SURP 2021***

UCLA SAMUELI SUMMER UNDERGRADUATE RESEARCH PROGRAM





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## DEAN'S MESSAGE



*Ronald and Valerie Sugar Dean*

The Summer Undergraduate Research Program (SURP) provides an intensive summer research experience in a wide range of engineering and physical science fields. Undergraduate students from all walks of life participate in research with UCLA Samueli School of Engineering faculty to gain real-world lab experience.

Due to the COVID-19 pandemic that is still affecting us this summer, SURP has had to transition the program into a remote learning environment for many of its scholars. Despite this challenge, SURP's many scaffolding resources and social events have still been able to occur and students were able to:

- Conduct research in a cutting-edge field at a world-renowned research institution.
- Meet and network with a community of peers who have similar goals and interests.
- Create a professional scientific poster and publish a research abstract.
- Learn to communicate research outcomes and present a detailed Summary of Project.
- Gain a competitive advantage for engineering graduate schools.
- Learn how you can impact your community as an engineer.

This year, a record 66 undergraduate students were selected to join the 2021 SURP cohort, spread out across 31 faculty in 6 engineering departments. We are happy to announce 64% of these are women, 20% are underrepresented minorities, and many are first generation and low income students. SURP is involved with ongoing efforts in fostering a more diverse, equitable and inclusive community at UCLA Samueli Engineering.

Creating new knowledge is a very difficult yet important task, and these high-performing students have done an outstanding job working through the rigors of academic research. These students should be very proud of all that they have accomplished in a short time this summer. I encourage you to explore our publication and learn about all the cutting-edge knowledge that is being created here.

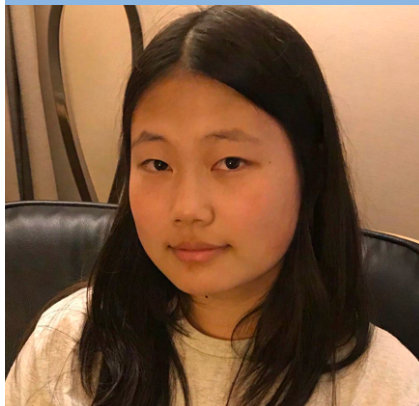
Sincerely,

A handwritten signature in black ink, appearing to read "Jayathi Murthy".

Dr. Jayathi Murthy  
Ronald and Valerie Sugar Dean



Julia Bi



Electrical Engineering  
Freshman, UCLA

## Autonomous Vehicle with Offloaded Server Control using Mobile Edge Computing

*FACULTY ADVISOR*

C.K. Ken Yang

*DAILY LAB SUPERVISOR*

Jack Irish

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Electrical and Computer Engineering

*ABSTRACT*

Modern day mobile applications not only require a low latency, but but also incur a high energy cost. However, mobile devices are limited in their battery life and computational capabilities. Mobile Edge Computing (MEC) reduces latency and energy consumption by offloading some or all of the computing tasks to MEC servers. The Mobile Edge Compute Applications (MECA) lab establishes a 5G development environment that allows for experiments and testing with the 5G network and MEC. This particular project is an autonomous car controller which offloads control decisions to a central server, using a camera as input. Using gRPC, the camera sends images to the central server, which processes them and returns a control signal to guide the car. The goal is to compare the latency of this setup with traditional autonomous car controllers and achieve similar or better performance. At the moment, since it is difficult to gain access to physical materials, a simulation that imitates the complexity of video processing was used to gather data on the effectiveness of this strategy. As expected, sending the processing to a server is more time consuming with simple tasks, due to the initial time cost associated with the server-client communication. With more complex tasks, the server processing time is faster than processing at the client, since the server has better computational capabilities. The next step is applying these concepts to a physical setup with proper video processing and a car which takes the control signal.

## Autonomous Vehicle with Offloaded Server Control Using Mobile Edge Computing

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Department of Electrical and Computer Engineering, University of California – Los Angeles

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**FAST TRACK  
TO SUCCESS**  
UCLA Electrical and  
Computer Engineering

### Introduction

The project aims to test concepts of Mobile Edge Computing (MEC), a technology that reduces latency and energy consumption of mobile devices through offloading computing tasks to external servers. Specifically, this concept was applied to an autonomous car that offloads decisions to a central server.

The goal is to measure the performance and latency of this setup, and compare it to traditional autonomous car controllers. We hypothesize that using MEC will allow the offloaded controller to have similar or better performance.

### Background

Modern day mobile applications not only require a low latency, but also incur a high energy cost. However, mobile devices are limited in their battery life and computational capabilities.



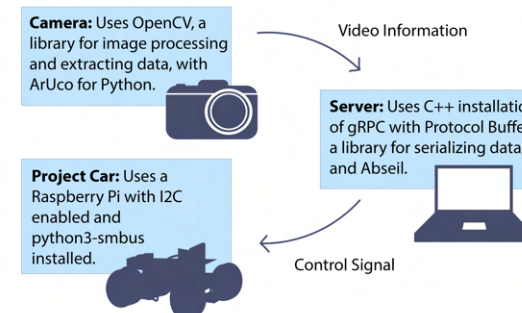
**Figure 1: Mobile Edge Computing (MEC)** solves this issue by offloading some or all of the computing tasks to MEC servers at the edges of mobile networks, therefore improving efficiency and reducing latency.

This project is an autonomous car controller which, instead of making decisions on the car itself like traditional controllers, offloads control decisions to a central server, which becomes more efficient as the computations become more complex. The car uses a camera as input. It streams video to the central server, which processes the video and returns a control signal.

### Materials and Methods

#### Client-Server Communication:

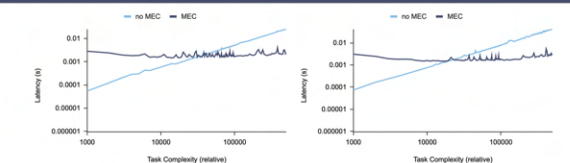
To communicate between the camera, server, and car, the project uses gRPC. gRPC is Google's open source RPC (Remote Procedure Call) system that allows for bidirectional messages as well as streaming.



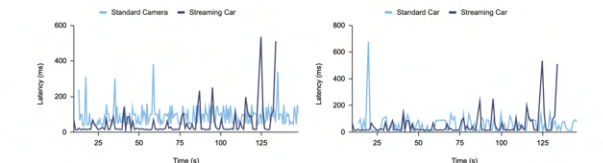
**"Standard" Setup:** The camera does the image processing and sends its results to the server, which then sends the results to the car. The image processing time is included in the camera-server latency.

**"Streaming" Setup:** The camera streams video directly to the server, which processes it and sends the result to the car. The image processing time is included in the server-car latency.

### Results and Discussion



**Figure 2: Task Complexity v. Latency Plots.** Two simulations that imitate the complexity of video processing were used to gather data. As expected, server processing is more time consuming with simple tasks, due to the initial time cost of communication. With more complex tasks, the server processing time is faster because it has better computational capabilities.



**Figure 3: Time v. Latency Plots.** *Left Plot:* The camera-server latency for the Standard setup and the server-car latency for the Streaming setup, both of which include the video processing, are plotted. The Streaming latency is on average lower than the Standard Latency by 39.2 ms, since the server has better computational capabilities. *Right Plot:* The server-car latencies for both the Standard and Streaming setup are plotted. The average latencies are roughly equal (Standard: 55.8 ms, Streaming: 49.3 ms), which is unexpected, since while their baseline latencies should be similar, the Streaming setup should be slightly slower on average because of the time taken by the server to do the image processing.

### Conclusion

The relative efficiency of MEC vs Non-MEC in the simulation trials is as expected and confirms theory. The relative efficiency in the camera-car trials is somewhat unexpected and unclear, and should be investigated further.

#### Future Steps:

1. Further refine camera-car systems to stabilize latency measurements.
2. Gather and analyze data to explain unexpected results and confirm trends.

### References

Gu, Xiaohui et al. "Energy-Optimal Latency-Constrained Application Offloading in Mobile-Edge Computing." *Sensors* (Basel, Switzerland) vol. 20,11 3064. 28 May. 2020. doi:10.3390/s20113064  
<https://pubmed.ncbi.nlm.nih.gov/32481742/>  
Mobile Edge Compute Applications Laboratory. <https://mecalab.seas.ucla.edu>  
gRPC. <https://grpc.io>

### Acknowledgements

I would like to thank Professor Yang and the MECA Lab, as well as the Samueli Engineering Summer Undergraduate Research Program and the Fast Track Program, for the support and resources. Many thanks to Jack Irish for his guidance and framework for this project. Many thanks to the Samueli Research Scholars Program for funding this research.



## Gianna Brown



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# How Implementing a Diverse Training Set Affects Skin Tone Bias in Deep Learning Algorithms

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## ABSTRACT

The COVID-19 pandemic has highlighted the growing need for avenues that will allow doctors to assess and treat their patients virtually rather than in person. One important component needed to implement telemedicine visits is the ability to take a person's heart rate virtually. Currently, there are algorithms that are able to do this by extracting ppg, which is the measure of blood flow under the skin. However, previous research has shown that their accuracy varies based on skin tone, with a much higher accuracy for lighter skin tones than darker ones. These inaccuracies need to be corrected before this technology is allowed to be used in the medical field in order to ensure equitable performance among all patients. Our lab attempts to minimize this bias by incorporating diverse training sets to train deep learning algorithms DeepPhys and PhysNet in order to determine the optimal proportion of lighter to darker skin tones in our training set needed to achieve an accurate ppg reading for all skin tones. Participants were asked to connect to a pulse oximeter and placed in front of a white background, while five one-minute videos were taken in sync with the pulse oximeter ppg readings. These videos were then used to train and test DeepPhys and PhysNet with different proportions of lighter skin tones to darker skin tones. Although the experiment is not yet complete, initial results show that having more darker skin participants in the training set decreases the accuracy of the networks in the testing set, but we believe that this is due to not having enough darker skin toned participants needed to truly test our hypothesis.

# How Implementing a Diverse Training Set Affects Skin Tone Bias in Deep Learning Algorithms

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### INTRODUCTION

Heart rate can be virtually measured through various algorithms, but previous research has shown that they are less accurate for darker skin tones. Our lab attempted to correct this bias by adjusting the training set of existing algorithms and finding the proportion of dark, medium, and light skin tones that need to be represented in the algorithm's training set in order to get accurate and unbiased results.




Figure 1 Screenshot from a video These videos are used to train deep learning algorithms DeepPhys and PhysNet before testing them on other videos within our database.

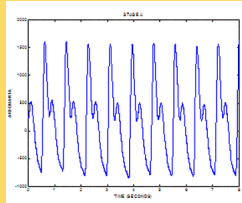


Figure 2 A ppg signal Deep Learning algorithms can analyze the videos in order to find the ppg, which is the amount of blood flowing under the skin at a certain point in time. From there, it is easy to find the heart rate.

### CONCLUSION

Although the experiment is incomplete, the initial results can give insight on how the study is going so far and if there is anything that should be changed to improve the study.


#### THINGS TO CONCLUDE

- So far, adjusting training set does not do well with addressing current disparities
- This may be due to underrepresentation of darker skin tone participants in data set

#### NEXT STEPS

- Work to ensure there are enough darker skin tone participants to successfully test the lab's hypothesis
- If this trend continues, look into other factors such as the construction of the algorithm or the background as possible sources of bias

### MATERIALS AND METHODS



Place participant in chair, adjust camera so that it is focusing on the face

Place pulse oximeter on participant's finger, wait until regular heart rate and ppg readings begin to come in

Use Python code to take one minute video of participant while registering the heart rate and ppg values of each frame, repeat 5 times

Extract heart rate and ppg values from the video and place in their own Excel sheet

Use the data from the videos and Excel sheets to train and test DeepPhys and PhysNet

#### The Fitzpatrick Scale

Type 1	Type 2	Type 3	Type 4	Type 5	Type 6
Lightest Fair	Light	Medium	Dark	Very dark	Black
Always burns, never tans	Burns easily, tans lightly	Burns moderately, tans well	Burns minimally, tans very well	Does not burn, tans deeply	Does not burn, tans very deeply

Figure 4 The Fitzpatrick skin Type Scale After participant videos are collected, this scale is used to categorize a participant's skin tone as light (Type 1 and 2), medium (Type 3 and 4) or dark (Type 5 and 6). The lab then selects an appropriate amount of each skin tone to be included in the training and testing sets.

### RESULTS AND DISCUSSION

Although the experiment is not yet complete, the lab has enough data to begin training and testing to gather initial findings.

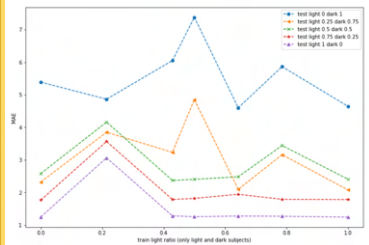


Figure 5 Results Graph This graph describes the mean absolute error of PhysNet based on the proportion of light to darker skin tone participants included in the training set

The graph to the left (Figure 5) shows the mean absolute error (MAE) of videos run through PhysNet trained with different training sets containing different proportions of light skin toned and dark skin toned participants.

#### IMPORTANT OBSERVATIONS

- Tests with more light skin participants fared better
- More representation of darker skin tones is needed before we can present conclusive results
- For tests with more dark skin participants, .2 light to .8 dark seems promising

### ACKNOWLEDGEMENTS

I would like to thank Dr. Achuta Kadambi for allowing me into his lab and thank grad students Pradyumna and Deniz for mentoring me and helping me understand the project.

I would also like to thank the SURP program for mentoring me and providing me with workshops to allow me to learn how to format and share the research done over the summer.

### REFERENCES

- 1 Taken from lab
- 2 [https://www.researchgate.net/figure/PPG-signals-from-commercial-heart-rate-monitor-1\\_fig10\\_264622988](https://www.researchgate.net/figure/PPG-signals-from-commercial-heart-rate-monitor-1_fig10_264622988)
- 3 Taken from lab
- 4 <https://www.skinrenewal.co.za/fitzpatrick-skin-type-iii>
- 5 Taken from lab



## Arlene Constantino



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# LiDAR Data Classification Using Con- volutional Neural Network Based on Pointnet Architecture

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*ABSTRACT*

Convolutional neural networks are the state-of-the-art algorithm for object classification. Due to the various types of objects that are processed and to facilitate training, typical convolutional neural networks (CNNs) require data preprocessing like zero padding or 3D to 2D space projections and do not work with point cloud data. Light Detection and Ranging (LiDAR) is one of the main technologies used in self-driving cars and terrain mapping. Since LiDAR uses time of flight from laser beams to create a 3D map of the area, the generated data is a point cloud. In order to solve these problems, here we present an implementation of CNNs using a modified PointNet architecture. PointNet architecture is directly capable of taking a point cloud and running it on the classification algorithm, which is much more efficient than transforming the data before being fed to the network. In this study, we optimize the said convolutional neural network based on PointNet architecture. We train the model using LiDAR data taken in Westwood and tune its parameters accordingly to achieve close to state-of-the-art performance. As of now, in preliminary testing, the model achieves an 89.82% training accuracy. The goal is to further achieve a model that can be able to map external environments to aid driver-safety and autonomous navigation.

## LiDAR DATA CLASSIFICATION USING CONVOLUTIONAL NEURAL NETWORK BASED ON POINTNET ARCHITECTURE

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### Introduction

Convolutional neural networks (CNNs) are state-of-the-art algorithms for object classification. However, typical CNNs do not directly process data in irregular formats, like point clouds, as an input.

A **point cloud** is a set of 3D points which represent arbitrary objects. It is the data generated by using **Light Detection and Ranging (LiDAR)** since it uses the time of flight to create a 3D map of the area. Working with point clouds requires dimensionality data transformations before being fed to the network because of its irregular size and shape.

This data preprocessing can make LiDAR data classification memory and time expensive. To accomplish the task efficiently, we implemented **PointNet based architecture**, which directly consumes point cloud data.

### Objective

To optimize a convolutional neural network based on PointNet architecture to achieve a similar state-of-the-art performance.

### Significance

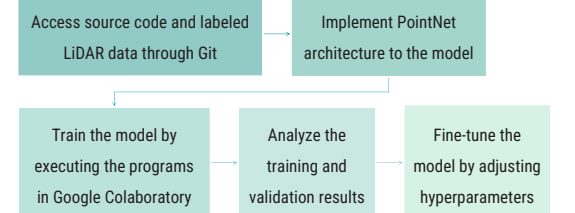
The network will be used to accurately classify objects seen in LiDAR data taken in Westwood. And eventually, be used to map our external environments to aid driver-safety and autonomous navigation.

### Materials

- Codes are written in Python
- Source code and the labeled LiDAR data are accessed through Git
- Programs are executed in Google Colaboratory



### Methods



### PointNet Architecture

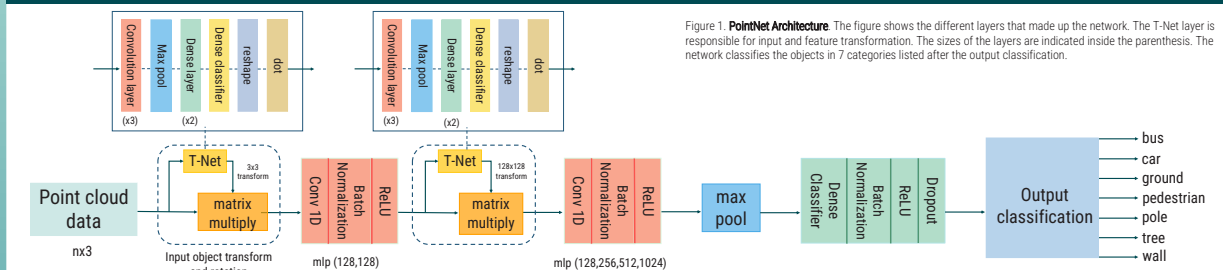
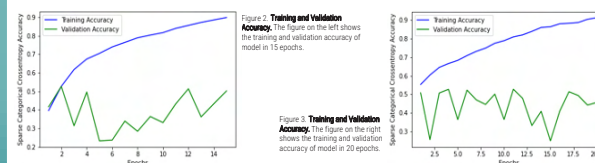


Figure 1. **PointNet Architecture**. The figure shows the different layers that made up the network. The T-Net layer is responsible for input and feature transformation. The sizes of the layers are indicated inside the parenthesis. The network classifies the objects in 7 categories listed after the output classification.

### Results and Discussion



We implemented a PointNet based architecture using CNN for classifying LiDAR data. We ran multiple models with different hyperparameters such as learning rate, number of epochs, and dropout rate. Initially, the network was trained in 11,047 clusters with 6 categories. As a result, the model achieved an 89.82% training accuracy and a 59.38% validation accuracy, seen in Figure 2. Afterward, car clusters were retrieved, and the data increased to 11,770 clusters with 7 categories. In Figure 3, the training accuracy went up to 91.25%.

As seen in the figures above, there is a distinct gap between the training accuracy and validation accuracy. Presented above are preliminary results as further work needs to be done to achieve state-of-the-art performance.

### Conclusion

In this project, we developed a model based on PointNet architecture that performs LiDAR data classification. The network classifies the objects seen in LiDAR data in 7 categories: bus, car, ground, pedestrian, pole, tree, and wall. In preliminary testing, the model achieves a training accuracy of 89.82% in 6 categories and 91.25% in 7 categories. In conclusion, further work is needed for the model to map our external environments to aid driver-safety and autonomous navigation. Labeling more clusters for some categories, especially cars and buses, would be beneficial for the model.

### References

- [1] C. Qi, H. Su, et al. *PointNet: Deep Learning on Point Sets for 3D Classification and Segmentation*, arXiv preprint arXiv:1612.00593v2 (2017).
- [2] F. Chollet. *Deep Learning with Python*. Manning Publications Co. (2018).

### Acknowledgement

I would like to thank Dr. Chee Wei Wong, Arturo Hernandez, and the Summer Undergraduate Research Program for this research opportunity. I would also like to thank the National Science Foundation (NSF) for funding the project. Additionally, I would like to acknowledge Jaime Flor Flores and Noah Himed for their help and guidance throughout the program.



# Micah Crook



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## Optimizing the Electrochemical Oxidation of Methane

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### ABSTRACT

The electrochemical oxidation of methane is a promising reaction that can provide an alternative to methane flaring for gas drilling sites. However, there is still little known about the ideal conditions for this reaction, making it unrealistic for industrial use. This study aims to further the understanding of the methane oxidation reaction (MOR) by analyzing the products under different potentials. A titanium cylinder was plated with a cobalt catalyst and then rotated in a potassium carbonate solution while methane flowed into the solution. Samples were taken from the cell every 20 minutes for 2 hours and analyzed using NMR. It was found that methanol and acetate were predominantly formed at low potentials. Methanol averaged over 1.6  $\mu\text{M}$  at potentials of 0.6 to 1.0 V and acetate averaged 25  $\mu\text{M}$  at potentials of 0.6 and 0.8 V. To add further support, methanol and formate only had a substantial faradaic efficiency at 0.7 V of 7.9% and 7.6% respectively. Formate, a compound not detected in previous MOR studies, was observed when acetate persisted at high concentrations above 40  $\mu\text{M}$ , suggesting that there is a reaction occurring that relates the two. With this knowledge, a baseline for comparison can be set for experiments with other catalysts. The discovery of formate will encourage further studies of the mechanism when acetate is at high concentrations. In future work, additional catalysts will be analyzed using this setup to determine what conditions are the best for producing useful products.

## Optimizing the Electrochemical Oxidation of Methane

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## Sophia Du



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# Thermal Limitations of Miniature Printed Circuit Board (PCB) Photon Sources

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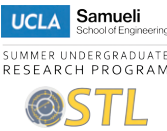
ABSTRACT

Modern-day x-ray light sources use relativistic electron beams to produce photons. Quadrupoles and undulators are magnetic devices that form an integral part of these light sources. Current quadrupole and undulator technology at the micro to millimeter scale use electromagnets and are fabricated on silicon wafers. The objective of this research project is to explore the usage of printed circuit boards (PCBs) in quadrupoles and undulators and to test their limitations. PCBs could potentially make the current fabrication process of these devices easier and cheaper. However, PCB-based devices cannot reach the same current densities as silicon-based ones due to heating; the thermal conductivity of FR4, the PCB material, is significantly lower than that of silicon. Four designs (1 quadrupole, 3 undulators) with 1 to 2 trace layers were created in DipTrace and manufactured. COMSOL simulations showed that the four designs could run at current densities from  $2.1 \times 10^8$  to  $2.7 \times 10^8$  A/m<sup>2</sup> before the FR4 reaches its glass transition temperature (130°C). Experimental data obtained with a thermal camera agreed reasonably well with the simulated data. The simulations and experiments both demonstrated that wider copper traces and more trace layers reduce temperature rise for the same total current but increase temperature rise for the same current density. Initial magnetic simulations of the quadrupole show that the quadrupole design can produce a magnetic gradient up to 34 T/m at the maximum experimental current density and 100  $\mu$ m gap size. Future works include using active cooling systems to increase thermal performance and conducting real-world magnetic tests with the PCB designs.

## Thermal Limitations of Miniature Printed Circuit Board (PCB) Photon Sources

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### Introduction

Modern x-ray light sources, like x-ray free electron lasers and synchrotrons, use relativistic electron beams to produce photons. Quadrupoles and undulators are magnetic devices that form an integral part of these light sources.

**Quadrupole** — a magnet that focuses the electron beam on one axis and defocuses it on the other. Multiple quadrupoles can be placed in succession with a 90° rotational offset for focusing in both dimensions.

**Undulator** — alternating dipole magnets that accelerate electrons transverse to their direction of travel in a periodic manner; this causes the electrons to generate photons. The wavelength of the photons depends on the spacing of the dipole magnets, or the undulator period, and the electron velocity.



Current quadrupole and undulator technology at the micrometer to millimeter scale use electromagnets produced on silicon wafers. Electric currents that produce magnetic fields flow through copper traces (orange). Magnetic yokes (dark gray), material with high magnetic permeability, increase the magnetic field strength.

### Objectives

1. Design printed circuit boards (PCBs) for quadrupoles and undulators used in miniature photon sources.
2. Test the current and thermal limitations of the PCBs.

#### Advantages

- ✓ Fabrication of copper traces on a PCB is easier and cheaper than fabrication with silicon substrates; this can reduce costs significantly, increasing the accessibility of compact light sources.
- ✓ Multiple quadrupoles and undulators can be placed on one PCB and aligned before manufacturing.

#### Disadvantages

- ✗ FR4, the material of the PCB, has a low thermal conductivity compared to silicon. Heat generated by the high currents flowing through the copper traces will dissipate slowly, which can lead to the PCB overheating.
- ✗ Due to lower currents, PCB-based devices produce weaker magnetic fields compared to silicon-based devices.

### Methods

1. Design PCBs for multiple quadrupoles and undulators
2. Find current limits of copper traces for each design using industry standards
3. Perform thermal simulations of designs
4. Test manufactured PCBs and measure temperature with thermal camera

### PCB Designs

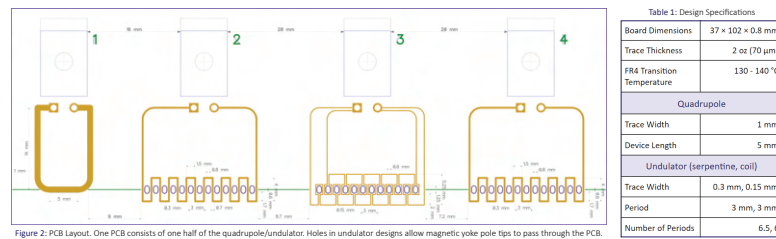
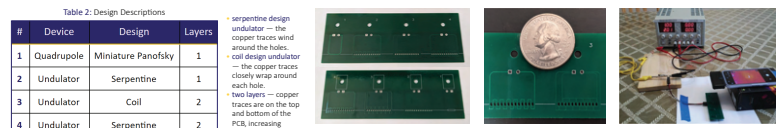
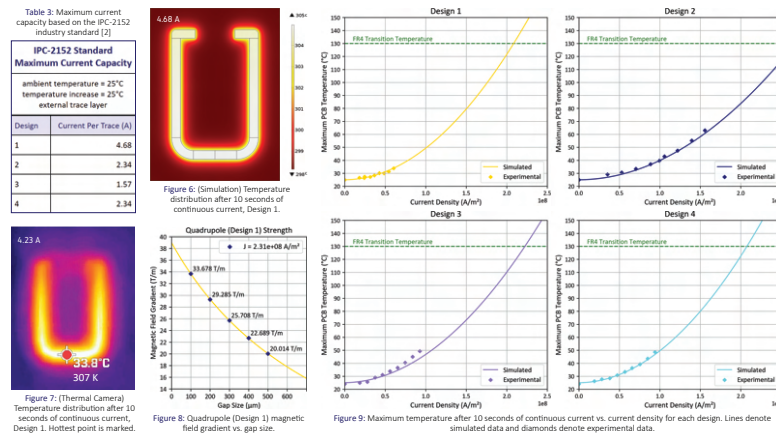


Figure 2: PCB Layout. One PCB consists of one half of the quadrupole/undulator. Holes in undulator designs allow magnetic yoke pole tips to pass through the PCB.



### Results



### Conclusion & Future Works

- Simulated data agreed reasonably well with experimental data.
- Wider copper traces and more trace layers reduce temperature rise for the same total current but increase temperature rise for the same current density.
- Perform magnetic simulations and real-world tests with the designs.
- Test the PCB's thermal performance with pulsed current and with active cooling systems.
- Design PCBs with more than 2 trace layers to utilize internal layers.

### References

- [1] Pound, B. A. (2021). Micro and Milliscale Magnetic Systems for Particle Beam Manipulation [Prospectus].
- [2] Sierra Circuits. (2021). PCB trace width, current capacity and temperature rise calculator. twcalculator.app.protoexpress.com.

### Acknowledgements

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Visual Processing for Autonomous Robot Swarms

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ABSTRACT

Visual processing is an integral piece of robotic autonomy, as cameras attached to the robot collect and process pictures, allowing robots to sense the world around them. Robots collect information from the processed image and use it to make decisions. The goal of this project is to use colored blob detection and AprilTag detection to control low-cost robotic swarms, or cohesive groups of robots. I used an open-MV camera, which is a small microprocessor with a camera attached, to accomplish this. To recognize colored blobs, I used thresholds to group pixels by color, which is a method that reduces issues with lighting changes. I programmed the camera to effectively recognize multiple different colored blobs at the same time and determine the distance between the camera and the object if the object's dimensions are known. The error associated with this calculation is about 20 millimeters from a range of less than a meter. AprilTags are recognized by the unique pattern of the tag, and I determined that the range of detection is dependent on the tag size. I used the AprilTag recognition capability to determine the relative position of the robot. The calculation of the distance between the camera and the tag has an average error of about 40 millimeters at a range of 3 meters, which is a relatively insignificant amount. We then applied these capabilities to robot swarm autonomy, using them to recognize a target object, calculate distances between robots, and perform other swarm behavior. Works include using active cooling systems to increase thermal performance and conducting real-world magnetic tests with the PCB designs.

Visual Processing for Autonomous Robot Swarms

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Laboratory for Embedded Machines and Ubiquitous Robots  
UCLA Electrical and Computer Engineering Department



Objective: To use colored blob detection and AprilTag detection to control low-cost robot swarms

Introduction

- Visual processing provides robots with information that is used to make decisions
- In robot swarms, there is a need to find each robot's relative position
- I used AprilTags to determine the relative position
- I used colored blobs to identify other robots and target objects
- We then applied these capabilities to autonomous robot swarms

Key Terms

- Computer Vision:** When computers interpret information from images and videos
- Feedback Control:** When sensors on a robot (such as a camera) collect information and then robots take action based on that information
- Robot Swarm:** A group of robots that work together towards a common goal
- Color Thresholding:** A method that groups together similarly colored pixels, if they are within a certain constraint or threshold that represents a color

Detecting Colored Blobs and AprilTags

Materials



Figure 1: OpenMV Camera (left) connected to an ESP32 Featherboard (right)

Experimental Setup



Figure 2: Measuring reliability, range, and error of AprilTag detection

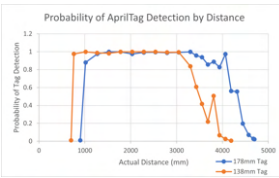


Figure 3: Graph displaying the range and reliability of AprilTag detection for differently sized tags

Using Vision to Control Robots: Methods

- Colored Blob Detection (Figure 4)**
- Recognizes multiple colors
- Achieved with color thresholding
- Finds blob position
- Calculates z-distance

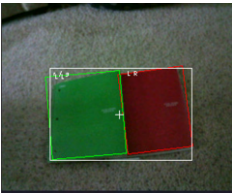


Figure 4: Colored blob recognition

AprilTag Detection (Figure 5)

- Recognizes unique tags
- Finds relative position and orientation
- Calculates distance
- Reliable detection (see Figure 3)



Figure 5: AprilTag recognition

Applying Visual Processing to Robots

Paper Boats (Figure 8)

- Detecting a colored cup

Paper Cars (Figure 6)

- Finding the location of a colored car
- Detecting AprilTags from above the car to determine the relative position

Blimps (Figure 9)

- Tracking a colored box

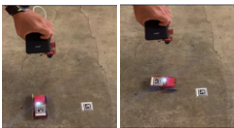


Figure 6: Aerial camera using AprilTags to determine a car's orientation and relative position

Limitations

- The AprilTag distance calculation has an associated error

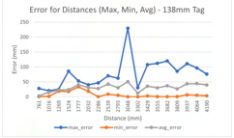


Figure 7: Graph displaying the error for the calculated distance

Camera = red arrow

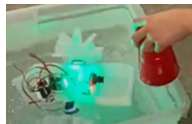


Figure 8: Paper boat tracking a red cup with color detection



Figure 9: Blimp turning to follow a green box using colored blob detection

Conclusion

Visual processing provides many capabilities for autonomous robot swarms.

Colored Blob Recognition and AprilTag Recognition

- Recognizes landmarks, other robots, and target objects
- Determines distance between two robots
- Determines orientation

When integrated into a robot swarm, camera sensing and visual processing provides the robots with all the necessary information in order for the robots to work cohesively as a group.

Acknowledgements

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## Developing Predictive Abilities for Cancer Cell Growth

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## ABSTRACT

Cancer, being a leading cause of death, is a highly researched topic, yet researchers have struggled to understand the relationship between metabolism and cancer cell growth. Glycolysis and gluconeogenesis are the two most important pathways in cancer metabolism. In a low glucose environment, only gluconeogenesis can be performed. A challenge in analyzing cancer's metabolic pathways is measuring what happens inside cells. Cells are dynamic beings which reside in dynamic environments. Traditional measurement techniques are limiting because they rely on a snapshot of the cell and environment, which is a crude representation of the dynamic processes. In order to understand the internal workings, this project sought to measure metabolic fluxes and dynamic metabolic pathway usage. The approach involved conducting flux balance analysis within Cobra Toolbox. First, experimental measurements of cellular nutrient requirements and gene expression data from The Cancer Genome Atlas were mapped in Rstudio. By incorporating those experimental measurements, the human Recon3D model was tailored to model non-small cell lung cancer. Conducting flux balance analysis on the model using appropriate parameters will yield an approximate growth rate of lung cancer cells. Data collection has not yet been completed. This research is important because if it is possible to predict whether or not cancer cells can complete gluconeogenesis, specific therapies for distinct cancer cells can be developed. The predictive abilities that will be gained from completing this project will provide much needed insight into the dynamic systems of cancer cell growth.

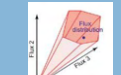
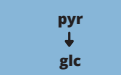
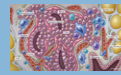
DEVELOPING PREDICTIVE ABILITIES FOR  
CANCER CELL GROWTH  
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## INTRODUCTION

Cancer is a leading cause of death and a very important disease to understand. Yet, the dynamic nature of cells and their environment make them difficult to study. This project aims to better understand the dynamic nature of cells by measuring metabolite fluxes and predicting cancer cell growth rates.

## KEY TERMS

- Tumor Microenvironment-Where Cells survive and proliferate. Different conditions can stifle or help growth
- Gluconeogenesis- Important pathway for Cancer cell growth in low glucose environment. Opposite of glycolysis with some exceptions
- Flux Balance Analysis (FBA)- Mathematical approach for predicting metabolic phenotypes, growth rates, and pathway utilization
- Recon3D- Genome scale model for the entire human body including protein and metabolite structure and atom-atom mapping



## APPLICATION

If it is possible to predict whether or not cancer cells can complete gluconeogenesis, specific therapies for distinct cancer cells can be developed.

## RESULTS AND DISCUSSION

## Modeling growth with FBA is possible for microbes

```
>> model=readC2Model('IAF1260.xml')
model=changeReactionBounds(model,'EX_glc_e',-18.5,'1');
model=changeReactionBounds(model,'EX_o2_e',-1000,'1');
model=changeObjective(model,'BIOMASS_Ec_iaf1260_core_glp81M');
FBAolution=optimizeCbModel(model,'max');
FBAolution.f
```

ans =

1.7478

Figure 1: MATLAB code which establishes the lower bounds for glucose and oxygen exchange and maximizes the established objective reaction.

The E. coli model is one of the simplest model systems. Model iAF1260 can be found in the BIGG database and represents a strain of E. coli. After loading the model into MATLAB, Cobra Toolbox was used to change constraints of specific reactions within the model and maximize the flux rate of the Biomass reaction. The growth rate was found to be 1.7478 hr<sup>-1</sup>, which corresponds to a doubling time of 0.3966 hours, a reasonable doubling time for this strain. Therefore, modeling growth with FBA was successful for E. coli.

## It is possible to incorporate experimental data

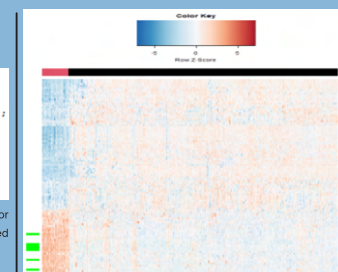


Figure 2: Heat Map generated in RStudio showing gene expression patterns of Lung Squamous Cell Carcinoma based on patient data.

## Gene-Protein-Reaction Associations

Protein Name	Gene ID	Fold Change Value	rxn1	rxn2	rxn3	rxn4	rxn5	rxn6
1 'GPD1'	'2819_AT1'	0.0169	'G0202'	'G3PD1a'	'G3PD2'	[]	[]	[]
2 'HSD17B9'	'9630_AT1'	0.0493	'HMR_2041'	'HMR_6633'	[]	[]	[]	[]
3 'NPR1'	'4881_AT1'	0.0487	'GUACYC'	[]	[]	[]	[]	[]
4 'GAA'	'762_AT1'	0.0078	'HCO3e'	'HCO3e'	'GAMAND'	[]	[]	[]
5 'GLC6A'	'6532_AT1'	0.0064	'SRTH6_2'	[]	[]	[]	[]	[]
6 'GTL1C1'	'92086_AT1'	0.0048	'GTHRDH_syn'	'GSTA2'	'G048'	'G041'	'G049_1'	[]
7 'ABCA8'	'10351_AT1'	0.0274	'TCHOLABCh'	'ESTRAABCh'	'ESTRSABCh'	'LEUKABCh'	[]	[]
8 'AK1'	'203_AT1'	0.1628	'DADK'	'HMR_0765'	'HMR_6545'	'FBP'	'FBP26'	'ADK1'
9 'PLA2G1B'	'5319_AT1'	0.0108	'PLA2_2e'	[]	[]	[]	[]	[]

Table 1: This table represents the Gene-Protein-Reaction Associations between the most differently expressed genes in Lung Squamous Cell Carcinoma and reactions in the Human Recon3D model. It also includes associated Fold Change Values which were found in Rstudio.

## We are continuing to tailor this approach to the Recon3D model

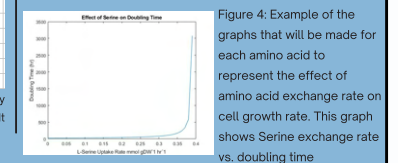
```
% Setting initial constraints
%sets the lower bound of all exchange reactions that are not initially 0 to be -0.0074
ind=find(model.lb==0) & ~cellfun(@isempty,strcmp(model.rxns,'EX_')));
model.lb(ind1)=-0.00074;

%sets the lower bound of all sink and demand reactions to be 0
ind=find(~cellfun(@isempty,strcmp(model.rxns,'H_')));
model.lb(ind2)=0;
ind=find(~cellfun(@isempty,strcmp(model.rxns,'H_')));
model.lb(ind3)=0;

%Based on the given constraints, maximize the flux rate of the biomass reaction
model=changeObjective(model,'BIOMASS_Ec_iaf1260_core_glp81M');
FBAolution=optimizeCbModel(model,'max');
FBAolution.f;
doubling_time=1/ln(2)/FBAolution.f;
```

Figure 3: MATLAB code which sets lower bounds of Sink and Demand reactions equal to 0 and the lower bounds of all exchange reactions that are not 0 to be -0.0074. It then finds the flux rate of the objective reaction.

The Recon3D model has been set up to represent healthy tissue. The lower bounds have been so that the doubling time of the objective reaction is about 24 hours. The next step will be to integrate the experimental data and to determine which amino acids have the most effect of the growth rate, especially in low glucose environments.



## CONCLUSION

Because the experiment has not been completed, it is unclear whether experimental data paired with FBA is enough to be able to predict cancer cell growth rates. This experiment showed that it is possible to predict growth rates for microbes and it is possible to incorporate experimental data, but more research is necessary to know if this approach is viable with more complex models such as the Human Recon3D model.

## FUTURE GOALS

- Integrate this approach with lab experiments in order to verify the model, and use it to guide experiments. These experiments include using isotope tracing and LCMS to measure
  - nutrient uptake rates
  - cell growth rates
  - intercellular flux
- Refine this computational approach enough to have predictive power for individual patients solely based on a tumor biopsy and ma-sequencing

## ACKNOWLEDGEMENTS

- Thank you to the Samueli Research Scholars for choosing me to participate in Research
- Thank you to Will Herrera and SURP for academic, career and research guidance
- Thank you to Kris Park for the technical support
- Thank you to Doctor Jun Park for the guidance, support, and encouragement

## Sources:

Brunk, E., Sahoo, S., Zielinski, D. C., Altunkaya, A., Dräger, A., Mih, N., Gatto, F., Nilsson, A., Precist Gonzalez, G. A., Aurich, M. K., Pilić, A., Sastry, A., Danielsdottr, A. D., Heinken, A., Noronha, A., Rose, P. W., Burley, S. K., Fleming, R., Nielsen, J., Thiele, I., L., Palsson, B. O. (2018). Recon3D enables a three-dimensional view of gene variation in human metabolism. *Nature biotechnology*, 36(3), 272–281. <https://doi.org/10.1038/nbt.4072>

Kahn, Daniel. "Introduction to Flux Balance Analysis". [http://ibis.inria.fr/people/dejong/courses/coursNSA2016/Introduction\\_to\\_FBA](http://ibis.inria.fr/people/dejong/courses/coursNSA2016/Introduction_to_FBA)

Murfin, Kelley. "3 Things to Know about the Tumor Microenvironment." MD Anderson Cancer Center, MD Anderson Cancer Center, 6 Apr. 2021. [www.mdanderson.org/cancerwise/what-is-the-tumor-microenvironment-3-things-to-know-h00-159460056.html](http://www.mdanderson.org/cancerwise/what-is-the-tumor-microenvironment-3-things-to-know-h00-159460056.html)

## Sahiti Gavva



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## Thermodynamic Simulations Using Industrial Waste Streams for CO<sub>2</sub> Mineralization

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### ABSTRACT

CO<sub>2</sub> mineralization is a viable alternative CO<sub>2</sub> emissions mitigation strategy in which CO<sub>2</sub> is captured by the precipitation of thermodynamically favorable carbonate phases. For CO<sub>2</sub> mineralization, industrial waste streams with large cation concentrations (e.g., Ca<sup>2+</sup> [0.01 - 1.0 mol/L]) react with dissolved CO<sub>2</sub> under alkaline conditions (pH > 9). An ion-exchange process has previously been proposed to provide the alkalinity required for CO<sub>2</sub> mineralization while utilizing industrial waste streams. In this work, thermodynamic simulations were performed using Gibbs Energy Minimization Selektor (GEMS) program to predict yields and purities of calcite (CaCO<sub>3</sub>) formed. The alkaline solution produced via ion-exchange and industrial waste streams were simulated to predict the final compositions of the solution to see how the final composition would affect the overall process. Industrial waste stream compositions were identified using the United States Geological Survey database. Simulations were performed at varying CO<sub>2</sub> concentrations (100%, 50% 20%, 12%, 5%) at fixed waste stream compositions to quantify the effect CO<sub>2</sub> concentrations have on calcite yields, purities, and final solution compositions. The data collected shows acceptable yields (0.14 - 1.3 g/L calcite) and purities (>90%) for calcite using industrial waste streams at each respective CO<sub>2</sub> concentration. Final divalent cation concentrations were predicted following treatment via nanofiltration and reverse osmosis, which resulted in total divalent cation concentrations less than <0.001 mol/L. The low divalent cation concentrations following mineralization and the large yields and purities of calcite simulated confirm that the overall mineralization process is viable using industrial waste streams.

## THERMODYNAMIC SIMULATIONS USING INDUSTRIAL WASTE STREAMS FOR CO<sub>2</sub> MINERALIZATION

Sahiti Gavva, Steven Bustillos, Professor Dante Simonetti

Department of Chemical Engineering at University of California, Los Angeles

### Introduction

Today's emissions, specifically CO<sub>2</sub>, have terrible consequences on the globe. Emissions need to be prevented or captured to prevent further damage. While there are other ways to prevent or capture emissions, mineralization proves promising because of the stability of minerals and their potential profitability.

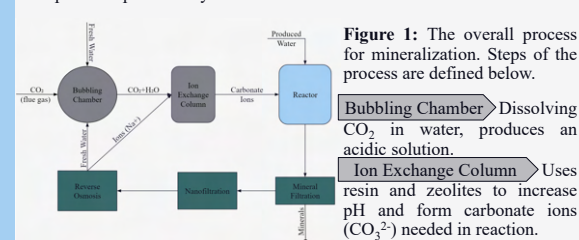


Figure 1: The overall process for mineralization. Steps of the process are defined below.

**Bubbling Chamber** Dissolving CO<sub>2</sub> in water, produces an acidic solution.

**Ion Exchange Column** Uses resin and zeolites to increase pH and form carbonate ions (CO<sub>3</sub><sup>2-</sup>) needed in reaction.

**Reactor** Minerals are formed with the carbonate ions and Produced Water (PW). Produced Water stream refers to industrial waste streams that are rich in cations needed for the mineralization reaction.

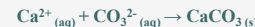
**Mineral Filter** A vacuum filter is used to separate any minerals formed.

**Nanofiltration** Removes any unreacted divalent ions with 95% efficiency.

**Reverse Osmosis** Separates water from any remaining ions.

- The water is reused in the bubbling chamber, and
- the other stream, which is rich in Na<sup>+</sup>, is reused in the Ion Exchange Columns to prep the resins and zeolites for reaction to increase pH and form carbonate ions.

### Mineralization Reaction



- Thermodynamically favorable; reactions happens spontaneously
- Process has the potential to be integrated in a power plant without requiring extra money or energy.

Calcite, or more commonly limestone, is used in building materials, such as cement and can be further expanded to other processes depending on purity.

### Objective

It is important to understand if the mineralization process is viable for power plants. The objective of this research is to simulate the mineralization reaction to predict if highly pure calcite could be formed at a large yield and if filtration of leftover ions would allow for regeneration.

### Materials & Methods

- Gibbs Energy Minimization Selektor (GEMS) software
  - Simulates reaction between the Carbonate and Produced Water streams
  - Predicts formation and yields based on initial inputs, allowing for the minerals formed and unreacted ions to be analyzed.

### Method

Run simulation for a specific PW composition and CO<sub>2</sub> concentration.

Graph yields of calcite and purities of calcite against the amount of PW.

Calculate the concentration of leftover ions after nanofiltration and reverse osmosis.

Repeat for other CO<sub>2</sub> concentrations.

### References

Bustillos, Steven, Alhurki, Abdulaziz, Prentice, Dale, La Plante, Erika Callagon, et al. (2020) Implementation of Ion Exchange Processes for Carbon Dioxide Mineralization Using Industrial Waste Streams. *Frontiers in Energy Research*. 8. <https://www.frontiersin.org/article/10.3389/fenrg.2020.610392>

### Results

Using waste stream data from the United States Geological Survey (USGS), the values of ions was averaged to produced a Produced Water composition (Figure 2) which was run through the GEMS simulation to predict the calcite produced and the ions leftover.

	Concentration (mmol/L)
CaCl <sub>2</sub>	20.7
NaCl	339.2
MgCl <sub>2</sub>	7.5
FeCl <sub>2</sub>	0.28
KCl	3.15
CaSO <sub>4</sub>	1.68

Figure 2: Produced Water Composition in mmol/L that was input into GEMS.

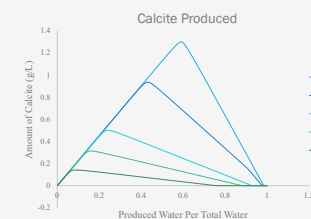


Figure 3: The amount of calcite formed with varying levels of CO<sub>2</sub> concentration. The focus is the peak of each curve (the max amount of calcite produced).

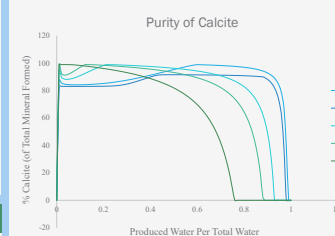


Figure 4: The percentage of calcite formed out of total minerals formed. The focus is, again, the point where amount of calcite produced peaks (from Figure 3).

20% CO <sub>2</sub>		
	Initial (mmol/L)	Filtered (mmol/L)
Na <sup>+</sup>	91.630	164.934
Ca <sup>2+</sup>	0.411	0.041
Mg <sup>2+</sup>	1.802	0.180

12% CO <sub>2</sub>		
	Initial (mmol/L)	Filtered (mmol/L)
Na <sup>+</sup>	60.748	109.346
Ca <sup>2+</sup>	0.474	0.047
Mg <sup>2+</sup>	1.202	0.120

Figure 5: Concentration of leftover ions predicted by GEMS and calculated concentration of ions after nanofiltration (95%) and reverse osmosis in mmol/L.

### Discussion

Yield	Purity	Filtered Ions
Good	Highly pure	Ideal for the regeneration stream of Na <sup>+</sup>
Ranges from 0.14 - 1.3 g/L calcite for CO <sub>2</sub> concentrations	greater than 90% when calcite yield is at its peak for all CO <sub>2</sub> concentrations.	Ion concentration of Ca <sup>2+</sup> and Mg <sup>2+</sup> are less than 1 mmol/L after filtration. The leftover ions in Figure 5 are reflective of the leftover ions for the other CO <sub>2</sub> concentrations not show in the table.

The mineralization process appears to reliably produce calcite with acceptable yield and purity. With little leftover ions after filtration, the regeneration streams of Na<sup>+</sup> and fresh water are also practical for the process.

### Conclusion

By producing calcite, a significant amount of CO<sub>2</sub> can be captured. This process enables power plants to decrease their emissions generated, instead producing minerals that could be used elsewhere.

### Future Directions

1. Further Validate Experimentally: This data will confirm the viability of mineralization on power plants.

2. Secondary Mineralization: Using the ion concentrate that is produced as a waste product of nanofiltration, a secondary reaction may produce a significant amount of mineral, allowing the process to capture more CO<sub>2</sub>.

### Acknowledgements

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Professor Dante Simonetti (PI)



## Nicholas Hamakami



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## Evaluation of Network Topologies in Challenging Environments

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Mine Dogan

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Electrical and Computer Engineering

### ABSTRACT

Finding the optimal network topology for wireless sensor networks is an important problem that has a wide variety of applications in the field of environmental and earth sensing. This is because issues with connectivity and routing can arise if the environment a topology is in contains obstacles that impede the communication between nodes – examples of such environments being towns or cities. As such, our research focuses on synthesizing wireless sensor networks that satisfy certain sensing and communications requirements in these challenging environments. Towards this end, we created occupancy grids based on satellite images that display the locations of obstacles and free space. For different placements of sensor nodes on the occupancy grids, we assessed the performance of the resulting networks based on our sensing requirements and the maximum flow that can be sent from a source to a destination. The data that we collected will be the basis for a new algorithm that can determine effective sensor network topologies for high-obstacle environments.




FAST TRACK  
TO SUCCESS  
UCLA Electrical and  
Computer Engineering

### Evaluation of Network Topologies in Challenging Environments

Nicholas Hamakami, Mine Dogan, Christina Fragouli

Department of Electrical and Computer Engineering, University of California – Los Angeles



SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

#### Introduction


**Context:**  
Finding the optimal network topology for wireless sensor networks is an important problem because issues with connectivity and routing can arise if the environment a topology is in contains obstacles that impede communication between nodes.

**Main goals:**

- Optimize a sensor network topology in a difficult environment – e.g., city or neighborhood – using occupancy grids and minimum cuts
- Criterion: Maximize the network flow rate for a given network

**Motivation:**

- Sensor networks have a wide variety of applications in environmental and earth sensing
- Need data as a foundation for a new algorithm that can determine effective topologies in high-obstacle environments




#### Materials

**Google Maps API**

- Occupancy grid creation

**Python**

- Occupancy grid creation
- Node placement with sensing constraints
- Calculations: link capacities, minimum cuts



#### Methods

Create occupancy maps with the Google Maps API and other image editing software. Then transform maps into proper grids with Python.

Input occupancy grids into algorithm to determine node placements based on constraints of distance and line of sight.

Find channel coefficients for each pair of nodes through the channel coefficient equation.

Link capacity equation:  
 $L = \log(1 + P|h|^2)$

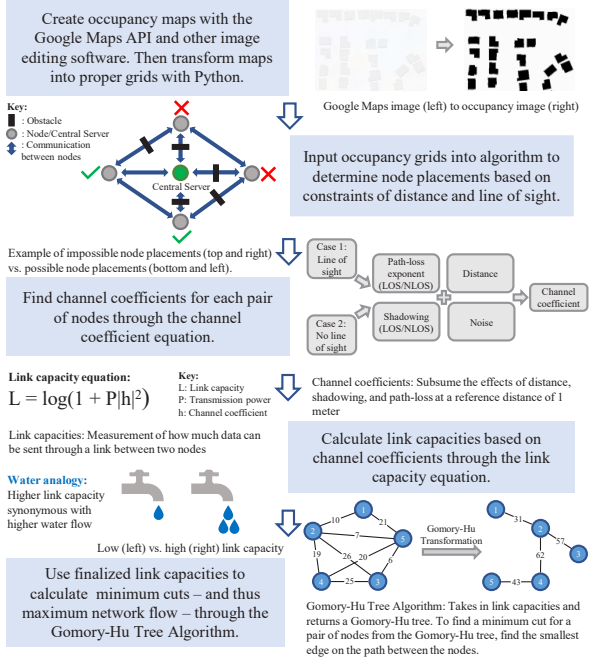
Link capacities: Measurement of how much data can be sent through a link between two nodes

Water analogy:  
Higher link capacity synonymous with higher water flow

Use finalized link capacities to calculate minimum cuts – and thus maximum network flow – through the Gomory-Hu Tree Algorithm.

Calculate link capacities based on channel coefficients through the link capacity equation.

Gomory-Hu Tree Algorithm: Takes in link capacities and returns a Gomory-Hu tree. To find a minimum cut for a pair of nodes from the Gomory-Hu tree, find the smallest edge on the path between the nodes.



#### Node Placement Algorithm

**Choosing a selection of nodes that meet sensing constraints:**

Pick random coordinate → Check if coordinate meets constraints → Mark pixel coordinate on 2D NumPy array as "Node" → Add node to grid if constraints are met → Alter RGB of image to display node placements: Server: green / Node: black

Sensing constraints:

- Node must be within radius of server or already connected node
- Node must have line of sight of server or already connected node

#### Results

**Example satellite image to network flow process:**  
Location: UCLA – Manning, Malcom, La Conte Ave intersection

Input: Google Maps satellite image

**Figure 1:** Occupancy grid represented as a 2D NumPy array. Each coordinate is marked as either "Occupied," "Not Occupied," or "Node"

**Figure 2:** Final distribution of 50 nodes and a single central server

**Key observations:**

- Vast majority of nodes were placed either near the central server or in an open area where there is access to other nodes
- As expected, few nodes were placed near the edge of the grid

**Calculating the maximum network flow from minimum cuts:**

- Minimum cuts – act as a restrictor to the maximum flow. In other words, the flow of a network can only be as large as its minimum cut
- Flow rate given in unambiguous units of flow

#### Conclusion

**Next steps – data collection:**  
Our next objective is to use this algorithm to create node distributions for a variety of maps, with the main goal being to compare the network flow of the different maps.

**Closing thoughts:**  
Having created a method to generate node distributions and quantifiably measure their effectiveness, we are one step closer to our end goal of developing an algorithm that can determine effective network topologies for high-obstacle environments.

#### References

Gomory, Ralph E., and Tien Chung Hu. "Multi-terminal network flows." *Journal of the Society for Industrial and Applied Mathematics* 9.4 (1961): 551-570.

#### Acknowledgements

I would like to thank Professor Christina Fragouli, the Summer Undergraduate Research Program, the Fast Track to Success Program, and the National Science Foundation for the opportunity to conduct this research. I would also like to thank William Herrera, Mine Dogan, and Jonathon Bunton for their continued support throughout the program.

## Vanessa Huaco



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## Analysis of Scattering Data Using Bayesian Optimization

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Samanvaya Srivastava

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Divya Iyer

*DEPARTMENT*  
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### ABSTRACT

Polyelectrolyte complexation between oppositely charged macromolecules is primarily driven by non-covalent (electrostatic) interactions. These self-assembled materials find applications as bio-adhesives, encapsulants, delivery and purification agents. Analytical techniques such as small angle x-ray scattering (SAXS) and dynamic light scattering (DLS) offer insights about the size, structure and behavior of these materials, all of which are influenced by the polymer backbone, intermolecular interactions and solution conditions. In this project, we focus specifically on obtaining size and structure estimates of these materials via light scattering measurements, to explain structure-property relationships. We propose a Bayesian optimization model that will best describe and fit the size and structure estimates found. We are working to fit our equation

$$P(q) = (9 * scale * V * \Delta\rho^2) * \left[ \frac{\sin(qr) - qr\cos(qr)}{(qr)^3} \right]^2$$

for a spherical model to our data. We are looking at the relationship between their form factor ( $P(q)$ ) and length scale ( $q$ ), where the form factor is the dependent variable, and the length scale is the independent variable. Our model will be constructed using the Statistics and Machine Learning toolbox in MATLAB, as well as the Parallel Computing toolbox. The effectiveness of toolboxes offered by MATLAB, to perform Bayesian Optimization, was tested with preexisting generic examples. The terms involved in the optimization process have been learnt and understood.

## ANALYSIS OF SCATTERING DATA USING BAYESIAN OPTIMIZATION

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Chemical and Biomolecular Engineering Department –  
University of California, Los Angeles

**Samueli  
Research  
Scholars**  
UCLA Samueli  
School of Engineering

**UCLA** Samueli  
School of Engineering  
SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

### INTRODUCTION

Polyelectrolyte complex coacervates are unique polymer-rich materials that can serve many purposes but are yet poorly understood.<sup>1</sup>

Analytical techniques such as small angle x-ray scattering (SAXS) and dynamic light scattering (DLS) offer insights about the size, structure and behavior of these materials, all of which are influenced by the polymer backbone, intermolecular interactions and solution conditions.

Prior research utilizes Bayesian methods to analyze small angle scattering data of these materials. Understanding the properties and behaviors of these materials will help us harness self-assembly as a tool for material design.

### OBJECTIVE

We aim to find the model that best fits and explains the size and structure estimates data obtained experimentally so that we may harness self-assembly as a tool for material design.

### KEY TERMS

#### Small Angle X-Ray Scattering

A technique for studying structural features of colloidal size.<sup>2</sup>



#### Dynamic Light Scattering

A technique in physics that can be used to determine the size distribution profile of small particles in suspension or polymers in solution

#### Bayesian Regression Analysis

A statistical process for estimating the relationships between a dependent variable and one or more independent variables in which the hypothesis is updated as more data becomes available

### MATERIALS



Statistics and Machine  
Learning Toolbox

Parallel Computing  
Toolbox

### METHOD

Obtain scattering  
curves from SAXS  
and DLS

Partition Data and  
Remove Outliers

Input data into  
MATLAB and  
preprocess the  
data set

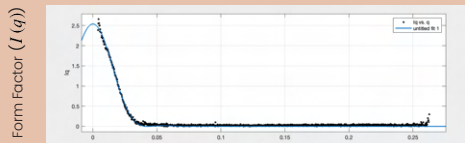
Use curve fitting tools  
to find regression  
model that fits or  
data

### RESULTS

Sphere model :  $P(q) = I(q) / V = (9 * scale * V * \Delta\rho^2) * \left[ \frac{\sin(qr) - qr\cos(qr)}{(qr)^3} \right]^2$

Equation inputted into MATLAB:  $I(q) = a * r^3 \left[ \frac{\sin(qr) - qr\cos(qr)}{(qr)^3} \right]^2$

$a = 1.978e-05$   
 $r \text{ (radius)} = 104.9$   
 $r\text{-square} = 0.9927$



### DISCUSSION

We utilized the curve fitting application in MATLAB to try and fit our equation for a sphere model to our data set. This resulted in the blue line displayed in the graph above. This model also gave us the value of the "a" coefficient and the value of the radius.

This fit yielded an r-squared value of 0.9927 which is a relatively good value, indicating that this is an okay fit for our data. However to obtain a customized equation that would better explain different datasets, especially in the low q region, which is the area of interest we must further refine our model using Bayesian Optimization.

### CONCLUSION

- Regression Analysis and Bayesian Optimization were learnt and understood
- Effectiveness of MATLAB toolboxes were tested using generic examples
- Curve fitting tools were utilized to generate a model for our data

Further Steps:

- Extend this process to spherical systems
- Optimize our equations by building our own Bayesian algorithm
- Find the model that best fits and explains the size and structure estimates

### References

- [1] "Srivastava Lab." Research, [www.srivastava-lab.net/research](http://www.srivastava-lab.net/research).
- [2] Glatter O; Kratky O, eds. (1982). Small Angle X-ray Scattering. Academic Press. ISBN 0-12-286280-5. Archived from the original on April 21, 2008
- [3] Kline, Steve, and Alan Munter. "Sphere Model." NIST Center for Neutron Research, [ncnr.nist.gov/resources/sansmodels/Sphere.html](http://ncnr.nist.gov/resources/sansmodels/Sphere.html).

### Acknowledgments

I would like to thank the Samueli Research Scholars for funding our research through the Summer Undergraduate research Program. I would also like to thank Professor Srivastava, Divya Iyer and Holly Senebandith for their resources, guidance and support. Finally, I would like to thank Will Herrera and the SURP staff for putting together this program.



## Tricia Jain



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Freshman, UCLA

# Development of a Relational Database for Seismic Response Data from Instrumented Buildings Subjected to Historical Earthquakes

*FACULTY ADVISOR*

Henry Burton

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Eusef Abdelmalek-Lee

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## ABSTRACT

The instrumentation of buildings with measuring devices, such as accelerometers, enables rapid assessments of building damage and functionality following an earthquake. However, in a typical urban context, only certain buildings are instrumented due to the associated costs. Fortunately, statistical and machine learning methods can utilize the response data collected from a limited number of sensors to predict seismic demands in uninstrumented structures. Currently, there exists a large inventory of seismic response data, but no standardized system of organization, hindering data analysis. As a result, this study seeks to develop a relational database to streamline the storage and retrieval of seismic response data, along with associated building and earthquake parameters. An efficient database schema, which eliminates data redundancy and simplifies links between tables, was designed. Appropriate data types for attributes, particularly vectors of time-series data, were researched and implemented. Code to accurately extract, organize, and insert over 2.5 GB of remote sensing data into the database was written. Finally, Python scripts were designed to enable data querying and analysis of extracted results. The relational database and accompanying python scripts that were developed create the framework for performing advanced data analysis. In the context of this dataset, this can improve post-earthquake building damage assessments, mitigating the socio-economic toll of earthquakes on communities.

# Development of a Relational Database for Seismic Response Data from Instrumented Buildings Subjected to Historical Earthquakes

Tricia Jain, Eusef Abdelmalek-Lee, Henry Burton Ph.D., S.E.

Department of Civil and Environmental Engineering— University of California, Los Angeles

## Introduction

- The instrumentation of buildings with measuring devices enables rapid assessments of building damage and functionality following an earthquake.
- In a typical urban context, only certain buildings are instrumented.
- Statistical and machine learning methods can utilize the response data collected from a limited number of sensors to predict seismic demands to uninstrumented structures.

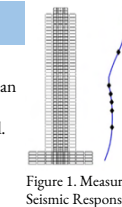


Figure 1. Measured Seismic Response

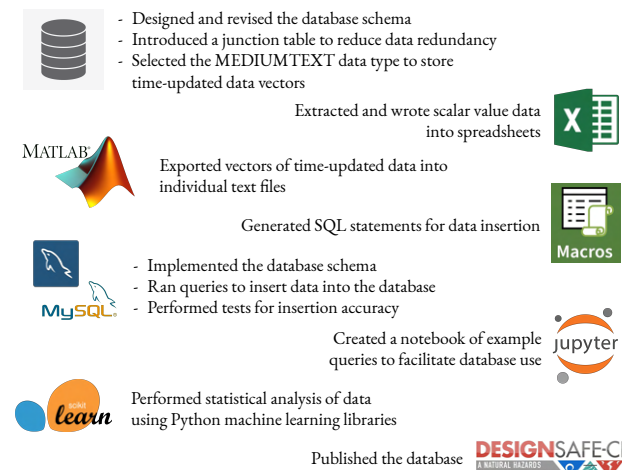
## Objective

- Develop a relational database to streamline the storage and retrieval of seismic response data along with associated building and earthquake parameters.
- Design Python scripts to execute queries and analyse the extracted data.

## Relational Database

- Utilizes tables to store data, which are related through shared fields (foreign keys).
- Reduces data redundancy and provides better scalability.
- Data extraction is performed by executing queries, which are requests for data.

## Materials and Methods



## Conclusion

- A relational database facilitates access to and analysis of large inventories of remote sensing data, providing the foundation for advanced data analysis.
- The DesignSafe cyberinfrastructure allows the greater natural hazards community to utilize the database in their research.
- The database can be continually updated with data from new earthquakes to better calibrate models.

## Acknowledgements

I would like to thank Professor Burton and Eusef Abdelmalek-Lee for their guidance throughout this project, the Samueli Research Scholar Award for funding this research, and all SURP staff for their support.

## Database Schema

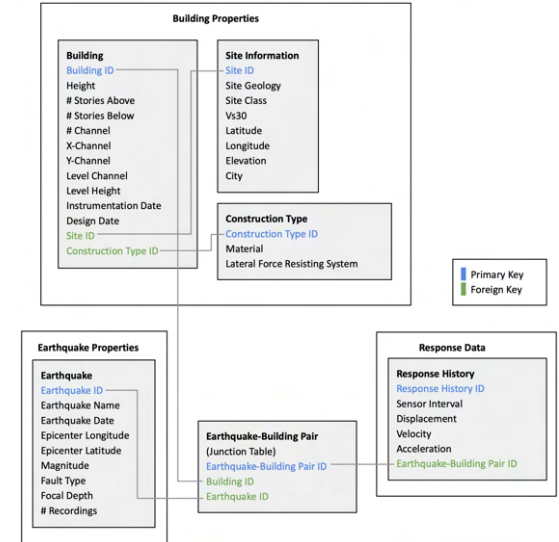


Figure 3. Finalized database schema

## Results

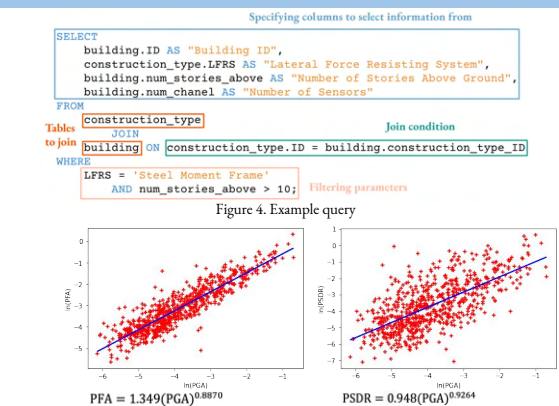


Figure 5. Univariate Log-Log Regression

Figure 6. Multivariate Log-Log Regression Equation

## References

- Brandenberg, Scott J., et al. "Next-Generation Liquefaction Database." Earthquake Spectra, vol. 36, no. 2, May 2020, pp. 939–959. doi:10.1177/8755293020902477.
- Omoya, Morolake; Ero, Itohan; zaker esteghamati, mohsen; Burton, Henry; Brandenberg, Scott; Nweke, Chukwuebuka (2021) "Relational database for post-earthquake damage and recovery assessment: 2014 South Napa earthquake." DesignSafe-CI. <https://doi.org/10.17603/462-3nyj-4127>.
- Sun, H. Burton, H. Wallace, J. Reconstructing seismic response demands across multiple tall buildings using kernel-based machine learning methods. Struct Control Health Monit. 2019; 26:e2359. <https://doi.org/10.1002/stc.2359>
- Zaker Esteghamati, Mohsen & Lee, Jeonghyun & Mustetich, Matthew & Flint, Madeleine. (2020). INSSEPT: An open-source relational database of seismic performance estimation to aid with early design of buildings. Earthquake Spectra. 10.1177/8755293020919857.

## Bhavik Joshi



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Freshman, UCLA

# Multi-Hop Mesh Networking with Frequency Diversity as Robust Communication Infrastructure for Robotic Swarms

*FACULTY ADVISOR*  
Ankur Mehta

*DAILY LAB SUPERVISOR*  
Ankur Mehta

*DEPARTMENT*  
Electrical and Computer Engineering

## ABSTRACT

Robotic swarms are groups of autonomous robots that work together in order to perform tasks through cooperative behavior and interactivity with their environments. In order for robotic swarms to collaborate, they must have a reliable way of communicating with one another. Thus, we created a robust network infrastructure to allow autonomous robots to work together through peer-to-peer communication even in difficult environments. As a means of doing so, we used the painless-Mesh Arduino library to implement a multi-hop mesh network, or a network topology that allows each node to relay signals to nodes too far away by routing packets across intermediate nodes. Additionally, we added 433 MHz packet radios onto our hardware stack and sent each message between robots over multiple, distinct frequencies; this keeps interference on one frequency band from preventing successful communication. Through this infrastructure, we enabled our robots to successfully communicate with any other robot. We also saw that for certain messages, when one frequency became unusable, our diversity maintained the infrastructure's ability to communicate reliably. In the future, this work can be used to bring robotic swarms one step closer to becoming ubiquitous and useful in daily life, improving their communication so that together they can accomplish tasks previously and independently impossible.

## Multi-Hop Mesh Networking with Frequency Diversity as Robust Communication Infrastructure for Robotic Swarms



Bhavik Joshi, Dr. Ankur Mehta, The Laboratory for Embedded Machines and Ubiquitous Robots, UCLA

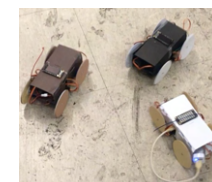
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UCLA Electrical and Computer Engineering

**UCLA** Samueli  
School of Engineering  
SUMMER UNDERGRADUATE RESEARCH PROGRAM

### Objective

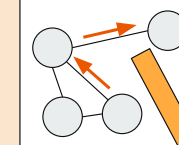
We are creating a **robust network infrastructure** with a multi-hop mesh network and frequency diversity for robotic swarms to communicate over.

- Goal:
- Robots can communicate, even in difficult environments



- Robotic Swarms:
- Collaborative robots
  - Environment interactivity
  - Must communicate reliably

### Network Robustness



Multi-Hop Mesh Network:

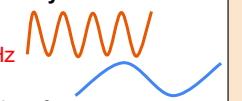
- Any node to any node
- Intermediates relay signals to unreachables

Why: to allow our robots to **communicate with any other robot**

Frequency Diversity

- Using multiple, distinct frequencies (**2.4 GHz** and **433 MHz**)

Why: our robots **communicate over both** so interference on one doesn't stop communication



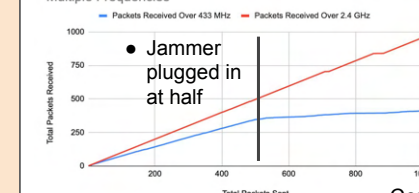
### Results and Conclusions



The network enabled our robot swarms to:

- Work autonomously
- Respond to commands

Effect of a 433 MHz Jammer on Packets Received Over Multiple Frequencies



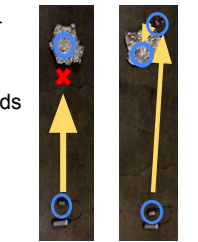
- The network is robust:
- Works when one frequency fails
  - Indirect nodes can communicate

Conclusions and Future  
This research advances swarm communication

Swarms can do harder tasks in more difficult environments

Robotic swarms become ubiquitous

Because of the **reflective obstacle**, the **signal** has to hop across **nodes**



### Infrastructure Elements

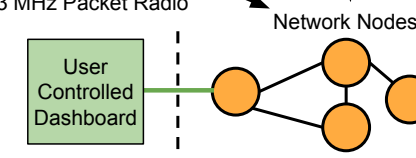
Hardware used:



ESP32 Featherboard,  
433 MHz Packet Radio

Software used:

- painlessMesh
- Mesh over WiFi
- Radiohead library
- Arduino IDE



- We created a software package that implements:
- 433 MHz radio into a **multi-hop mesh network**
  - A bridge node that **relays packets between an external network** and other nodes
  - Swarm communication into a simple to use Arduino library

### Acknowledgements

- William Herrera, Summer Undergraduate Research Program
- Dr. Ankur Mehta, Grace Kwak, Jaehoon Song, Jillian Pantig, Marisa Duran, Shahrul Kamil Hassan, and Sudarshan Seshadri, UCLA Lemur





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## Wearable & Mobile Bioanalytical Technologies for Personalized Medicine

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### ABSTRACT

Exponential growth in Internet of Things (IoT) devices and wearable sensing technologies has created an unprecedented opportunity to enable personalized medicine through real-time individual biomonitoring. Although these commercialized platforms are capable of tracking physical activities and vital signs, they fail to access molecular-level biomarker information which provide insight into the body's dynamic chemistry. Thus, as sweat is a rich source of biomarkers that can be retrieved unobtrusively, sweat-based wearable biomonitoring has emerged as one of the most promising candidates to merge this gap. By designing and integrating compact electrochemical sensors into wearable electronic devices, we can non-invasively and accurately track specific biomarkers in sweat and provide actionable feedback about users' health status. We develop a signal modulation strategy to stimulate our electrochemical sensors for wearable biomarker monitoring. We also design a novel sensor readout methodology for improved and accurate biomarker tracking. Then, we integrate these designs into a wireless electrochemical readout circuitry to noninvasively track intended biomarkers. As a result, we successfully demonstrate our signal modulation solution's efficacy through electrodeposition of prussian blue films. Additionally, we show this sensing methodology improves signal readout and sensitivity by 3 times. Thus, we can non-invasively track subjects' biomarkers and underlying health status in a wireless and wearable format. This platform can further be utilized for real-time glucose monitoring in diabetic patients without requiring conventional painful extraction methods, or monitoring lithium levels in bipolar patients for drug abuse/compliance.

## Wearable & Mobile Bioanalytical Technologies for Personalized Medicine

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<sup>1</sup>Department of Electrical Engineering, University of California, Los Angeles

<sup>2</sup>Department of Physical Science & Mathematics, Mount Saint Mary's University

FAST TRACK  
TO SUCCESS  
UCLA Electrical and  
Computer Engineering

UCLA Samueli  
School of Engineering  
SUMMER UNDERGRADUATE  
RESEARCH PROGRAM



### INTRODUCTION

The exponential growth in Internet of Things (IoT) devices and wearable sensing technologies have created an unprecedented opportunity to enable personalized medicine.

Although commercialized IoT devices and wearable sensors are capable of tracking physical activities and vital signs, they fail to access molecular-level biomarker information that provide insight into the body's dynamic chemistry.

Sweat-based wearable biomonitoring has since emerged as one of the most promising candidates because sweat is a rich source of biomarkers that can be retrieved unobtrusively<sup>1</sup>. However, a series of wearable sensors and electronic systems need to be designed to provide access to these biomarkers and realize wearable sweat sensing.

### OBJECTIVES

1. Define a signal modulation strategy to stimulate our electrochemical sensors for wearable biomarker monitoring.
2. Develop a novel sensor readout methodology for improved and accurate biomarker tracking.

### TECHNICAL TERMS

**Near Field Communication (NFC):** Inductive coupling between a reader and a tag

**Cyclic Voltammetry (CV):** Detect the electrochemical properties of biomarkers at the sensor for accurate sensing.

### PRINCIPLES

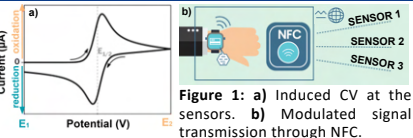


Figure 1: a) Induced CV at the sensors. b) Modulated signal transmission through NFC.

### OUR WEARABLE TECHNOLOGY

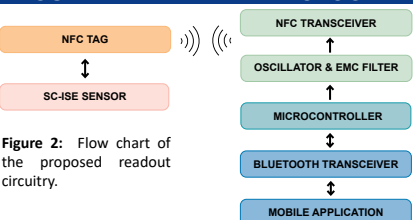


Figure 2: Flow chart of the proposed readout circuitry.

The flexible reader circuit delivers power to and communicates with the flexible tag on the skin. The circuitry of the tag then rectifies the modulated signal to scan the sensors.

### MATERIALS

**Circuit Simulation:** LTSpice, Microsoft Excel  
**Sensor & System Development:** Lithium (Li) solutions, Li Ion-Selective-Electrodes (ISE sensors), a commercial potentiostat, custom-developed flexible printed circuit board (FPCB), and electronic components.

### METHOD FOR SENSOR TESTING

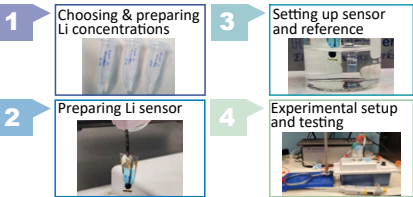


Figure 3: Method for sensor testing steps.

### CIRCUIT SIMULATION PROCESS

1. Oscillator, EMC filter, match network characterizations
2. Evaluate the signals at different nodes
3. Use Excel to plot the amplitude modulated signal

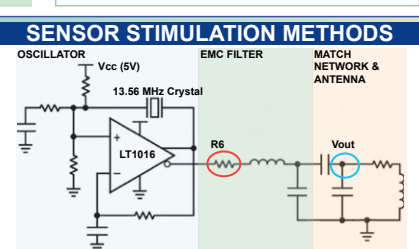


Figure 3: Signal modulation circuitry generating a spectrum of sine waves at 13.56 Mhz.

To realize the waveform for CV, we specifically designed the circuit to modulate voltages for analyte detection.

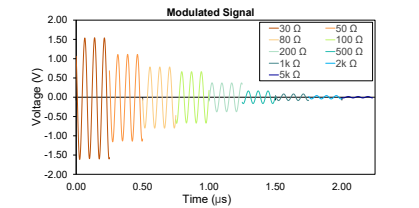


Figure 4: Simulated waveform at the reader showing effect of programming a trimmer at the EMC filter on modulating and generating the intended waveform.

Accordingly, we can modify the reader to demonstrate the accuracy and application of our design.

### SENSOR DEVELOPMENT

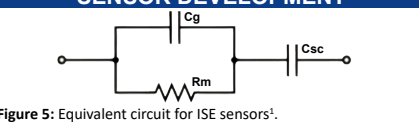


Figure 5: Equivalent circuit for ISE sensors<sup>1</sup>.

**ISE Sensor Technical Terms:**  
**R<sub>m</sub>:** solution resistance  
**C<sub>g</sub>:** geometric capacitance of the electrode  
**C<sub>sc</sub>:** fabricated sensor's capacitance  
**ISE:** acts as a transducer which converts ion activity into electric potential for biomarker sensing

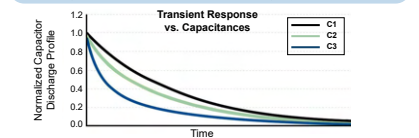


Figure 6: Transient current waveforms following the reduction of the internal capacitance.

We utilize ISE sensors to perform biomarker sensing in sweat and in a wearable format. Understanding of the equivalent circuit portrays how the sensor works and interacts with the tag.

The sensors demonstrate a transient response due to the internal capacitance of the sensor (C<sub>sc</sub>) causing shift in the readout signal.

By adding an external real capacitance in the circuit we can suppress this transient response and stabilize sensor measurement, decreasing potential drift.

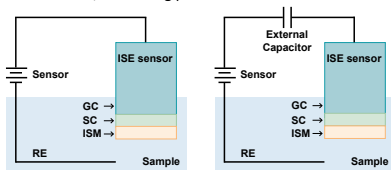


Figure 7: Circuit diagram of ISE with added capacitance.

As demonstrated in Fig. 6, by incorporating a real capacitance into the circuit, we can reduce the internal capacitance of the sensor for improved and accurate sensing results.

### RESULTS

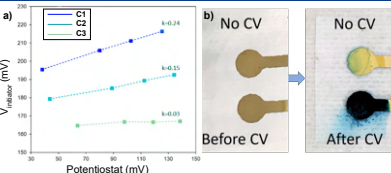


Figure 8: Results for a) improved sensor signal readout method and b) effective signal modulation.

We observed improved sensitivity in Li readouts by manipulating the internal electrochemical capacitance of the ISE sensor and successfully deposited Prussian Blue on the gold electrode as an indication of correct application of CV amplitude modulation by the circuit.

### CONCLUSION & FUTURE WORK

1. Achieved wireless CV scanning of sensors enabling active biomarker sensing in a series of electrochemical sensors.
2. Improved the tag's sensitivity to current drifts of ISE sensors through specific adjustment of internal capacitance.

This system can further be utilized to track and monitor biomarker profiles in biological media and enable a tracking systems for the healthcare system to realize personalized medicine.

### REFERENCES

[1] Emaminejad, Sam, et al. "Autonomous sweat extraction and analysis applied to cystic fibrosis and glucose monitoring using a fully integrated wearable platform." PNAS (2017): 201701740.

### ACKNOWLEDGEMENTS

We would like to thank the National Science Foundation for funding our project through the UCLA Summer Undergraduate Research Program. Additionally, we would like to thank Professor Emaminejad, our PhD student advisor Hannaneh Hojajji for her advice and support, and Will Herrera for his guidance throughout the research program.



## Sarah Kimak



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# Analyzing the Effectiveness of Social Robots in Children’s Speech Assess-ments

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Electrical and Computer Engineering

### ABSTRACT

Speech recognition devices have vastly transformed people’s way of life, as everyone knows of “hey google” and “Alexa,” but there are great-er possibilities with such systems including improving the early educa-tion of children. Many children are behind in their reading and speech acquisition skills, a direct result of lack of exposure to vocabulary and oral skills. While other companies have created intelligent tutoring sys-tems, they do not possess the ability to pick up on the acquisition of children. In order to determine the success of a young child interacting with a social robot, a series of tasks were completed and recorded with an instructor, child and the robot JIBO. These sessions were analyzed to quantify patterns in interactions such as boredom, excitement, and frustration. The data concluded that boredom and prompts from the instructor occurred most often, showing that young children struggle the most with staying focused during the long tasks. The more interjec-tions from the instructor, the longer the sessions lasted since they kept the children on track, but it was found only 18.7% of the recordings were a child speaking. It’s suggested the tasks be shortened so that there can be more success in the students completing all of the tasks to be recorded and analyzed for future sessions. Social robots can be used in classrooms, clinician offices and even at home to develop learning at a young age that is most beneficial for the future.

## Analyzing the Effectiveness of Social Robots in Children's Speech Assessments



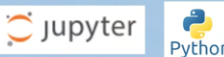
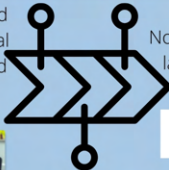
Sarah Kimak - Speech Processing & Auditory Perception Lab  
Department of Electrical and Computer Engineering  
Professor Abeer Alwan & DLS Alexander Johnson  
University of California, Los Angeles

### Introduction & Background

- Tech giants lack major focus on the articulation of children when creating and developing speech recognition devices
- Intelligent tutoring systems only have success with kids over 10 years old, after their crucial developmental education years [1]
- The goal of this project is to analyze how children interact with a social robot in order to determine what improvements need to be made so they can successfully conduct a session of tasks
- Robots can conduct individual and specialized lessons that benefit the child's reading, speech and language acquisition skills, which many kids are falling behind in today

### Materials & Methods

1. Sessions conducted and recorded by social robot JIBO with a child aged 4-7 and an instructor [1]
2. Transcripts analyzed for patterns of boredom, excitement, needing assistance from the instructor, etc.
3. Anaconda Jupyter Notebook and Python coding language used to quantify and compare patterns



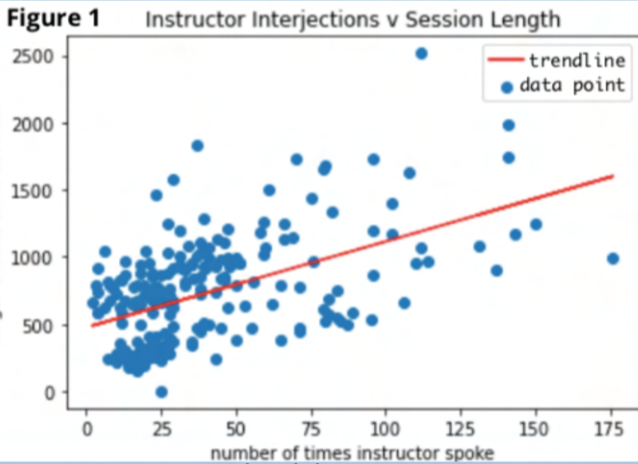
### Results & Discussion

#### Quantifying Patterns (by hand):

- Incompletion of tasks and interjections from the instructor were the most frequent patterns that occurred.
- Analyzing by hand reveals specifics that are hard to identify with code since all sessions are unique to the student and instructor.
- The instructor interjected to move the session along when JIBO couldn't, by helping the student to get back on track or understand the assignment, and in order to get the student to give more details in the explanation task (where they had to answer personal questions about themselves and their life).

#### Quantifying Patterns (with code):

- A function was used to go through transcripts and total the occurrences of exact phrases showing instructor interjections:
- [I]:** 8730 - the instructor was speaking in the format of the transcripts, but there is no way of knowing if they are helping the child or just making casual conversation
  - anything else:** 654 - a popular secondary prompt in the explanation tasks when the instructor desired more details
  - what is this:** 1920 - used as a prompt, but was also how JIBO asked children to identify images, letters and numbers



number of times instructor spoke

**Acknowledgements**

- I am grateful for NSF for sponsoring my position in the 2021 SURP, which has been an amazing opportunity for me to expand my knowledge, interests, and possibilities for the future.
- A special thank you to Dr. Alwan and prior researchers for giving me an incredible project to work on and learn from this summer and my DLS Alexander Johnson for teaching and guiding me in my research and new topics of interest in the field.

#### References

- [1] Gary Yeung, Alison L. Bailey, Amber Afshari, Marlen Q. Pérez, Alejandra Martín, Samuel Spaulding, Hae Won Park, Abeer Alwan and Cynthia Breazeal "Towards the Development of Personalized Learning Companion Robots for Early Speech and Language Assessment", ASRA, 2019, DOI: 10.3021/1431402
- [2] Gary Yeung, Alison L. Bailey, Amber Afshari, Morgan Tinkler, Marlen Q. Pérez, Alejandra Martín, Anahit A. Pogossian, Samuel Spaulding, Hae Won Park, Manushage Mucio, Abeer Alwan and Cynthia Breazeal, "A robotic interface for the administration of language, literacy, and speech pathology assessments for children", SATE, 2019, pp. 41-42
- [3] "Jibo Robot - He can't wait to meet you," Boston, MA, 2017, [Online]. Available: <https://www.jibo.com>

- Using the NumPy library, the Figure 1 graph was created to display how more prompts by the instructor increased session length, as indicated by both the by hand and with code analyses.
- Use of prompts such as 'anything else?' and 'what is this?' helped students to refocus on the task and continue answering questions.

- In using code to calculate the average percentage of student's speaking throughout all of the transcripts it was found that **only** about **18.7%** of the recordings were actually the students.
- This finding demonstrates how often JIBO or the instructor were conducting the task or prompting the student.

### Conclusions

- Analyzing the transcripts both by hand and with code was insightful in seeing how students interacted with JIBO, situations where JIBO could not successfully move the session along, as well as the trend of prompts by instructors increasing the length of the session.
- Students mostly struggled with the explanation tasks because they required them to form complex sentences whereas in other tasks they simply had to identify images, letters and numbers.
- A suggestion for future experiments is to adjust the length so that the students remain engaged and can actually complete the tasks. It is important for them to finish the sessions successfully in order to collect data more specific to the articulation of children, after their interaction with JIBO the social robot is improved.



## Ash Kuhlmann



Chemical Engineering  
2nd Year, El Camino College

## Designing a Pseudo-Solid Electrolyte

FACULTY ADVISOR

Bruce Dunn

DAILY LAB SUPERVISOR

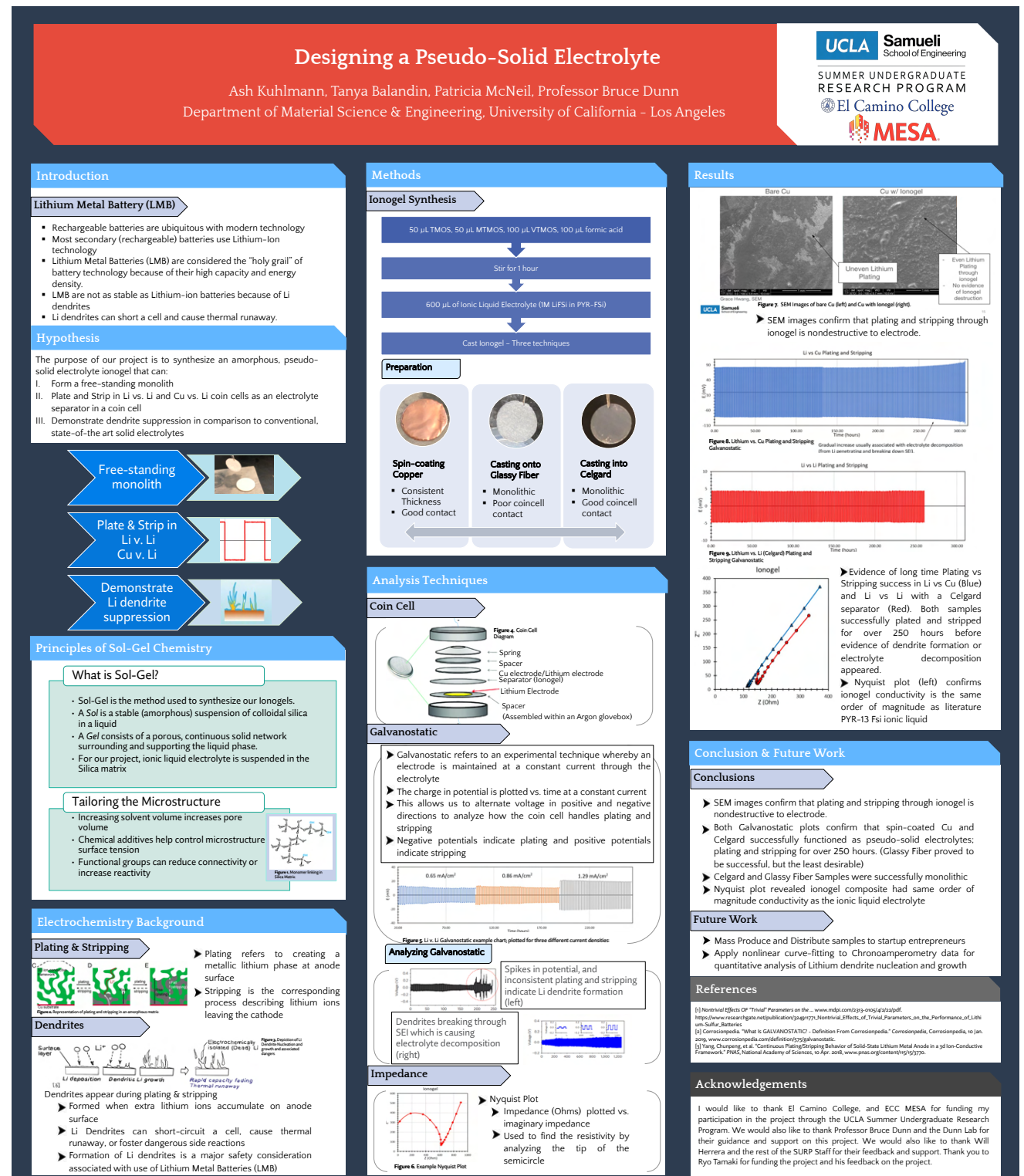
Patricia McNeil

DEPARTMENT

Materials Engineering

### ABSTRACT

Demand for rechargeable electronics has increased reliance on lithium (Li) metal batteries. Unfortunately, repeated plating and stripping of Li metal results in dendrite formation, limiting safe and reliable use of Li as an electrode. Our project seeks to develop a free standing monolithic ionogel separator, which would function as an electrolyte while suppressing dendrite formation for long term cycling. We synthesized ionogel materials consisting of MTMOS, TMOS, VTMOs, formic acid, and LiFSi in ionic liquid using typical ionogel synthesis procedures. Galvanostatic measurements in coincells revealed consistent plating and stripping for up to 250 hours (for spin coated Cu) and up to 30 hours (for infiltrated celgard) without evidence of Li dendrite formation or short-circuiting. These results represent a “proof-of-concept” for the production of free-standing pseudo-solid electrolytes and suggests promising results for Li dendrite suppression.



## Grace Kwak



Electrical Engineering  
Freshman, UCLA

## Printable Robotic Boat Swarms with Actuation and Sensing Capabilities

*FACULTY ADVISOR*

Ankur Mehta

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Ankur Mehta

*DEPARTMENT*

Electrical and Computer Engineering

### ABSTRACT

The design and development of robotic devices remains limited to those with considerable time, funds, and technical expertise. Our goal is to increase the accessibility of robotics so that the average person can design and create their own robotic boats. I set out to provide a variety of boat hull morphologies with three new actuation capabilities: a propeller, paddlewheel, and rudder. After designing the 2D layout of these origami-inspired boats, I implemented them in the Robot Compiler (RoCo) framework for generating foldable robotic designs, thus allowing a user to add any actuation capability to any boat hull by setting parameters in code. I then used a paper cutter to cut out inexpensive thin plastic sheets into foldable boats with actuators driven by continuous rotation servos and DC motors. I found that the propeller produces fast linear motion, the paddlewheel enables motion that is linear and rotational, and the rudder adds more precise steering capabilities. In order to test my boats' autonomous capabilities such as following a colored object, I integrated my boats with OpenMV cameras and inertial measurement units (IMUs), which provided basic feedback-controlled movement. I found that given this relatively small set of tools and materials, it's possible to generate a wide variety of robotic boats. This work establishes a foundation for the community at large to rapidly, easily, and inexpensively create novel types of robotic boats.

## Printable Robotic Boat Swarms with Actuation and Sensing Capabilities

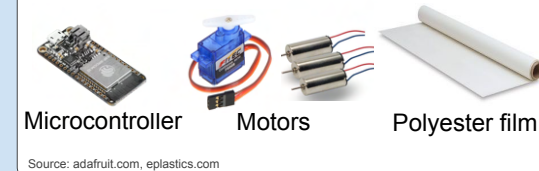
Grace Kwak, Ankur Mehta  
Laboratory for Embedded Machines and Ubiquitous Robots  
UCLA Electrical and Computer Engineering Department



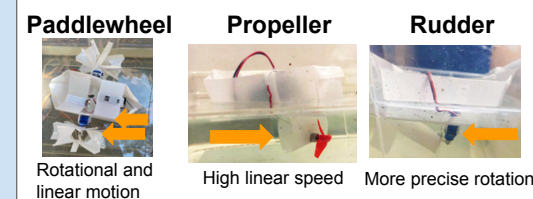
### Introduction

We build upon a framework for foldable robotic designs in order to allow users to build printable robotic boats with driven propellers, paddle-wheels, and rudders.

### Materials



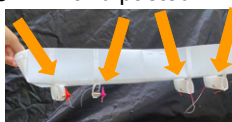
### Results



**Parameterized**  
Adjustable dimensions and actuator positioning



**Modularized**  
Designs can be cut and pasted

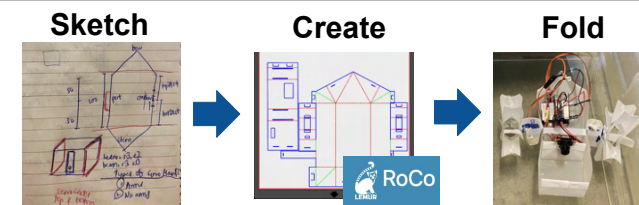


**Additional features**

- User-controllable via dashboard
- Feedback control using vision processing

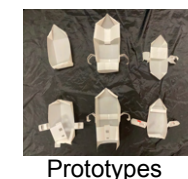


### Design Process



### Rapid, simple, low-cost

- Origami-like straight folds
- Tab-and-slot connections
- Single-sheet fabrication



### Conclusion

Modularity + Parameterization → New Designs

### Future work

- Amphibian vehicles
- Boat sails and masts

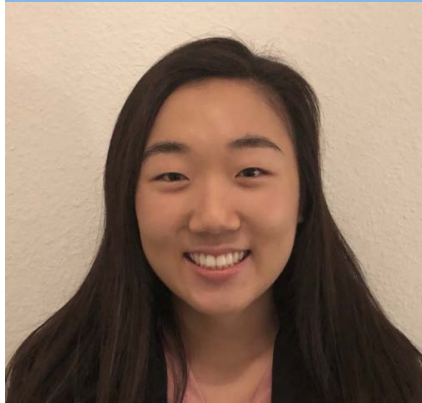


### Acknowledgements

- William Herrera, SURP
- Ankur Mehta, UCLA LEMUR
- UCLA ECE Fast Track
- National Science Foundation



## Sung Gyung Lee

Chemical Engineering  
Junior, UCLAGallic Acid Upregulates Glycolysis  
and Depletes Tricarboxylic Acid Cy-  
cle Intermediates in H1299 Human  
Non-small Cell Lung Cancer Cells

FACULTY ADVISOR

Junyoung Park

DAILY LAB SUPERVISOR

Sevcan Erşan

DEPARTMENT

Chemical and Biomolecular Engineering

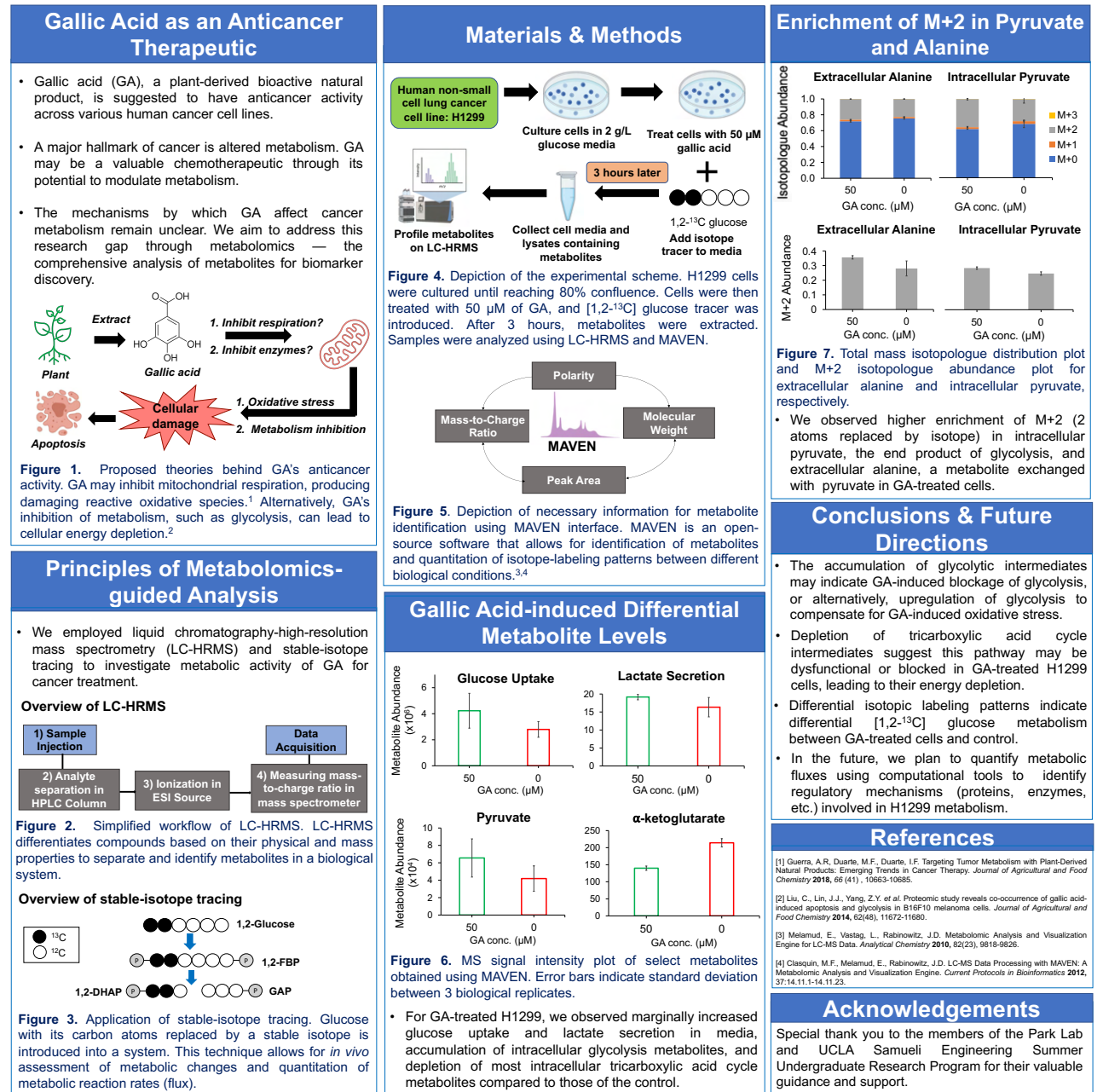
## ABSTRACT

A major hallmark of cancer is metabolic reprogramming, characterized by the upregulation of glycolysis to fuel cancer cells' energy demand. Targeting altered cancer metabolism is an emerging strategy for developing new chemotherapeutics for cancer treatment. Phenolic compounds, plant-derived bioactive natural products, are potential metabolism modulators with their broad range of interactions with enzymes and proteins and their potential interference with cellular activities. However, the potential mechanisms by which phenolic compounds affect cancer metabolism remain unclear. To address this research gap, we treated a human non-small cell lung cancer H1299 cell line with 50  $\mu$ M of gallic acid, a dietary phenolic compound, for 3 h. Gallic acid-induced metabolite changes in H1299 cells were determined via metabolomic profiling using liquid chromatography-high-resolution mass spectrometry and stable-isotope tracing using [1,2- $^{13}$ C] glucose. After 3-h gallic acid exposure, increased glucose uptake and accumulation of intracellular glycolysis intermediates, such as hexose-biphosphate, phosphoglycerate, and pyruvate, were observed. Citrate, an intermediate of the tricarboxylic acid (TCA) cycle interconnected to glycolysis, was accumulated in gallic acid-treated cells while remaining downstream metabolites, including alpha-ketoglutarate and succinate, from the same pathway were depleted. These results may indicate that glycolysis is upregulated to feed increased energy need of cells after gallic acid treatment, possibly due to increased gallic acid-induced oxidative stress and blockage of metabolic pathways providing energy. Upon feeding cells with stable-isotope [1,2- $^{13}$ C] glucose, we observed higher enrichment in M+2 isotopic fraction in intracellular pyruvate and extracellular alanine, a metabolite exchanged with intracellular pyruvate, in gallic acid-treated cells than that of the controls, further supporting our hypothesis on upregulation of glycolysis. These results taken together suggest gallic acid may be a promising anti-cancer agent, altering metabolism in H1299 by affecting downstream glycolysis and TCA pathways, consequently reducing energy supply. Through our metabolomic findings, we hope to further understanding of gallic acid's anticancer activity.

Gallic Acid Upregulates Glycolysis and Depletes Tricarboxylic Acid Cycle  
Intermediates in H1299 Human Non-small Cell Lung Cancer Cells

Sung Gyung Lee, Sevcan Erşan, Junyoung Park

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## Ella Levine



Chemical Engineering  
Freshman, UCLA

# Annual Energy Output for Multijunction Solar Cells In Los Angeles County

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Carissa Eisler

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Lindsey Parsons

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Chemical Engineering

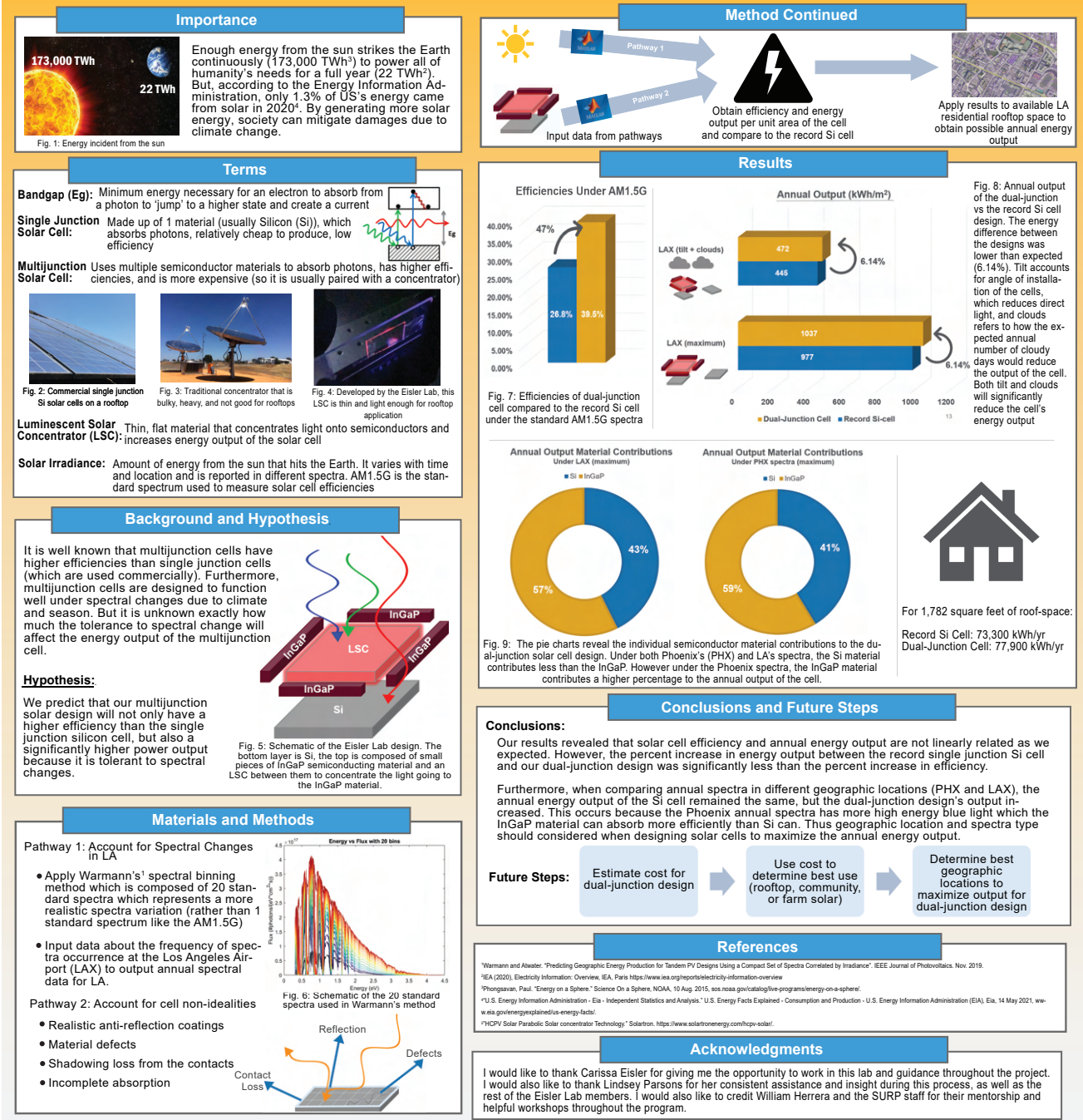
ABSTRACT

Implementing renewable energy sources is necessary to combat climate change. Typical solar panels use single junction cells (which use one material to absorb and convert light) instead of more expensive multijunction cells (which use multiple materials and convert sunlight more efficiently). Annual power production estimations are often based on efficiency, representing the power converted for a standard spectrum (AM1.5G), without accounting for spectral changes due to climate and season. These changes significantly impact annual energy generation, but data constraints and geographic variations hamper effective modeling. We hypothesized that a multijunction cell design employing a low-cost flat concentrator would generate significantly more energy from rooftop installations than current estimations of efficiency improvements. We applied Warmann's<sup>1</sup> spectral binning method and data from Los Angeles to detailed balance calculations with realistic concentrator and cell properties to predict the power output. Then, we applied developable residential roof area to calculate LA's annual solar energy generation for households. We found that our dual-junction solar cell design is 39.5% efficient while the record silicon single junction cell is 26.8% efficient. However, when accounting for annual spectral changes for LA, our design has a yearly maximum energy production of 472 kWh/m<sup>2</sup>—which is only 6.14% higher than the silicon cell (445 kWh/m<sup>2</sup>). This is lower than the percent increase in efficiency (47%). This demonstrates the importance of comparing designs through annual energy produced rather than efficiency so we can idealize designs for specific locations.

## Annual Energy Output for Multijunction Solar Cells in Los Angeles County

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Sandra Li



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Junior, UCLA

## Modeling Terahertz Quantum-Cascade VECSELS with Randomized Metasurface Ridges Widths

FACULTY ADVISOR

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### ABSTRACT

Speckle is an imaging artefact that arises from interference in high-coherence sources, such as conventional single-mode lasers. Thus, one approach to removing speckle in imaging is using spatially incoherent multi-mode lasers. For this reason, we are interested in achieving multi-mode lasing in the terahertz frequency range – a frequency range that is promising for imaging applications due to its non-ionizing yet penetrative nature. Using quantum-cascade vertical-external-cavity surface-emitting lasers (QC-VECSELS) – lasers in which in one reflecting end of the laser cavity is combined with metal-topped ridges that are filled with quantum-well gain material – our lab has previously achieved single-mode terahertz lasing. However, multi-moding is more difficult to achieve due to gain competition and spatial hole burning. In this work, we present a 2D model of QC-VECSEL metasurfaces with random ridge widths, based on our hypothesis that randomizing the ridge widths will localize lasing modes to different areas of the metasurface, reducing spatial hole burning. To investigate the validity of this approach, we generated various random metasurfaces and simulated their cavity fields using COMSOL Multiphysics. We then extracted all modes lasing under a fixed gain threshold and calculated their mutual spatial overlap across all biased ridges. In these simulations, we demonstrated that randomizing the metasurface increased the number of lasing modes and decreased spatial overlap significantly, at the cost of increased thresholds. In addition, uncertainty remains in how accurately our 2D models will represent 3D devices, and in how much we actually need to reduce spatial overlap for successful multi-moding.



## Modeling Terahertz Quantum-Cascade VECSELS with Randomized Metasurface Ridge Widths

Sandra Li, Eilam Morag, Professor Benjamin S. Williams

Terahertz Devices and Intersubband Nanostructures Laboratory  
UCLA Department of Electrical and Computer Engineering

UCLA Samueli  
School of Engineering

SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

### INTRODUCTION

Speckle is an imaging artefact that arises from interference in high-coherence sources, like single-mode lasers. Speckle can be removed using spatially incoherent, multi-mode lasers, as the speckle patterns from different spatial modes will average each other out and reduce grain.

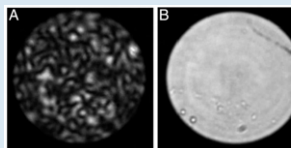


Fig. 1. A. Speckle from a coherent source. B. Speckle-free imaging from a multi-mode laser. Original figure reprinted from [3].

We are interested in achieving multi-mode lasing in the terahertz frequency range using our quantum-cascade vertical-external-cavity surface-emitting lasers (QC-VECSELS)<sup>1</sup>. However, achieving significant multi-moding is often challenging due to spatial hole burning.

### OBJECTIVE

Inspired by random laser<sup>2</sup> and chaotic cavity<sup>3</sup> work, we hypothesize randomizing the metasurface ridge widths will localize lasing modes to different areas of the metasurface, reducing spatial hole burning. We aim to test the validity of this hypothesis by simulating the cavity fields of randomized metasurfaces in two dimensions.

### BACKGROUND

**Threshold gain** – the amount of amplification gain material needs to provide for a mode to lase. Different modes have different thresholds.

**Metasurface** – reflective QC-VECSEL structure with metal ridges filled with quantum-well gain material laid on top.

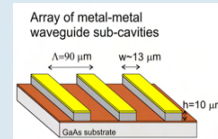
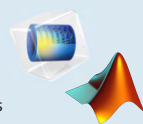


Fig. 2. The ridges of a QC-VECSEL metasurface act like antennas to help propagate emitted waves. In the base design, all ridges are of uniform width. Original figure reprinted from [1].

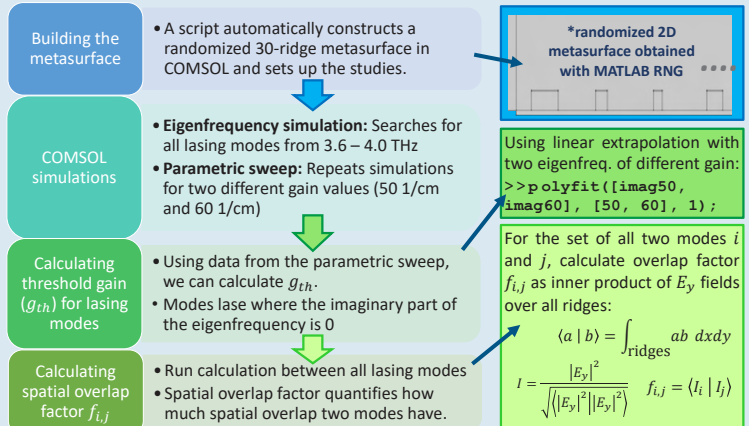
**Spatial hole burning** – Strong modes in a laser cavity will eat up the gain in the area they occupy spatially, reducing the availability of gain for other modes in that area.

### MATERIALS

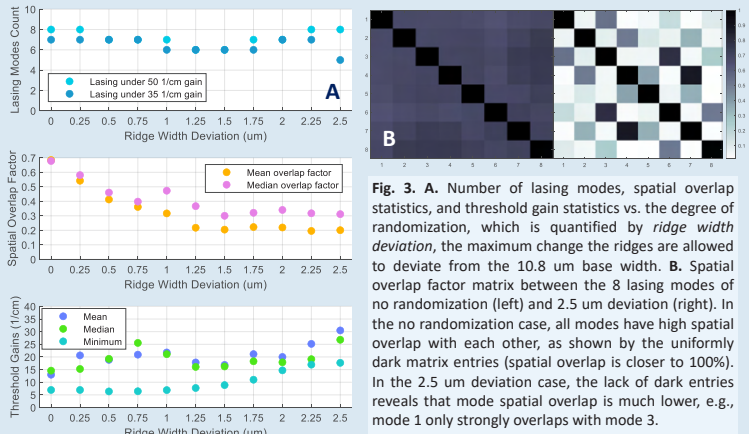
- COMSOL Multiphysics with LiveLink scripting module
- For running simulations
- MATLAB
- For writing scripts and calculations



### METHODS



### RESULTS



### CONCLUSIONS

We demonstrated that randomizing the metasurface significantly decreased spatial overlap, at the cost of increased thresholds. There is still some uncertainty as to how much we'll actually need to reduce spatial overlap for multi-moding. In the future, we plan to fabricate randomized patch metasurfaces and perform experiments to see if the model predictions are reflected.

### ACKNOWLEDGEMENTS

I would like to thank the National Science Foundation for funding this project. I would also like to thank Eilam Morag and Prof. Benjamin Williams for their help and guidance. I thank UCLA SURP for their support this summer.

### REFERENCES

- [1] Appl. Phys. Lett. 107, 221105 (2015); <https://doi.org/10.1063/1.4936887>
- [2] Molen, Karen L. van der, et al. "Spatial Extent of Random Laser Modes." *Physical Review Letters*, vol. 98, no. 14, 2007.
- [3] Redding, Brandon, et al. "Low Spatial Coherence Electrically Pumped Semiconductor Laser for Speckle-Free Full-Field Imaging." *Proceedings of the National Academy of Sciences*, vol. 112, no. 5, 2015, pp. 1304–09.

## Dehao Lin



Mechanical Engineering  
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## Scott Cao



Mechanical Engineering  
Freshman, UCLA

# Exploring Viscoelastic Properties of Liquid Crystal Elastomers (LCEs)

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## ABSTRACT

Recently, soft materials have been under increasing study due to their high flexibility. We are studying a soft material known as liquid crystal elastomers (LCEs). With the ability to change shape when exposed to heat or light, LCEs have found applications in artificial muscles, biomedical devices, and more. These materials are made of liquid crystals (LCs) embedded in the backbone of a polymer, and their LCs can reorient in the direction of an applied stress. Our goal is to experimentally study the mechanical properties of LCEs and further explain their constitutive behavior by focusing on LCEs whose LCs are oriented in the same direction, called monodomain LCEs. We conducted relaxation tests and uniaxial stress-strain measurements at different loading rates on monodomain LCEs that we fabricated with different LC orientations. Effects of stress on LC reorientation were measured using transmission circular polariscopy (TCP), which characterizes the rotation of LCs during deformation. In addition, digital image correlation (DIC) was used to study the shear strain distribution in stretched LCEs. Our results show that the stress-strain relation of LCEs highly depends on loading rate and LC orientation. At low strain rates, the hysteresis in stress-strain curves is small, and LCs can reorient with strain, while at high rates, the hysteresis is large, and there is a lag of LC reorientation. Also, our DIC tests show that LC reorientation causes shear strain within LCEs. These experiments further contribute to the development of theoretical models of LCEs and drive forward LCE technologies.

## Exploring Viscoelastic Properties of Liquid Crystal Elastomers (LCEs)

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UCLA Samueli  
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SUMMER UNDERGRADUATE  
RESEARCH PROGRAM



### Introduction

- Liquid crystal elastomers (LCEs): class of soft materials that can change shape when exposed to heat or light
  - Great potential as actuators
  - Application in artificial muscles, biomedical devices, robotics, etc.
- Much still to be discovered about rate-dependent viscoelasticity of LCEs

### Objective

Experimentally analyze mechanical properties of monodomain LCEs by studying their stress-strain and liquid crystal reorientation behaviors under tensile loading

### Background Information

LCEs: made of liquid crystals (LCs) embedded in polymer (elastomer)

- Monodomain when all LCs oriented in same direction
- LCs can be tilted at any angle  $\theta$
- When external force (stress) is applied, LCs align in direction of force<sup>2</sup>

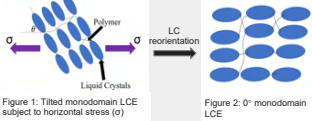


Figure 1: Tilted monodomain LCE subject to horizontal stress (σ)

- Monodomain LCEs appear transparent




Figure 2: 0° monodomain LCE

- LCs go from nematic to isotropic phase when exposed to light or heat, causing shape change

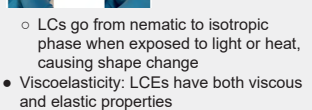


Figure 3: Stretching opaque LCE (left) aligns LCs, revealing hidden word underneath (right)

- Viscoelasticity: LCEs have both viscous and elastic properties
  - Elasticity: From elastomer
  - Viscosity: From elastomer and LC reorientation
- LC orientation: Determined by measuring transmitted light intensity using transmission circular polariscopy (TCP)
  - LCs polarize light along orientation direction<sup>4</sup>
  - Lowest transmitted intensity when LC angle is perpendicular to polarizer

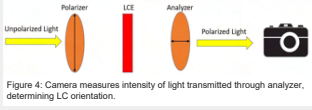


Figure 4: Camera measures intensity of light transmitted through analyzer, determining LC orientation.

### Methods & Materials

#### Fabrication of LCEs

- LCE fabrication: used two-stage thiol-acrylate Michael addition-photopolymerization technique<sup>5</sup>
- Liquid Crystal: RM257
- Polymer: PETMP and EDDET

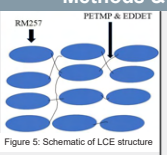


Figure 5: Schematic of LCE structure

#### Tensile Tests

- Used Instron to perform stress-relaxation and tensile tests
- Tensile tests: Loaded and unloaded 0° LCEs at different loading rates
- Relaxation tests: Loaded 0° LCEs to 30% strain in 0.5 seconds and hold, measuring stress over time




Figure 6: Instron machine

#### Liquid Crystal Orientation

- Used LCE setup (Figure 7)
- Rotated polarizers at 5° intervals from 0° to 90°
- At each interval, recorded 30° LCE as Instron stretched it to 100% strain
- Steps 2&3 repeated for 0.1%/s, 1%/s, 10%/s loading rates
- Analyzed videos to produce intensity-angle graph (Figure 8) at each strain
- Found parameters  $I_0$ ,  $b$ ,  $c$ ,  $d$  to fit graph to equation 1
- Parameter  $c$  is the director angle

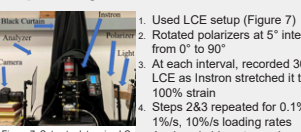


Figure 7: Setup to determine LC orientation. Polarizer and analyzer placed 90° with respect to each other. Black curtain eliminates outside light.

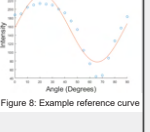


Figure 8: Example reference curve

$$I = I_0 \sin^2 \left( \frac{\pi}{180} \times (\theta - c) \right) + d$$

\*Equation 1

#### Digital Image Correlation (DIC)

- Dotted 0° and 45° monodomain LCEs with speckle pattern (Figure 9) using airbrush
- Used setup (Figure 10) to record LCE as Instron stretched it
- DIC algorithm (Noor)<sup>1</sup> analyzed changes in speckle pattern between video frames to calculate strain of each point within LCE

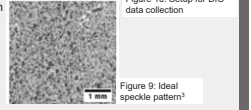


Figure 9: Ideal speckle pattern<sup>3</sup>




Figure 10: Setup for DIC data collection

### Results & Analysis

#### Tensile and Stress-Relaxation Tests

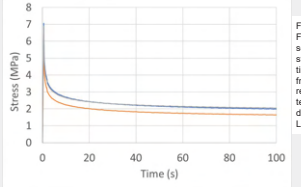


Figure 11: First 100 seconds of stress vs. time curves from stress-relaxation tests for 3 different LCEs

- Viscosity of polymer causes stress to decrease over time
- Useful parameters for theoretical models

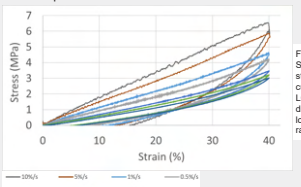


Figure 12: Stress-strain curves for LCE at 7 different loading rates

- Hysteresis decreases at lower strain rates
- Reveals polymer viscosity plays small role at low loading rates

#### Liquid Crystal Orientation

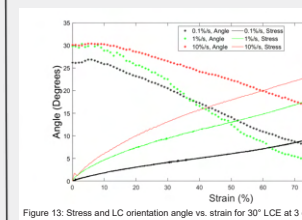


Figure 13: Stress and LC orientation angle vs. strain for 30° LCE at 3 different loading rates

- LC reorientation causes spontaneous deformation within LCE
  - Low stress-strain slope during LC reorientation
- LC reorientation lags behind strain at high strain rates
  - Angle difference between 10%/s and both 1%/s and 0.1%/s increases at larger strains

#### Digital Image Correlation (DIC)

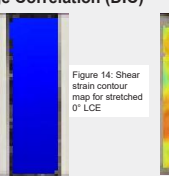


Figure 14: Shear strain contour map for stretched 0° LCE

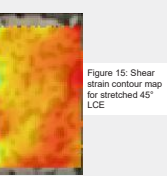


Figure 15: Shear strain contour map for stretched 45° LCE

- 0° LCE shows near 0 shear strain
- 45° LCE shows non-zero shear strain
  - Caused by LC reorientation

### Conclusions

- Test data will serve as parameters for theoretical model
- Stress-strain relation of monodomain LCE is highly dependent on the loading rate and LC orientation.
- DIC and LC orientation data show reorientation of liquid crystals causes shear strain within LCE, leading to spontaneous deformation

### Future Work

- LC reorientation data need to be collected for different LC angles (45°, 60°, etc.)
- Continue testing DIC to obtain more accurate quantitative data
- Develop constitutive model to explain LCE behavior

### References

<sup>1</sup>Staber, J., et al. "Open-Source 2D Digital Image Correlation Matlab Software." *Experimental Mechanics*, vol. 55, no. 6, 2015, pp. 1105-1122. doi:10.1007/s13404-015-0039-7

<sup>2</sup>Frederik, S. V., and E. M. Tsvetanov. "Protophase-Mediated Transition to Nematic Elastomers." *Physical Review E*, vol. 60, no. 2, 1999, pp. 1847-1851. doi:10.1103/PhysRevE.60.021801

<sup>3</sup>Lin, M., et al. "Application of Digital Image Correlation (DIC) to the Measurement of Shear Concentration of a Poly-Diethyl-Hydrogel under LARGE DEFORMATION." *Experimental Mechanics*, vol. 59, no. 7, 2019, pp. 1021-1032. doi:10.1007/s13404-019-00204-4

<sup>4</sup>Melny, Deyan, and Helen F. O'Brien. "Mechanical Deformations of a Liquid Crystal Elastomer at Director Angles between 0° and 90°: Detecting an Empirical Model Encapsulating Anisotropic Nonlinearity." *Journal of Polymer Science Part B: Polymer Physics*, vol. 57, no. 20, 2019, pp. 1367-1377. doi:10.1002/polb.24879

<sup>5</sup>Saad, Mohamed D., et al. "Synthesis of Programmable Main-Chain Liquid-Crystalline Elastomers Using a Two-Stage Thiol-Acrylate Reaction." *Journal of Visualized Experiments*, no. 107, 2016. doi:10.3791/53546

### Acknowledgements

We would like to thank our primary investigator Professor Lihua Jin, our daily lab supervisor Chen Wei, and all the members from the Mechanics of Soft Materials Lab. And thanks to the SURP program for organizing this research experience, and the National Science Foundation and the El Camino College MESA program for funding this project.



## Angela Liu

Chemical Engineering  
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## Integrating data-driven and Mechanistic Approaches in Cell Regulatory Pathway Analysis

FACULTY ADVISOR

Aaron Meyer

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Bioengineering

ABSTRACT

Targeted therapies eliminate cancer cells by inhibiting specific dys-regulated pathways. While these treatments have proven to extend and save lives, drug resistance is a prevalent issue for currently available drugs. Previous work has identified sets of genes in melanoma that are disproportionately expressed in cancer cells that go on to become resistant after treatment with targeted therapy. However, how these genes form a coordinated pathway is not understood. We used a previously proposed non-linear form of gene regulatory network identification to convert perturbation experiments into an inferred pathway for these genes. Extending this work, we developed an iterative matrix solving method, making this algorithm scalable to many thousands of genes and knockdown conditions, along with allowing us to reason about its statistical properties. We applied this model and then analyzed its results to reveal drivers of melanoma drug resistance development. The matrix was visually represented by a weighted directed diagram, which was analyzed for clustering using the Bellman-Ford distance algorithm for pairs of pre-resistant, resistant, and randomized nodes. In total, this work provides a scalable approach to reasoning about the pathway mechanisms revealed in perturbation experiments.

## Integrating data-driven and Mechanistic Approaches in Cell Regulatory Pathway Analysis

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University of California Los AngelesUCLA Samueli  
School of Engineering  
SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

## Introduction

While cancer can be treated using drugs that inhibit dysregulated pathways, resistance to such drugs is a prevalent issue. Previous studies have identified genes that are disproportionately expressed in melanoma cells that were more likely to become resistant when exposed to treatment drugs, as well as those that are disproportionately expressed in known resistant cells. These are referred to as pre-resistant and resistant genes, respectively. However, how these genes form a pathway from pre-resistant to resistant is not understood. This can be tested in perturbation experiments, in which cells are exposed to various compounds and gene expression is recorded to measure the reaction of target genes.

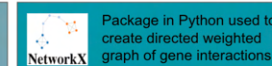
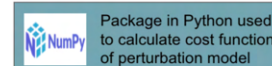


Recent work<sup>2</sup> has indicated that data-driven models for such perturbation studies are a valid way to predict untested interactions, effectively lowering research costs and facilitating large scale studies. Our goal is to build on this work in order to identify and analyze the genetic drivers of melanoma drug resistance for use in combination cancer treatment development. This is achieved by creating and training a model of gene expression in the form of a system of ordinary differential equations.

## Dataset and Tools

The premise of the model is that gene expression can be measured as the level of mRNA produced by target genes and assumed to be at steady-state in order to create an ODE representation of the effects of each perturbation on each gene.

The perturbation data examined came from Torre *et al.*'s melanoma study, which contains 83x84 individual interactions of melanoma cells with various perturbagens. Genes were designated as pre-resistant or resistant based on a comparison of their frequency of NGFR<sup>high</sup> cells and the number of resistant colonies, also from Torre *et al.*



## Perturbation Model

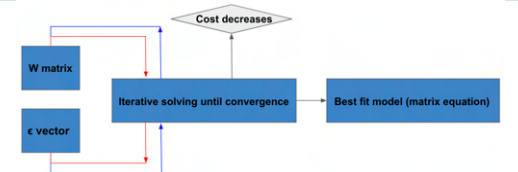
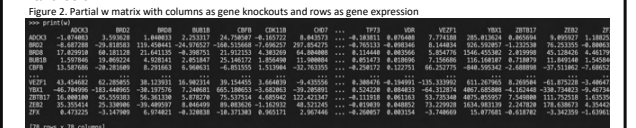


Figure 1. Iterative solving process.

- The **W matrix** is created in Python by importing RNA sequencing data in which the gene expression levels of target genes in melanoma cells were measured after being exposed to various perturbagens. This data is then normalized and any genes with zero expression are removed. The resulting matrix is shown in Figure 1, where each value represents the interaction level between the genes in the corresponding row and column.



- W is a parameter of the **matrix equation** below, the solution of which describes the RNA sequencing data. It is co-dependent with the parameter eta, which is found by taking the average value of each column from the ratio of  $\alpha X$  and  $1 + \tanh(WU)$ .

$$\bar{\epsilon} (1 + \tanh(WU)) = \alpha X$$

- The solution of the matrix equation is found using an **iterative matrix solving method**: starting with a random value of W, we iterate between eta and W, using one to solve for the other until they converge. In each iteration, the model becomes closer to the experimental data, which we quantify using the cost function shown below.

$$\text{cost} = \text{norm}(\epsilon \cdot (1 + \tanh(\omega \cdot U)) - \alpha \cdot D)$$

- The **cost**, or the difference between the model and the data, is calculated in order to quantify how well the model fits the RNA sequencing data.

## Results and Discussion

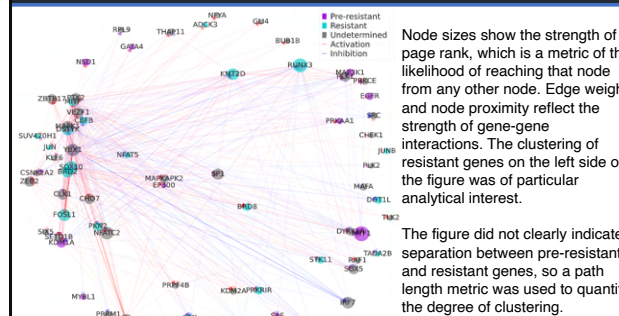


Figure 2. Directed weighted graph displaying gene-gene interactions.

Node sizes show the strength of page rank, which is a metric of the likelihood of reaching that node from any other node. Edge weight and node proximity reflect the strength of gene-gene interactions. The clustering of resistant genes on the left side of the figure was of particular analytical interest.

The figure did not clearly indicate separation between pre-resistant and resistant genes, so a path length metric was used to quantify the degree of clustering.

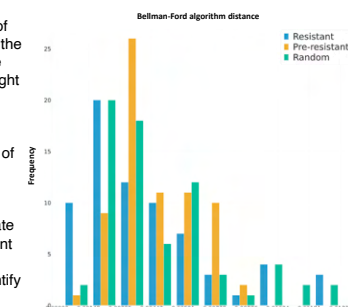


Figure 3. Distribution of Bellman-Ford distance values between pairs of pre-resistant, resistant, and random gene nodes on the network diagram.

Pre-resistant	Resistant	Random
Mean: 4.413E-3	Mean: 4.462E-3	Mean: 4.248E-3

The Bellman-Ford distance algorithm for weighted graphs was used to find the separation in interaction between pre-resistant and resistant nodes. We used the inverse of edge weight so stronger interactions resulted in shorter distances. The distance between randomized pairs of nodes was also calculated for comparison.

The pairs of genes across types turned out to be more closely connected than those within their own type.

## Conclusions

The distribution of distance values suggests that the assumption that pre-resistance and resistance are separate genetic programs is false, or that they each contain multiple pathways. In order to confirm these results, we are working to analyze additional cell lines in hopes of finding patterns in the gene interactions.

Future work includes test the model's ability to predict data it hasn't previously seen by taking away indices and filling back them in while iterating over a fitting function. The results of this function will guide future model improvements.

## References and Acknowledgement

- Torre, E.A., Arai, E., Bayatpour, S. *et al.* Genetic screening for single-cell variability modulators driving therapy resistance. *Nat Genet* **53**, 76–85 (2021). <https://doi.org/10.1038/s41588-020-00749-z>
  - Yuan *et al.* CellBox: Interpretable Machine Learning for Perturbation Biology with Application to the Design of Cancer Combination Therapy. *Cell Systems*, 128–140 (2021). <https://doi.org/10.1016/j.cels.2020.11.013>
- I would like to thank Dr. Aaron Meyer and Farnaz Mohammadi for their supervision and guidance. Additionally, I would like to thank the SURP program for the organizing and funding this research opportunity and for their support.

## Matthew Lopez



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Engineering Freshman, UCLA

# The Risk of Liquefaction and Sea Level Rise on California's Coastal Communities

FACULTY ADVISOR

Timu Gallien

DAILY LAB SUPERVISOR

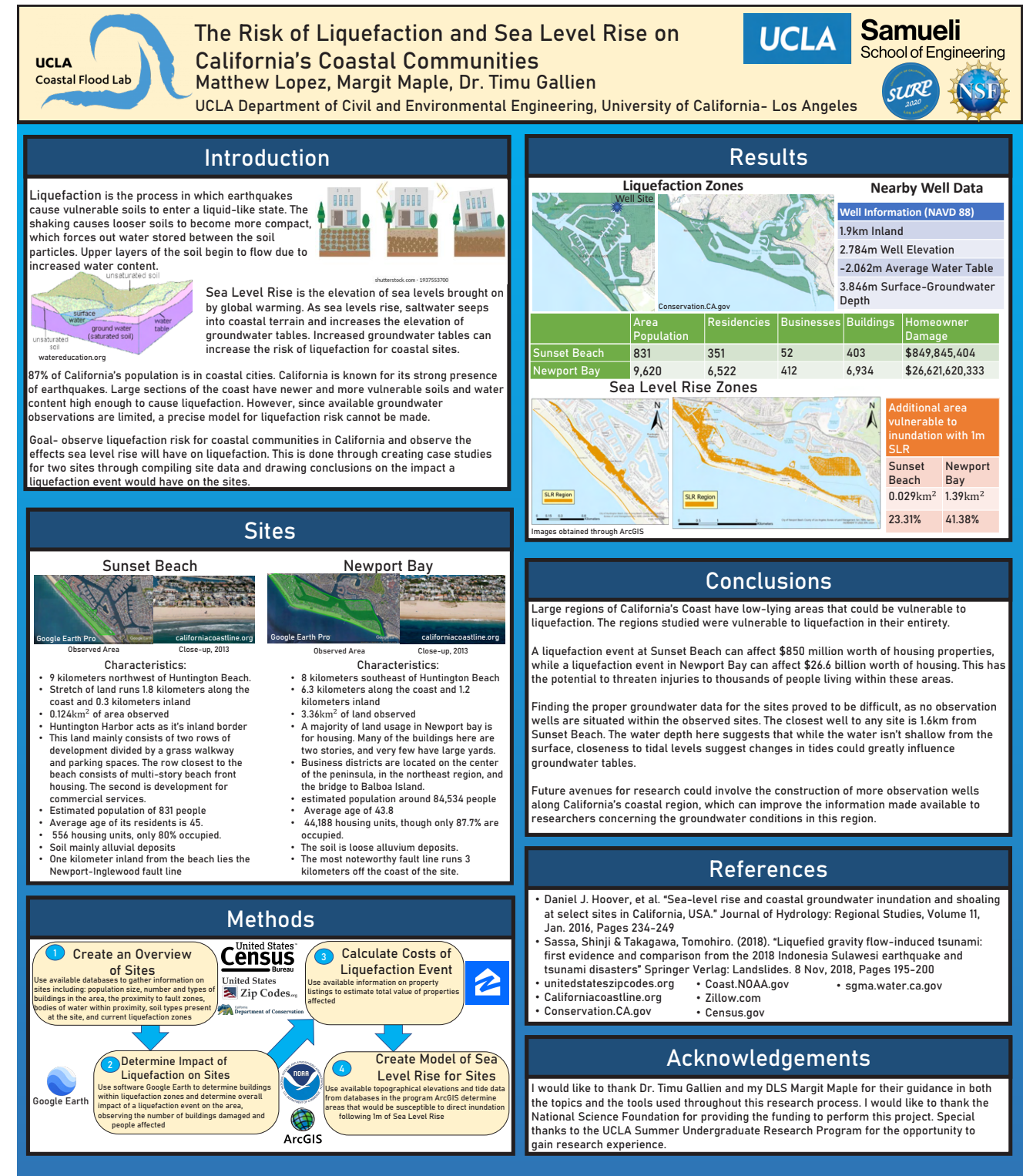
Margit Maple

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Civil and Environmental Engineering

## ABSTRACT

Liquefaction occurs when a high water content soil loses strength during an earthquake and enters a liquid-like state. Sea level rise will elevate local beach groundwater tables and may substantially increase liquefaction risk along the California coastline. Studies have been conducted in Hawaii and Connecticut to understand the combined risk of liquefaction and sea level rise, however studies for the California coastline are limited, as are the publicly available groundwater well data required to make these risk assessments. This research highlights liquefaction risk within specific sites, how sea level rise affects these risks, and considers the impact at various urbanized coastal California sites. Sunset Beach and Newport Beach serve as case studies. Information such as population, number of buildings, and building type are compiled. Geospatial surface terrain data and tidal elevations are then compiled in ArcGIS to create elevation maps for the sites and used to make a general assessment of potential liquefaction damage. For the Sunset Beach site the areas currently within liquefaction zones include 403 buildings and \$849 million in housing while Newport Bay includes 6,934 buildings and \$26.6 billion in value. Limited groundwater data suggests that groundwater tables within the sites are at a moderate depth. This, combined with the extent that SLR could temporarily increase groundwater levels at the sites through direct inundation suggests that these coastal communities may become increasingly susceptible to liquefaction. Study results emphasize the severity of liquefaction risks and highlight the need to monitor local beach groundwater tables and potential liquefaction conditions to reduce current and future threats to infrastructure.





## Arthur Lovekin



Mechanical Engineering  
Junior, UCLA

# Design and Implementation of an Autonomous Weed-Spraying Robot

FACULTY ADVISOR

Khalid Jawed

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Yayun Du

DEPARTMENT

Aerospace and Mechanical Engineering

## ABSTRACT

Precision farming is a hotly pursued field in modern agriculture that seeks to target individual weeds as opposed to entire fields, thereby dramatically reducing the application of herbicide and mitigating the negative impact of herbicides on human and environmental health. In this project we present an autonomous weed-spraying robot which utilizes computer-vision-based navigation and weed-identification algorithms in order to spray weeds with high efficiency for a variety of stages of plant growth. This compact platform is the first (to our knowledge) to autonomously spray row crops such as flax and canola where row spacing is as small as one foot, and offers an inexpensive alternative to larger industrial robots that have difficulties with smaller row spacings. The robot identifies flax plants using an implementation of the YOLOv4 neural network, and uses the plant locations both to navigate and to spray weeds. Furthermore, a novel self-charging station design and sprayer system allows the robot to operate for the entire day. This robot was extensively tested in the flax fields surrounding the North Dakota State University. Preliminary results indicate that the weeds are successfully killed in the center of rows, but they persist immediately next to the cropline where the robot cannot access without trampling the flax. Additionally, further development of the autonomous navigation and weed identification algorithms is needed for dependable performance in the field. However, overall this platform provides a strong basis on which to build a robust platform that could substantially decrease the amount of labor and herbicide required to grow crops, and increase the health of both humans and the environment.

# Design and Implementation of an Autonomous Weed-Spraying Robot



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DLS: Yayun Du<sup>[1]</sup>

PI: Professor M. Khalid Jawed<sup>[1]</sup>

[1] Structures-Computer Interaction Lab, Department of Mechanical Engineering, University of California - Los Angeles

### Background

Precision farming is a hotly pursued field in modern agriculture that seeks to target individual weeds as opposed to entire fields, thereby dramatically reducing the application of herbicide and mitigating the negative impact of herbicides on human and environmental health. Current industrial robots tend to be expensive, and rely on GPS to navigate which is unsuitable for crops with small row-spacings (eg. flax and canola). We seek to fill the niche of small, inexpensive autonomous robots that take an under-canopy perspective of crops with small row-spacings. This versatile platform can increase spraying efficiency for a variety of crops, and ultimately revolutionize the way we produce agricultural products.

### Objectives

Low cost (<\$1000)

Able to travel between 25cm croplines

Full-Day Autonomy

All weather conditions and stages of plant growth

Computer-vision based navigation and plant identification

### Methods

The Robotic Operating System (ROS) is used as a framework to organize each independent process (ie. sensor or algorithm) into a graphical structure. Each independent process is represented by a node which can publish its output (eg. sensor data or algorithm output) to a topic. Other nodes can then subscribe to that topic to use the data. The algorithms were written primarily in Python. The hardware was designed in Solidworks, and manufactured out of 3D-printed PLA or Aluminum.

### Autonomous Charging

What the computer sees

Red Stripe  
Blue Center  
Red Stripe

Contacts

Guided Steering → Contact!

### Field Testing

Location: North Dakota State University experimental flax fields

[Jul 7] "Piggybot"

- Sprayed all fields without getting stuck

[Jul 22] "Franky"

- Improved Nozzle height and spray consistency

[Aug 2] "Jetbot"

- Fully incorporated all sensors simultaneously

[Aug 16] "Turtlobot"

- Improved cameras and camera stabilization

### Robotic Operating System Communication Graph

(1) Herbicide Pumps

(2) Motors With Encoder

(3) Gimbal Moves around to identify and spray weeds

(4) LIDAR

(5) Cameras Raspberry Pi V2

(6) Jetson Xavier

(7) Autonomous Charging

(8) Arduino Uno Connects algorithms and low-level components

Navigation  
Weed Identification

### Results

Weeds are successfully killed in the center of rows, but they persist where the robot cannot access without trampling the flax. Hardware upgrades to address this are under development.

Original Growth

Human Spray

Robot Spray 1

Robot Spray 2

### Conclusions

Overall, great strides have been made towards accomplishing our goal of a robust weed-spraying platform. Through extensive testing we demonstrated that the robot is able to overcome most obstacles despite its small size, and charge itself as needed to operate throughout the day. We are also very close to a framework that can accomplish robust autonomous navigation. Our contribution of a flax and weed library, as well as our hardware successes and failures, will hopefully open the door to scalable automation for under-canopy weeding of a variety of crops.

### Future Work

Multi-herbicide spray

Resilience to rain and large obstacles

Improved navigation and weed-detection

Expand to other crops

### Acknowledgments

Many thanks to my mentors Dr. Yayun Du and Professor Jawed for guiding me in my work, as well as the other SCI Lab undergraduates for always putting in hard work. Additionally, thanks to the Samueli School of Engineering Student Undergraduate Research Program, the US Department of Agriculture, and the National Science Foundation for making this research possible.

### References

[1] "Dino Vegetable Weeding Robot for Large-Scale Vegetable Farms." Naio Technologies, [www.naio-technologies.com/en/dino/](http://www.naio-technologies.com/en/dino/).

[2] Du, Yayun, et al. "A Low-Cost Robot with Autonomous Recharge and Navigation for Weed Control in Fields with Narrow Row Spacing." International Conference on Intelligent Robots and Systems.

[3] Jocher, G. (2020, May). *GitHub - ultralytics/yolov5*. GitHub. <https://github.com/ultralytics/yolov5>

## Quinlan McKnight



Civil Engineering  
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# Presence of Microplastics in Stormwater Wetlands Delays Microbial Methane Production

FACULTY ADVISOR

Sanjay Mohanty

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DEPARTMENT

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## ABSTRACT

Wetland environments are home to biological processes that emit methane - a greenhouse gas that accelerates climate change. Methanogens, methane-producing bacteria, are commonly present in these wetlands that receive stormwater runoff containing a range of contaminants including microplastics (MPs). MPs are known to suppress microbial activity, but their effect on the methanogenesis process and on the diversity of microbial communities in wetland environments remains unknown. To identify the impact of MPs on the methane production from wetland sediments, we performed a series of laboratorial batch experiments where different wetland sediment sizes were exposed to MPs under aerobic and anaerobic conditions while monitoring the production of methane. The batch experiments were kept in incubators at optimum conditions for methane production. Our results show that, under aerobic conditions, large sediments (> 2.0 mm) produced 100 times more methane than fine sediments (< 2.0 mm), possibly due to the decomposition of organic matter present only within large sediments. Under anaerobic conditions, fine particles increased their production by more than 40 times when acetate was present in solution, proving that wetland sediments have the capacity for methane production when nutrients are available. The presence of MPs among fine sediments with acetate caused a delay and suppressed methane production, possibly due to the direct interaction between MPs and methanogens, as well as the indirect interaction between MPs and acetate, as both processes could suppress methane production. Overall, the results furnish the understanding of methane fluxes in relation to microplastic transport in wetland environments.

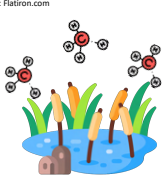
## Presence of Microplastics in Stormwater Wetlands Delays Microbial Methane Production

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Department of Civil and Environmental Engineering – University of California, Los Angeles

UCLA Samueli  
School of Engineering  
SUMMER UNDERGRADUATE  
RESEARCH PROGRAM



### Introduction



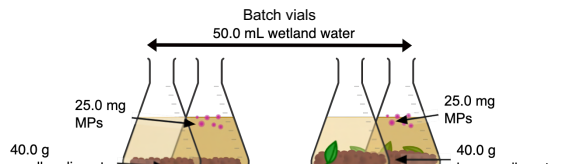
Wetlands (WLs) are biologically diverse environments; however, methanogens (methane-producing bacteria) there are the main source of methane emissions into the atmosphere, a climate change accelerator.

WLs receive stormwater runoff that contain emerging contaminants such as microplastics (MPs). It is known MPs suppress microbial activity, but the effect of MPs on wetland methane production is unknown.

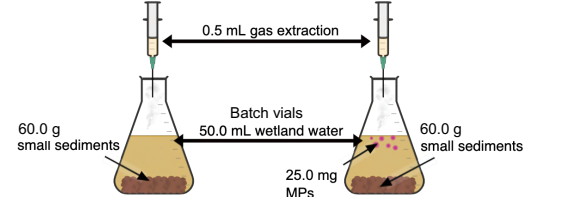
What is the effect of MPs on methane production and microbial communities in wetlands?

### Materials and Methods

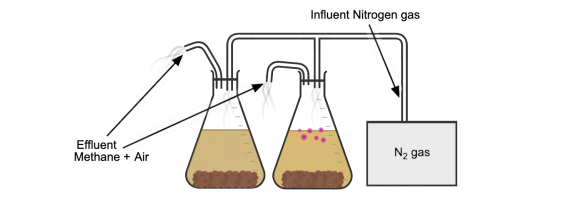
WL sediments were collected from the Ballona Wetlands in Los Angeles, CA. On the same day as collection, sediments were sieved to separate the fine sediments (< 2.0 mm) from large (> 2.0 mm) and used in the following experiments:



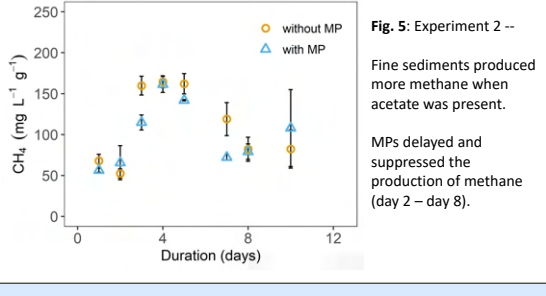
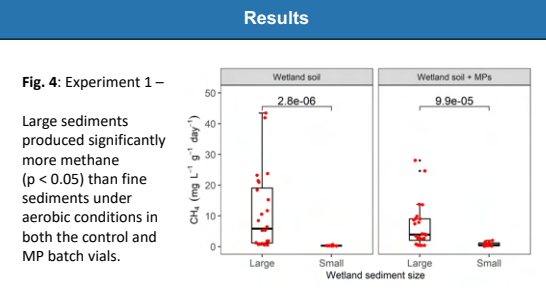
**Fig. 1:** Experiment 1 – Control and MP batch vials containing small or large sediments under aerobic conditions. Vials were kept in an incubator at optimum conditions; gas samples were extracted in the same manner as Fig. 2 to measure methane concentration.



**Fig. 2:** Experiment 2 – Control and MP batch vials containing fine sediments and nutrients (acetate) under anaerobic conditions as achieved by Fig. 3. Vials were kept in an incubator at optimum conditions; gas samples were extracted periodically and analyzed using gas chromatography.



**Fig. 3:** Nitrogen gas purged into batch vials to achieve anaerobic conditions.



### Conclusions

In Experiment 1, the decay of organic matter only present among large sediments may have caused the magnitude difference of methane production. For this reason, future experiments will only utilize small sediments, as the research focus is on microbial production of methane.

In Experiment 2, results suggest that fine sediments have the capacity to produce methane when nutrients are available. MPs delayed and suppressed methane production, possibly due to the direct interaction between MPs and methanogens, and/or between MPs and acetate.

### Future Work

Microbial DNA analysis will be performed on the sediments to connect the varying methane concentrations with bacterial health.

Since rising global temperatures cause wildfire frequency to increase, Experiment 2 will be recreated with wildfire residues to understand the effect of these contaminants on methane production.

### Acknowledgements

Thank you to my Daily Lab Supervisor, Renan Valença, and my faculty advisor, Dr. Sanjay Mohanty, for the invaluable support I have received. Thank you to the Summer Undergraduate Research Program, the Samueli Research Scholars Program, and the Samueli Foundation for this research opportunity.





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# 3D Printing of Anisotropic and Curved Structures

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## ABSTRACT

Direct-ink writing (DIW) 3D printing as a means of fabrication allows for the deposit of viscous fluids to create three-dimensional structures along a computer-guided print path. In this work, 3D-printed anisotropic structures were fabricated by customizing the direction of extruded filament, and the mechanical properties were studied. A polydimethylsiloxane (PDMS) ink mixture was prepared with optimal rheological properties for DIW printing. We tune the printing parameters, such as pressure and print height to reduce various defects such as stretching and overhanging of the extruded filament. A MATLAB script was developed to orient the print direction at any given angle within any convex polygon; print instructions were converted to G-Code using a Python script with the Mocode module. Planar rectangular structures were printed with filaments aligned along the horizontal, vertical, and diagonal directions. Printed structures were subjected to uniaxial tensile tests and stress-strain curves were obtained for quasistatic loading and unloading. Results suggest that the stiffness has a strong dependence on the print angle. Methods used here, specifically G-Code creation, will facilitate the fabrication of active morphing structures by DIW printing of Liquid Crystal Elastomers (LCEs) in the future.

## 3D Printing of Anisotropic and Curved Structures

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### Introduction

- Direct-Ink Write (DIW) 3D printing allows for fabrication of structures with complex geometries by the extrusion of soft, viscous material
- G-Code is a programming language that directs every aspect of 3D printing, including:
  - Printhead Translation (Direction, Speed)
  - Extrusion (On/Off, Filament Speed)
  - Controlling Accessories (LEDs, UV add-ons, etc.)
- By directing the exact print path of a structure, we can custom-tailor their mechanical properties, stiffness in particular

Fig 1: Visual depiction of direct-ink writing (DIW) 3D printing showing three methods of plunger displacement: air pressure, mechanical piston, and screw

### Objectives

- We aim to develop a new method for custom G-Code creation for future planned investigation of DIW 3D printing of stimuli-responsive materials
- We aim to print and collect stress-strain data from polydimethylsiloxane (PDMS) structures to determine the relationship between the elastic modulus and print direction.

Fig 2: Molecular diagram of Polydimethylsiloxane (PDMS) Retrieved from <https://www.sigmaaldrich.com/US/en/product/us/1546300>

### Materials

- Aether 1.3D Printer for fabrication of specimens
- Fisher Scientific IsoTemp Oven for curing of specimens
- Polydimethylsiloxane (PDMS) ink for 3D printing
- G-Code creation package Mocode for Python (Spyder IDE)
- G-Code visualizer and editor NCViewer
- MATLAB for print path calculation
- INSTRON Universal Testing System for tensile testing
- Microsoft Excel for data analysis

Fig 3: Aether1 3D Bioprinter

### Methodology

### Results

Sample	Print Angle	Elastic Modulus (Pa)	R Square
A	0 - 0	1281485.006	0.999702
B	$\pi/6 - \pi/6$	1067055.044	0.999248
C	$\pi/4 - \pi/4$	1065559.251	0.999754
D	$\pi/3 - \pi/3$	1058618.58	0.999604
E	$\pi/2 - \pi/2$	1039713.25	0.999725
F	0 - $\pi/2$	1223315.652	0.999149
G	0 - $\pi/4$	1034571.41	0.997586
H	$\pi/2 - \pi/4$	829735.1743	0.998977
I	$\pi/6 - 0$	1178445.397	0.999555
J	0 - $\pi/6$	1186444.183	0.999762
K	0 - $\pi/3$	1183771.673	0.999769
L	$\pi/4 - \pi/6$	1118836.668	0.999908
M	$\pi/4 - \pi/3$	1188119.291	0.999602

Fig 4: Bilayer print parameters of rectangular samples and their associated Young's modulus

Fig 5: G-Code Visualization of bilayer rectangular structure with 0 -  $\pi/2$  print path as viewed from above and in isometric view

Fig 6: G-Code Visualization of Archimedean spiral

Fig 7: Printed rectangular bilayer structures. Samples are labeled according to parameters in Fig 1

Fig 8: Printed Archimedean spiral

Fig 9: Young's modulus of rectangular samples printed at 30 psi (Samples A-H, from left to right)

Fig 10: Stress-Strain curves from samples with highest and lowest elastic modulus

### Conclusion

- Our results suggest that print angle with respect to the direction of load will impact the elastic modulus.
  - A print path parallel to the direction of load will result in a higher elastic modulus, and a path normal to the direction of load results in a lower elastic modulus
- At higher pressures, where uncured filaments begin to fuse together, print path becomes less impactful to the stiffness of a printed sample
- G-Code creation will allow us to create much more complex prints in the future using stimuli-responsive materials (taller prints, printing on 3D molds, multi-material printing). Future prospects include creating a more efficient program that will forego the need to edit G-Code after it is created in Python.

### Acknowledgements

I would like to thank Professor Lihua Jin and the members of the Mechanics of Soft Materials Lab for welcoming me into their lab space and allowing me to work and learn alongside them. I would like to extend special thanks to Shivam Agarwal for guiding me through this project and preparing a MATLAB script for the creation of various print paths.

Thank you to the UCLA Summer Undergraduate Research Program for giving me the experience of formally presenting work to program staff and my peers.

I would also like to thank the National Science Foundation for their generous funding of my participation with the MSM Lab this summer.

### References

- Bae, Jinhye (2021/07/09). Structure-Mechanical Property Relationships of 3D-Printed Porous Polydimethylsiloxane. ACS Applied Polymer Materials. 3, 3496-3503. doi: 10.1021/acsapm.1c00417
- Rezayat H, Zhou W, Siriruk A, Penumadu D, & Babu S. S. (2015). Structure-mechanical property relationship in fused deposition modelling. Materials Science and Technology. 31(8), 895-903. <https://doi.org/10.1179/1743284715y.0000000010>



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# Camera-based Heart Rate Estimation Focused on Mitigating Bias

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## ABSTRACT

The COVID-19 pandemic has led to an influx of telehealth appointments, causing difficulty in assessing vital signs virtually. Our work focuses on remote photoplethysmography (R-PPG), the concept of measuring heart rate using color fluctuations in the face. Many different algorithms already exist with varying levels of success; however, one major gap is the lack of performance of these existing algorithms on darker skin tones, which, given the prevalence of cardiovascular disease in African American communities, creates a pressing issue. We have employed a VGG-style convolutional network known as DeepPhys to learn different spatial masks and increase robustness across the board. My work has focused on improving this existing network to increase medical accuracy by manipulating the structure of the network along with training parameters.

# Camera-based Heart Rate Estimation Focused on Mitigating Bias

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### Introduction

There has recently been a notable influx in telehealth visits due to the COVID-19 pandemic. While telehealth has created a way to provide patient care remotely, it is extremely difficult to assess vital signs such as heart rate, breathing rate, etc., indicating that there is clearly a need for contactless heart rate sensing solutions. While there are existing computer vision solutions available, they exhibit a bias against darker skin tones.

### Key Concepts

**Remote Photoplethysmography (R-PPG)**

- Type of algorithm focused on using subtle color variations in the face to measure a blood volume pulse and, consequently, estimate heart rate.

**Convolutional Neural Network**

- A computer system modeled on the human brain and nervous system, specifically focused on mimicking the optic nerve and image processing

### Objective

I aim to implement an improved computer vision model for measuring heart rate using deep learning. My goal is to increase performance specifically on darker skin tones.

### VITAL Dataset

Vital-sign Imaging for Telemedicine AppLications developed by Visual Machines Group at UCLA

- At least 432 videos of 54 subjects
- Focus on a diverse dataset in terms of gender, race, age, skin tone, etc.
- Using two different camera angles and four different lighting conditions with only a smartphone camera

I will be working to train the algorithm on this dataset in order to ensure optimal performance across the board.

Figure 1. Experimental Setup for creation of VITAL dataset

### Proposed Algorithm

My proposed algorithm will build off the existing DeepPhys algorithm developed by W. Chen and D. McDuff consisting of:

- A VGG-Style Convolutional Neural Network (up to 19 layers)
- Learns spatial masks for regions of interest to maximize performance and robustness
- Emphasis on diffuse component, ignoring the mirror-like reflections of the skin
- Uses two streams: Motion and Appearance in order to maximize performance

This algorithm was able to improve performance with motion and talking. However, there is still a bias in terms of skin tone. My proposed changes will be to the structure of the model to hopefully improve performance across the board. I plan on doing this by using different activation and loss functions and observing the results.

Figure 2. Proposed Algorithm Structure Using Both Appearance and Motion Streams to Increase Robustness

### Conclusion and Results

Activation/Loss Function Combination	Mean Absolute Error (bpm)
rrelu/softmaxloss	18
tanh/MSE	13.166
selu/pearson	12.73
relu/MSE	12.57
relu/L1Loss	12.57
rrelu/MSE	11.257
rrelu/L1Loss	11.257
rrelu/pearson	11.251

This work furthers previous algorithmic advances such as the existing DeepPhys algorithm to increase accuracy. We can see that regardless of loss function, the relu activation function creates the best results. However, there is still a large margin of error, which needs to be corrected. This work can also be extended outside of the medical realm into reducing bias in other computer vision applications such as facial recognition, etc.

### References

- Chari, Pradyumna, et al. "Diverse R-PPG: Camera-Based Heart Rate Estimation for Diverse Subject Skin-Tones and Scenes." *ArXiv*, 2020. <https://arxiv.org/pdf/2010.12769.pdf>
- Chen, Weixuan, and Daniel McDuff. "DeepPhys: Video-Based Physiological Measurement Using Convolutional Attention Networks." *ArXiv*, 2018, <https://arxiv.org/pdf/1805.07888.pdf>

### Acknowledgements

We would like to thank the UCLA Summer Undergraduate Research Program for organizing this research internship and the Samueli Research Scholars Program for funding it. We would also like to thank the UCLA Fast Track to Success Electrical and Computer Engineering Program for their continued guidance and support. I would also like to thank Pradyumna and Professor Kadambi for challenging me and creating such a supportive and creative atmosphere for learning.



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## Internet of Things (IoT) Technology for Electrowetting-on-dielectric (EWOD) Devices

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### ABSTRACT

Electrowetting-on-dielectric (EWOD) is a mechanism that enables the manipulation of droplets through electrical signals alone. Due to its advantages for droplet-based microfluidics, such as the simplicity in both device design and fabrication, EWOD has demonstrated its utility in numerous biochemical and biomedical applications, especially lab-on-a-chip. However, currently the EWOD technology is being utilized by only a small number of labs who have proper engineering backgrounds, enough resources to design and fabricate devices to fulfill their goals, and control systems and software to operate the devices. To combat this barrier, the UCLA Micro and Nano Manufacturing Laboratory is developing a cloud-based cybermanufacturing platform for common users to gain easy access to the EWOD technology. In furthering the mission, the lab is exploring a remote operation of the EWOD control system by introducing an Internet of Things (IoT)-based intermediate system. This remote operation will serve as a gateway to an envisioned lab-on-cloud that will help democratize EWOD technology. Acting as a broker for information exchange between a backend server and EWOD control system, the intermediate system is designed to run users' instruction files, communicate its messages to the EWOD control system, and operate alongside a camera for users to remotely monitor their experiments. My work has involved developing a proof-of-concept demonstration that one can operate an EWOD control system by sending the necessary commands from a remote location.



## Internet of Things (IoT) Technology for Electrowetting-on-dielectric (EWOD) Devices

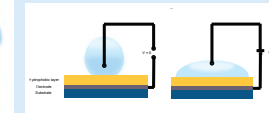
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### Introduction and Background

In digital microfluidics, **electrowetting-on-dielectric (EWOD)** is a mechanism that permits the manipulation of droplets through electrical signals alone. EWOD has several biochemical and biomedical applications due to its advantages, such as its simplicity in device design and fabrication. A principal EWOD application is **lab-on-a-chip**. Typical lab-on-a-chip advantages include lower fluid volume consumptions and faster response times for experiments.

However, EWOD technology is only being used by a small number of labs who possess: proper engineering backgrounds, enough resources to design and fabricate EWOD devices, and the proper control systems and software to operate these devices. To help democratize the technology, the UCLA Micro and Nano Manufacturing Laboratory is developing a cloud-based, **EWOD cybermanufacturing platform** where users' can translate their design ideas into manufactured digital microfluidic devices.

My role in the project involved integrating **Internet of Things (IoT)** technology (where experiments are driven through issuing commands over the internet) to enable remote access to the lab's EWOD control systems. IoT access will serve as a gateway to an envisioned lab-on-cloud. Furthermore, in the future it can help onboard new users to the platform who prefer to obtain EWOD devices upfront.



**Figure 1.** Science of EWOD: A beaded droplet on a repellent surface can become wetted when voltage is applied. This mechanism is used for droplet manipulation.



**Figure 2.** Example of a common (not EWOD) microfluidic chip used to perform lab-on-a-chip research manipulation.



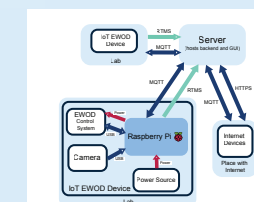
**Figure 3.** Image of EWOD device in EWOD control system and operated via graphic user interface (GUI) developed in Prof. CJ Kim's lab.

### Materials and Methods

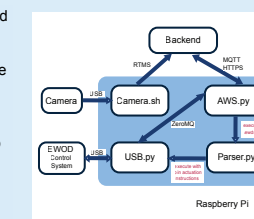
**Materials** needed for the IoT project are: the EWOD control system, a Raspberry Pi (microcomputer), and a USB webcam (imaging module).

Proposed **system architecture** (designed by Leo Wang and Brian Cheng, Figure 4): The EWOD control system communicates with the Raspberry Pi through a USB connection. The Raspberry Pi acts as an intermediate device or broker for information exchange between the EWOD control system and server hosting the backend and GUI. Desired internet devices are further connected to this server.

Proposed **Raspberry Pi architecture** (designed by Leo Wang and Brian Cheng, Figure 5): An intermediate device is needed for IoT applications since it has a static IP address. The Raspberry Pi was chosen as our intermediate device since it already has a USB port, and it can simultaneously run multiple programs and processes. The Raspberry Pi is programmed to carry out various tasks, including sending and receiving information between the backend and EWOD control system, sending information to Amazon Web Services (AWS) for IoT, parsing EWOD files (instructions for droplet actuation), and operating with a USB webcam.



**Figure 4.** Overall architecture illustrating inter-process communication for the system (designed by Leo Wang and Brian Cheng).

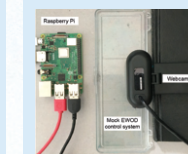


**Figure 5.** Raspberry Pi architecture exhibiting device's functions (designed by Leo Wang and Brian Cheng).

### Results

We were able to begin a proof-of-concept demonstration that one can operate an EWOD control system by sending commands from a remote location.

The mock experimental setup consisted of a USB webcam, Raspberry Pi, and mock EWOD control system. We used **Motion**, a software package which is designed to monitor cameras and security devices, with the Raspberry Pi to network a video stream via **HTTP**. We tested to see how the camera would pick up on droplets and their movement and verified that we can transmit video through the Raspberry Pi.



**Figure 6.** Image of mock EWOD control system and camera experimental setup for remote droplet viewing.

**Figure 7.** Code to operate Motion with the Raspberry Pi. Code using FFmpeg to convert video stream to a format that can be sent over RTMPs to the backend.



**Figure 9.** Example of test code written to send commands regarding droplet splitting.

### Conclusions and Future Work

Overall, we began a proof-of-concept demonstration for remote operation of an EWOD control system by testing USB camera integration with the Raspberry Pi and the capabilities of AWS IoT. The full proof-of-concept code is still in the process of being tested with the Raspberry Pi and the EWOD control system in the lab. **Future work** will expand on the proof-of-concept and involve more functionalities, such as parsing an EWOD instructions file. Moreover, a one-to-many design for the system will be implemented, such that one Raspberry Pi may control multiple EWOD control systems.

### References

- [1] X. Huang, C.-C. Liang, J. Li, T.-Y. Ho and C.-J. Kim, "Open-Source Incubation Ecosystem for Digital Microfluidics — Status and Roadmap: Invited Paper," 2019 IEEE/ACM International Conference on Computer-Aided Design (ICCAD), 2019, pp. 1-6. doi: 10.1109/ICCAD45719.2019.8942172.
- [2] J. Li, S. Chen, and C.-J. Kim, "Low-Cost and Low-Topography Fabrication of Multilayer Interconnections for Microfluidic Devices", Journal of Micromechanics and Microengineering, Vol. 30, No. 7, May 2020, 077001.
- [3] [https://stock.adobe.com/search?k=micro%20fluidic&search\\_type=longtail-carousel-view-results](https://stock.adobe.com/search?k=micro%20fluidic&search_type=longtail-carousel-view-results)

### Acknowledgements

I would like to thank Dr. CJ Kim, Leo Wang, and Brian Cheng at the Micro and Nano Manufacturing Laboratory for sharing their work and guiding me through this project. I extend further thanks to the National Science Foundation for funding this project (Award No. 1720499) and UCLA's Summer Undergraduate Research Program.



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# A Process for Implementing Accessible Cardstock-made Robot Cars Equipped with A Variety of Robotic Behaviors

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**ABSTRACT**

As the world rapidly turns to robots, it is important to make robot creation ubiquitous, but there are barriers – accessibility and limitation of resources – that inhibit such phenomena. In this study, we proposed and tested a possible solution that can lessen those barriers by building origami robots made with accessible resources. Origami is defined as the Japanese art of folding. To test our hypothesis, we implemented a process that fabricates origami robot cars made from single-layered materials like cardstocks while ensuring that these cars can still carry out several robotic behaviors. The process includes gathering accessible hardwares, programming behaviours using Arduino, designing the origami-inspired body of the car using LEMUR's RoCo, and testing the car to determine if its origami-structure can handle the programmed robotic functionalities: driving on a variety of surfaces, using differential and pivot steering, detecting obstacles, implementing PID control through IMU and visual sensors, and enabling communication with other robots through mesh networking. The scheme yielded robot cars that are useful and fairly accessible with cardstock-made bodies and with a variety of robotic behaviours as mentoned above. The result of our study justifies that the implementation of origami robots has a huge potential in terms of lessening the resource-related barriers of robot creation which increases both the number of people who can build robots and the probability of robot creation being ubiquitous.

UCLA

Samueli  
School of Engineering

SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

# ORIGAMI ROBOTS:

A Process for Implementing Accessible Cardstock-made Robot Cars Equipped with A Variety of Robotic Behaviors

Jillian Naldrien Pantig | Dr. Ankur Mehta

The Laboratory for Embedded Machines and Ubiquitous Robots



**GOAL**

To lessen the barriers to robot creation, **accessibility and limitation of resources**, by implementing a process that fabricates origami robot cars made from cardstocks while ensuring that these cars can still carry out several robotic behaviors.

## AN ACESIBLE ROBOT COMPILER

RoCo: Robot Compiler

Generate custom 2D patterns for paper-based, sensor-rich, or metal

Paper Models: Paperbot, BeetleBot, CaneBot, Tug

Wood Models: [Image]

One of the main resources used in this study is **UCLA LEMUR'S RoCo**, which stands for Robot Compiler.

## PROCESS

### 1 GATHER MATERIALS

accessible hardware

cardstock

### 2 DEVELOP FUNCTIONALITIES

FUNCTIONALITIES

MOVEMENT: Differential and pivot steering

SWARM CONTROL: Mesh Networking

FEEDBACK CONTROL: IMU, Lidar, and Vision

an example of how the hardware will be assembled to fit the functionalities

- LIDAR SENSOR
- PROTO BOARD
- IMU SENSOR
- ESP32 BOARD
- SERVO MOTORS
- MOTOR SHIELD

### 3 DESIGNING CAR'S BODY (ROCO)

DRAW AND MEASURE

CUT

CODE

GENERATE

INTEGRATE AND ASSEMBLE

## TESTING AND RESULTS

**ACTUATION**

**REACT APP – DASH**

- CONTROLLING THE CAR USING A JOYSTICK + SEEING DATA FROM THE CAR (E.G., SENSOR DATA)

Assisted Autonomy Dashboard

IMU YAW VALUES CAR JOYSTICK LIDAR TOF VALUES TOF VS TIME GRAPH

**FEEDBACK CONTROL**

**INERTIAL MEASUREMENT UNIT**

- TO MAKE THE CAR DRIVE STRAIGHT (PID)

cars not driving straight

Corrected using IMU PID

**LIDAR**

- USED FOR OBSTACLE DETECTION.

detects obstacle less than 100mm – car stops

does not detect obstacle – car moves

**VISION**

- FOR PID, OBSTACLE DETECTION, AND FOLLOWING

green car with a camera follows red blob (red cup) from a car that is being controlled with a joystick

**SWARM**

- GETTING INSTRUCTIONS FROM ANOTHER MICROCONTROLLER

microcontroller with camera from above controls cars to go to target April tags

**CONCLUSION**

This study has accomplished the following:

- Lessened the barriers to robot creation by using accessible and efficient resources – cardboard and hardware that can function in many ways
- Established a process of testing origami robots through actuation, feedback control, and swarm
- Allow for robot creation in several areas: academic and entertainment

**FUTURE PLANS**

- Adding and designing more objects such as a robotic arm
- Making the process low-cost such that it can yield robots that cost less than \$20

**ACKNOWLEDGEMENT**

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REFERENCES

Designing One-Dollar Robots: An Integrated Design and Fabrication Strategy for Embedded Mechanical Systems

November 18, 2020



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Fabrication of 3D Printed Thermoplastic Polyurethane Lattices via Fused Deposition Modeling

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ABSTRACT

Thermoplastic polyurethane (TPU) is a class of material that combines the desirable elastic properties of rubbers with the ease of manufacturing of plastics, and are widely used in various industries sectors. The objective of this study is to fabricate TPU lattice structures as light-weight energy-absorbing materials by fused deposition modeling (FDM) 3D printing. Since the extrusion of TPU from the nozzle and adhesion on the surface is fraught with challenges, dog-bone samples were first printed to characterize the correct printing parameters, such as temperature, printing height, and printing speed. It was observed that increasing the print temperature and reducing the extrusion rate improve the print quality, (i.e. reduction in missing material, burning and clogging). To further print TPU lattices full of overhanging structures, water-soluble Polyvinyl alcohol (PVA) is used as the supporting material. Unit cells of an octet truss lattice were printed, and it was found that by increasing layer thickness, disabling retraction, and enabling sacrificial nozzle wiping structures provide the best prints.

Fabrication of 3D Printed Thermoplastic Polyurethane Lattices via Fused Deposition Modeling

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SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

Introduction

Thermoplastic polyurethane (TPU) is a polymer that combines the highly elastic properties of rubber with the ease of manufacturing of plastics<sup>1</sup>.

However, to maximize the energy absorbing properties of TPU, it is essential that it can be printed into complex lattice structures with ease. Specifically, it is important that it can be printed into an octet truss lattice, which is an ideal structure for energy absorption.

Prior research has primarily focused on either the constitutive material properties of TPU itself or on the properties of different lattice structures, but has yet to concentrate on the ideal manufacturing methods used to create TPU lattices.

Objective

The objective of this study is to reliably fabricate TPU lattice structures as light-weight energy-absorbing materials by fused deposition modeling (FDM) 3D printing.

Fused Deposition Modeling

Fused deposition modeling (FDM) is a 3D printing technology whereby a solid filament is pushed through a heated chamber, melted, and extruded onto a build plate. By the incremental layering of the material on top of itself, FDM allows a user to create complex forms in three dimensional space.

To print lattices full of overhanging structures, water-soluble Polyvinyl alcohol (PVA) is used as the supporting material and is subsequently dissolved leaving the TPU behind.

Unlike more common 3D printable plastics, TPU is fraught with challenges. TPU is not only highly sensitive to the print temperature, but it is also hygroscopic. Additionally, subsequent layers of TPU tend to have difficulty adhering to the previous layer.

Dog-Bone Samples

**Printing**  
Dog-bone samples were first created to characterize the optimal printing conditions before creating larger 3D structures. In order to find these conditions, multiple dog-bone samples were produced each with different printing parameters. More than twelve parameters including layer height, printing speed, and printing temperature were varied to hone in on the optimal printing parameters.



Figure 1: Dog-bone sample

**Results**  
By varying the print conditions and printing multiple samples, it was observed that increasing the print temperature and reducing the extrusion rate were the primary factors in improving the print quality, (i.e. reduction in missing material, burning and clogging).

Annealing Samples

Annealing

Annealing is the process by which a sample is raised to an elevated temperature (below the melting point) for a prolonged period of time. This is done to reduce internal stress, reduce printing defects, and improve the stress-strain characteristics of the TPU dog-bone samples<sup>2</sup>. To explore annealing on 3D printed TPU, a pair of reference dog-bone samples, a pair of samples annealed at 70°C for twelve hours, and a pair of samples annealed at 160°C for twelve hours, were stretched to 30% strain using an Instron five times.

Results

Annealing the print for twelve hours at 70°C seemed to yield the greatest improvement in the energy absorbing characteristics of the sample.

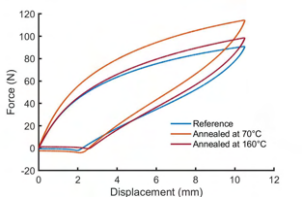


Figure 2: Tensile Testing of Annealed Samples

The energy dissipated within the first cycle of the samples annealed at 70°C was 28.13% greater than the reference. The energy dissipated within the first cycle of the samples annealed at 160°C was 4.48% greater than the reference.

Octet Unit Cell Samples

Printing

Using the print settings from the dog-bone samples as a starting point, octet truss unit cells were printed. Due to the necessity of PVA in order to support the overhangs of the octet truss, a new set of printing conditions would be required. To find these optimal conditions, a similar series of parameters were varied the addition of unit cell density as well as new sacrificial structures to help ease the transition between printing PVA and TPU.

Results

By varying the print conditions and printing multiple samples, it was found that by increasing layer thickness, disabling retraction, increasing density, and enabling sacrificial nozzle wiping structures provide the best prints. All of these factors created a reliable method for making unit cells as small as 10 mm<sup>3</sup>.

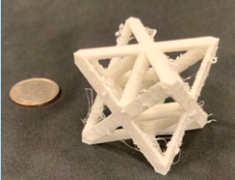


Figure 3: 30mm³ unit cell sample

Octet Lattice Samples

Printing Lattices

Using the same optimized print settings as the unit cell resulted in a reliable method for printing larger lattices. Additionally, these lattices printed well at smaller unit cell sizes due to the added stability of the neighboring cells.

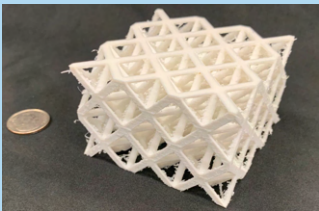


Figure 4: Octet truss lattice

Findings

Conclusion

In optimizing the print quality of both the dog-bone and unit cell samples, it is clear that a denser lattice made from thick layers is ideal for producing high quality FDM prints. It is also evident that using sacrificial structures to prime and clean the print nozzle between printing TPU and PVA significantly improve the quality of the final lattice.

Future Work

The next steps in studying TPU lattices would be to focus on quantifying the energy absorbing properties of the lattice via compression testing. It is also important to look at how the structure of the lattice (whether it is periodic or aperiodic or it is bending or stretching dominant) affects the properties of the lattice. This can further be extended to an analysis of the behavior of randomly generated stochastic lattices.

References

- <sup>1</sup> Qi, H.J., and M.C. Boyce. "Stress-Strain Behavior of Thermoplastic Polyurethanes." *Mechanics of Materials*, vol. 37, no. 8, 2005, pp. 817-839., doi:10.1016/j.mechmat.2004.08.001.
- <sup>2</sup> Amirkhosravi, Mehrrad, et al. "Designing Thermal Annealing to Control Mechanical Performance of Thermoplastic Polyurethane Elastomers." *Polymer*, vol. 214, 2021, p. 123254., doi:10.1016/j.polymer.2020.123254.

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I would like to thank both Dr. Lihua Jin and Shivam Agarwal for taking the time out of their schedule to teach me, to mentor me, and to guide me in creating this research project. Without there support, none of this would have been at all possible. I would also like to thank Mr. William Herrera and the entire SURP program for providing their professional guidance and expertise throughout the entirety of the program.

## Samantha Rafter



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## Optimization of Double Ridge Metasurface for Quantum Cascade External Cavity Laser

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### ABSTRACT

Terahertz light has demonstrated the ability to identify complex molecules via spectroscopy. However, its potential to do so has been largely untapped due to a lack of capable, broadband, non-dispersive sources. The double ridge design of the metasurface is a viable path toward bridging this gap by broadening the amplification bandwidth of metasurfaces, which may then be used to create widely tunable quantum cascade external-cavity lasers with low group delay dispersion (GDD). The design consists of repeating units of two differently sized ridges, each of which corresponds to a resonant frequency, at which there is a peak in reflectance (a measure of the amplification of light). Altering the widths of the ridges and the separation between them allows for manipulation of the resonant frequencies so that they are near each other, creating a continuous range of frequencies where amplification is high. Previously, the ridge widths and separation of the ridges were determined by running simulations where tested dimensions were manually decided by the user, who would then analyze the collected data to determine favorable geometries. To more efficiently and accurately find a geometry that could be considered optimal, MATLAB functions representing broadband reflectance and GDD were written in order to quantify the values to be optimized. The simulation software COMSOL Multiphysics as well as its associated optimization module were then used with these functions to create and run optimization studies that determined the geometry of the ridges that minimized dispersion while maintaining broadband reflectance. Initial results suggest that GDD could be improved upon by 1.72% while maintaining the same broadband performance as a previous design, and could be improved upon by 7.48% at a slight cost (0.125 THz) to the bandwidth.

## Optimization of Double Ridge Metasurface for Quantum Cascade External Cavity Laser

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### Introduction & Background

#### Key Terms

- Reflectance:** Ratio of Power Out : Power In
- Dispersion:** Separation of light based on frequency/wavelength; typically undesirable in optics

#### Previous Research

- Double Ridge Metasurface:** Amplifying reflector
- Composed of repeating units of 2 differently sized ridges, the widths of which determine the locations of resonant frequencies
- Viable design for pairing with output coupler (Fig. 1(a)) to achieve a widely tunable Vertical External Cavity Surface Emitting Laser (VECSEL) with low dispersion

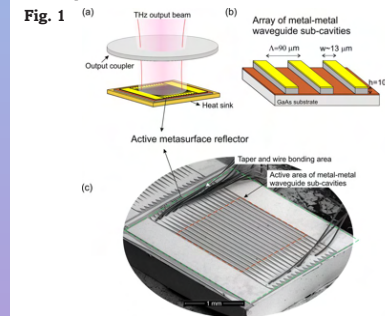


Fig. 1 (a) Shows the structure of a VECSEL. (b) Shows the composition of a metasurface, while (c) shows its structure

### Objective

#### Gaps in Knowledge

- Previously, broadband designs were found by running simulations using user-defined inputs for the ridge widths, then analyzing collected data to find optimal geometries with broad ranges of high reflectance.
- However, this process is time consuming and imprecise, since geometries between step sizes are not tested.

→ There is significant room for improvement in finding a more accurate, optimized geometry for a metasurface with broad amplification

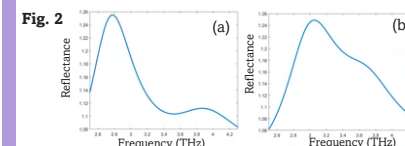


Fig. 2 (a) Shows the two resonant frequencies of a double ridge metasurface (b) Shows a user optimized design where ridge widths were altered in order to bring the peak frequencies nearer to each other, creating a broad range over which there is high reflectance

#### Objective

Utilize simulation software to automatically find an optimized geometry of the double ridge design that minimizes dispersion while maintaining broadband reflectance.

### Materials

COMSOL Multiphysics  
COMSOL Optimization Module  
MATLAB

### Methods

- Study relationships** between parameters and figures of merit by running simulations with varying ridge widths and spacing to better understand effects of changing the geometry, and to find a good starting point for optimizing.
- Create optimization infrastructure** within COMSOL. Begin by creating MATLAB functions to quantify GDD and broadband reflectance. Set ridge widths and spacing as control variables and set the study to minimize the GDD MATLAB function. Decide and set a constraint so that the solution must meet a certain broadband reflectance requirement.
- Collect and analyze data.** Run the optimization study using viable algorithms and improve parameters/constraint/starting point as necessary. Conduct further testing of promising geometries.

### Results - Qualitative

General optimization infrastructure was created, and insights into the workings of the optimization module were gained.

COMSOL begins by collecting data for every frequency step (1), then exports this data to the MATLAB functions (2). These functions return values to COMSOL (3), which then analyzes the data and alters the control variables in an attempt to improve the objective.

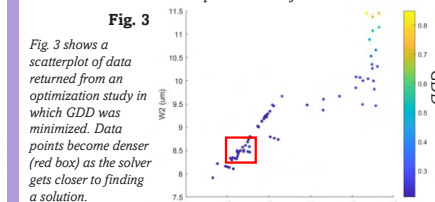


Fig. 3

Fig. 3 shows a scatterplot of data returned from an optimization study in which GDD was minimized. Data points become denser (red box) as the solver gets closer to finding a solution.

### Results - Quantitative

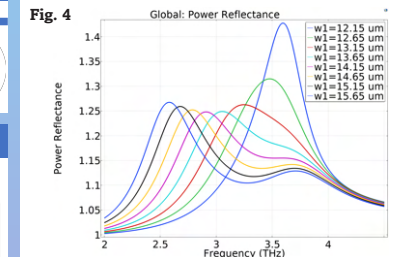


Fig. 4 Shows the reflectance plots of a design where the 2nd ridge width is fixed at 9.45 um, while the 1st ridge width is altered. As the 1st ridge gets wider, its resonant frequency moves to the right. The starting point for optimization was chosen to be a design with even spacing, where ridge 1 = 13.65 um and ridge 2 = 9.45 um (See step 1 of methods).

#### Fig. 5

Fig. 5 (a) Shows the reflectance plots of the baseline design (Ridge 1: 13.65 um, Ridge 2: 9.45 um, even spacing) in red, and a design optimized for GDD (Ridge 1: 12.69 um, Ridge 2: 9.13 um, even spacing) in blue.

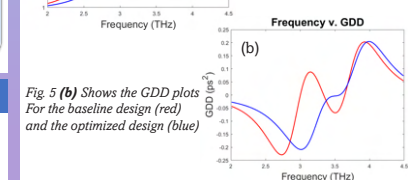


Fig. 5 (b) Shows the GDD plots for the baseline design (red) and the optimized design (blue)

### Conclusions

A design optimized for GDD was found that improved the maximum, absolute value of GDD from the baseline design by 8.89% (Fig. 5 (b)). This design maintains a relatively wide bandwidth that is 0.2 THz narrower than the baseline, decreasing its bandwidth by 16.26% (Fig 5 (a)). More generally, it was found that the optimization module of COMSOL is capable of finding improved double ridge geometries.

### Future Directions

Further investigation of design optimization can be done, especially with regards to altering the spacing between ridges. The optimization module can also be used to attempt to optimize other pre-existing metasurface designs.

### References

Curwen, C., Reno, J. and Williams, B. (2020), Broadband metasurface design for terahertz quantum-cascade VECSEL. Electron. Lett., 56: 1264-1267. <https://doi.org/10.1049/el.2020.1963>

### Acknowledgements

I would like to thank Professor Williams for the opportunity to work in his lab this summer, as well as Eilam Morag for his support on the project. Special thanks to Women in Engineering at UCLA for funding the project through the Samueli Research Scholars program.



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# Deep Learning Approaches for Transmitter Classification

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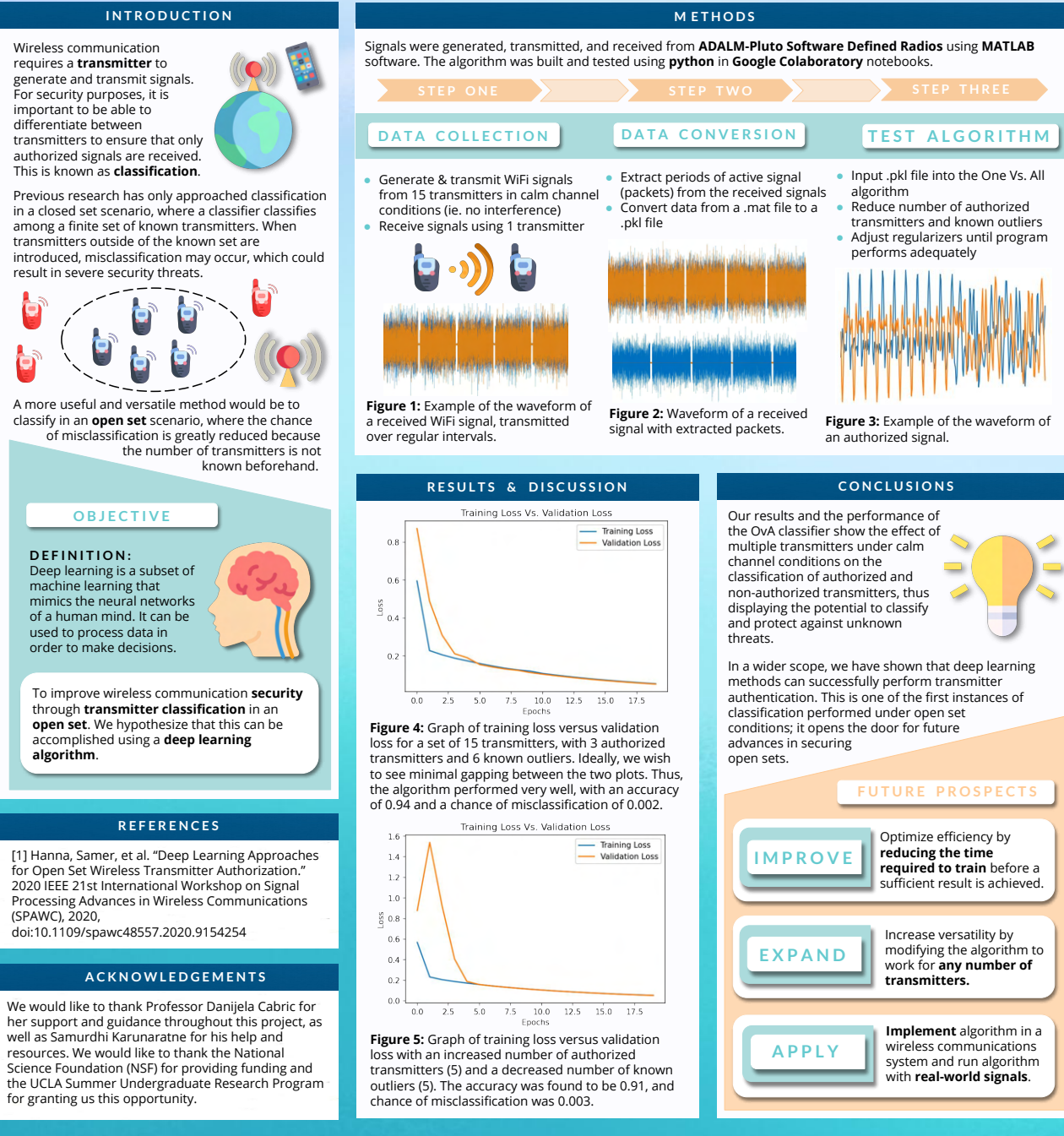
## ABSTRACT

Wireless signal classification plays an important role in the security of a wireless communication system since it can be used for transmitter authorization, the process by which authorized transmitters are distinguished from non-authorized transmitters based on transmitter-specific traits in their signals. Current systems have only investigated authorization for a closed set scenario, where the algorithm classifies among a finite set of known transmitters. This has several limitations, the most significant of which is that transmitters outside of the known set may be misclassified. In this project, we attempt to remedy this issue by performing authentication in an open set scenario, where the number of transmitters is not known. To do this, we generated and transmitted signals from eleven different ADALM Pluto Software Defined Radios using MATLAB software. We also simulated 5 unique transmitters by artificially adding different I/Q imbalance impairments to the signals. The signals were transmitted in the form of packets (active transmission separated by idle moments), which were then extracted using pre-written code. Finally, the extracted packets were inputted into an existing deep learning algorithm called One Vs. All, where the algorithm was tested and modified until a satisfactory accuracy was found. With this algorithm, wireless communication security can be significantly improved, since it minimizes the risk of misclassification by solving the previous weakness of authorization only under closed set conditions.

# Deep Learning Approaches for Transmitter Classification

Jenna Kim, Aadhidhya Ravikumar, Professor Danijela Cabric

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## Dolores Rodriguez



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## The Effects of Mass Transfer on CO<sub>2</sub> Reduction

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*ABSTRACT*

Carbon dioxide is the most abundant greenhouse gas in the atmosphere emitted through human activities. However, through an electrochemical process CO<sub>2</sub> can be converted into more useful products such as fuels and feedstock chemicals. To improve this process so that selectivity is increased towards these more desirable products, this study will explore how mass transport affects the product distribution of the electroreduction of CO<sub>2</sub>. We alter the mass transportation of CO<sub>2</sub> to the catalytic surface by rotating the catalyst. A cylindrical Cu catalyst is used and rotation speeds of 200 and 400 rpm are tested. The applied potential is also varied from -1.31 V vs SHE to -1.67 V vs SHE. This study provides new insights into what may be the optimal rotation speed that will produce the highest selectivity towards more desirable products, in turn opening up the possibility of CO<sub>2</sub> reduction being a new avenue of renewable energy.

## The Effects of Mass Transfer on CO<sub>2</sub> Reduction

By Dolores Rodriguez with Joonbaek Jang and Dr. Carlos G. Morales-Guio

Laboratory of Electrochemical Systems Engineering

Department of Chemical Engineering, University of California, Los Angeles



### Introduction

CO<sub>2</sub> is the most abundant greenhouse gas in the atmosphere emitted through human activities. This study contributes to the ongoing research on how to reduce CO<sub>2</sub> into fuel and feedstock chemicals in a carbon neutral process. The reduction of CO<sub>2</sub> could prove to be a very useful and new avenue of renewable energy.

### Objective

The objective of this study is to explore how mass transport affects the product distribution of the electrochemical reduction of carbon dioxide. More specifically, we will be looking into how rotating the catalyst, and in doing so, changing the mass transfer of carbon dioxide to the catalyst surface affects the product distribution.

### Materials

The electroreduction of carbon dioxide occurs in a custom rotation cell.

The programs Peaksimple<sup>[2]</sup> and Bruker Topspin<sup>[3]</sup> are used to identify and quantify the resulting products.



### Methods

#### 1. Prepare the Catalyst Surface

The catalyst is first mechanically polished and then electropolished.

#### 2. Running the experiment

The catalyst is placed in the cell where it rotates. The rotation speeds and potentials applied to the system are varied.

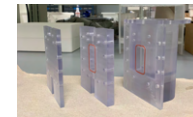


Figure 3: The custom rotation cell

#### 3. Product Quantification

After the experiment is finished, the liquid products are analyzed using Bruker Topspin while the gas products are analyzed using Peaksimple.



### Principles

#### Current Density

- Current density which is the density of electrons flowing from the catalyst
- This is how we measure the activity of a catalyst
- The more active a catalyst is, the more electrons that will be transferred, and therefore a higher current density

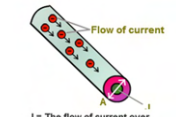


Figure 1<sup>[1]</sup>: Flow of current through a cross-sectional area

#### Mass Transfer

- Mass transfer is the net movement of mass from one location to another
- We will be looking at the mass transfer of CO<sub>2</sub> to the catalyst surface.

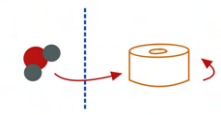


Figure 2: Carbon dioxide molecule traveling to a rotating catalyst

### Results

#### Partial Current Density vs Potential at 200 rpm

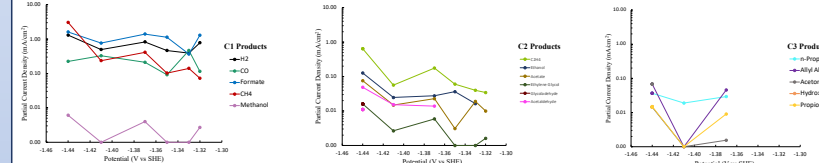


Figure 4: Partial Current Densities of Gas Products vs Potential at 200 rpm. Plots are separated into C1, C2, and C3 products.

#### Partial Current Density vs Potential at 400 rpm

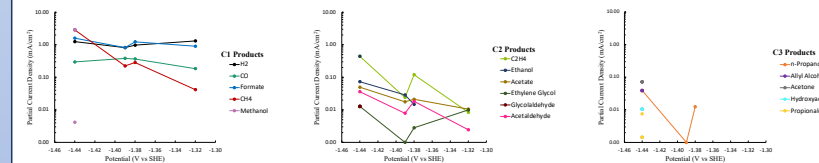


Figure 7: Partial Current Densities of Gas Products vs Potential at 400 rpm. Plots are separated into C1, C2, and C3 products.

### Conclusions

Our results don't show a great difference in the range of partial current densities of each product between the two rotation speeds. However, there are noticeable differences in the onset potential of each product between the two rotation speeds. The onset potential is the lowest overpotential at which the product is detected. At 400 rpm, most C3 products have a higher onset potential than at 200 rpm.

For future experiments, data should be collected at more partial current density looks like at each rotation speed.

### References

- <sup>[1]</sup> Current Density, <https://byjus.com/physics/current-density/>
- <sup>[2]</sup> Peaksimple Logo, <https://www.sri-instruments-europe.com/en/products/software/peak-simple.php>
- <sup>[3]</sup> Bruker Topspin Logo, <https://nmr.wpi-st-andrews.ac.uk/bruker-topspin/>

### Acknowledgements

I would like to thank to my P.I., Dr. Carlos G. Morales-Guio and my daily lab supervisor, Joonbaek Jang for their guidance and mentorship. I would like to thank William Herrera and the rest of the SURP program administrators for their resources. I would also like to thank Samueli Research Scholars for funding this research.



## Nicolas Schmidt



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# Terahertz polarization imaging using quantum-cascade laser with switchable polarization

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## ABSTRACT

We are using a terahertz quantum-cascade vertical external cavity surface emitting laser (QC-VECSEL) with switchable polarization for polarization difference imaging. Terahertz radiation's non-damaging nature gives it several applications such as cancer detection, bomb detection, and drug detection. Furthermore, polarimetric imaging can show various features not shown by traditional images, such as roughness, edge details, and birefringence. To optimize imaging, we first found the focal point of the laser, meaning where the gaussian beam spot size is minimum. Next, we investigated the signal to noise ratio through a wide range of parameters. We found the parameters with the strongest signal to noise ratio and from there we could move on to imaging. The beam goes through a biconvex lens, the sample, a rotating polarizer and finally two off-axis parabolic mirrors focus it onto the detector. Then we use Stokes-Mueller formalism to conveniently model the partially polarized light. Our images suggest that polarization difference can show edge features with high contrast for samples transparent in the terahertz frequency range.



## Terahertz polarization imaging using quantum-cascade laser with switchable polarization

Nicolas Schmidt<sup>1</sup>, Anthony D. Kim<sup>1</sup>, Benjamin S. Williams<sup>1</sup>

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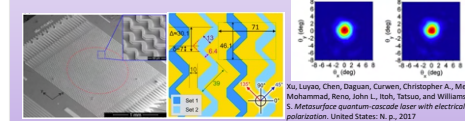
### Terahertz Devices and Intersubband Nanostructures Laboratory

#### Introduction

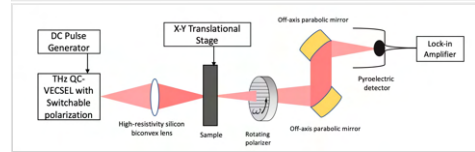
- **Terahertz (THz) radiation** is able to penetrate through a wide range of non-metals. Furthermore, due to its low energy it is known to cause no detectable damage to matter.
- **THz imaging** shows promise in medicine (cancer detection), security (illegal drug and bomb detection), agriculture (water content detection) and more.
- Imaging via polarization can show various features not shown by traditional images. It is significantly more sensitive than conventional imaging, showing features such as **roughness, edge details, and birefringence**.

#### Terahertz Illumination

- We use a **teraquantum-cascade (QC) vertical-external-cavity surface-emitting-laser (VECSEL) with switchable polarization**.
- Our laser uses a metasurface with two different arrays of antennae and quantum-cascade gain which are respectively activated via an electrical bias.
- The two sets have quasi-orthogonal linear polarizations with set 1 emitting a beam at about 45° and set 2 at about 135°. The two sets also show excellent beam quality.
- We operate our QC-VECSEL at operating temperature 77K, 10% duty cycle, at 3.2 THz, 0.7mW average power for the top set and 0.5 mW for the bottom set

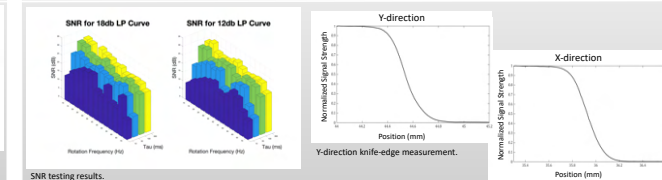


#### Experimental setup and detection methods



- The pulsed QC-VECSEL with linear polarization goes through a **high-resistivity silicon biconvex lens to be focused onto a sample**.
- The THz signal coming out of the sample is **modulated a linear polarizer rotating at 10 Hz**.
- Lock-in amplifier collects the in-phase and quadrature component of the laser beam, which can be used to calculate the polarization state of the beam after going through the sample.
- We use Stokes-Mueller formalism to analyze the light reaching the detector.

#### Resolution and noise



- 100 samples of the laser are taken while varying the rotating polarizer's frequency, the lock-in amplifier's averaging time (tau) and the frequency the lock-in amplifier uses for the signal (double the rotation frequency).
- Optimal operation parameters for the optical setup are found to, 10 Hz rotation frequency, resulting in a 20 Hz lock-in frequency, and tau of 300ms
- Using knife-edge measurements with the X-Y translational stage we measure the diameter of the focal point of the beam to be **0.28 mm** in both the X and Y direction.
- This measurement corresponds to the transmission drop from 90% to 10% of the laser's maximum transmission

#### Stokes-Mueller Formalism

- Stokes-Mueller formalism is convenient to model the partially polarized light coming out of our sample

$$S = \begin{pmatrix} S_0 \\ S_1 \\ S_2 \\ S_3 \end{pmatrix} = \begin{pmatrix} \langle E_x^2 \rangle + \langle E_y^2 \rangle = \langle I_{\theta} \rangle + \langle I_{90} \rangle \\ \langle E_x^2 \rangle - \langle E_y^2 \rangle = \langle I_{\theta} \rangle - \langle I_{90} \rangle \\ 2 \langle E_x E_y \cos(\delta_y(t) - \delta_x(t)) \rangle = \langle I_{45} \rangle - \langle I_{135} \rangle \\ 2 \langle E_x E_y \sin(\delta_y(t) - \delta_x(t)) \rangle = \langle I_{LC} \rangle - \langle I_{RC} \rangle \end{pmatrix}$$

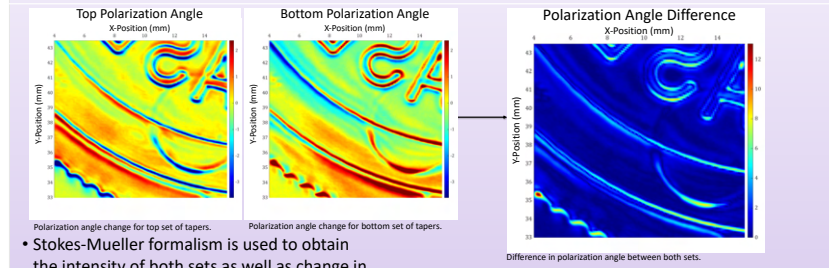
- Furthermore, our rotator and lock-in amplifier system provides the Stokes parameters.

$$M_{rotator} = \frac{1}{2} \begin{pmatrix} 1 & \cos(2\omega t) & \sin(2\omega t) & 0 \\ \cos(2\omega t) & \cos^2(2\omega t) & \sin(2\omega t)\cos(2\omega t) & 0 \\ \sin(2\omega t) & \sin(2\omega t)\cos(2\omega t) & \sin^2(2\omega t) & 0 \\ 0 & 0 & 0 & 0 \end{pmatrix}$$

- With this we can extract the intensity and the change from the initial polarization-angle at the edges and features of the sample.

- Intensity:  
 $S_{out,1} = \frac{1}{2} (S_0 + S_1 \cos(2\omega t) + S_2 \sin(2\omega t))$
- Polarization Angle:  
 $\psi_{ret} = \frac{1}{2} \tan^{-1} \left( \frac{S_2}{S_1} \right)$

#### Results



- Stokes-Mueller formalism is used to obtain the intensity of both sets as well as change in polarization angle of the laser.
- It can be seen by analyzing these images that the orthogonal polarizations show different features more prominently. It is of interest to consolidate these features into one image.
- The clearest image obtained from this specific sample was the difference in polarization angle, as all the features of the sample are most clearly seen.
- It is clear to see the features such as the edges and roughness of the sample

#### Conclusion

- Our resultant images suggest polarization difference imaging can resolve edge features with high contrast for objects transparent in the terahertz frequency such as plastic
- Future Prospects:
  - Splitting the initial beam to compare the intensity measured through the sample to the intensity to the full intensity without going through the sample.
  - Vary the optical setup to capture information such as reflection.

#### Acknowledgements

- Funding support is provided by the National Science Foundation (NSF).

## Sudarshan Seshadri



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## Gathering and Presenting Sensor and Control Data from Autonomous Agents, Interpreting High Level User Behavior Inputs

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### ABSTRACT

A successful user interface for a group of autonomous robots must have three main characteristics. First, it must be able to easily gather and visualize data as well as send commands to the robotic swarm. Second, because robotic projects constantly evolve, it must be highly modular and display data in many formats. Lastly, it must be able to replay the data as if in real time, which previous systems, such as typical IoT dashboards, cannot do. We were able to create a demo of a swarm of robots that feature mesh networking, autonomy, and vision processing. Using the front end JavaScript library React, I created a dashboard that is able to transfer data over different protocols as well as record data to play back later. I implemented different input methods such as text boxes, sliders, joysticks, and buttons. Members of my lab can now easily visualize robot data in different ways including video feeds, raw text feeds, live graphs, and 3D rotation visualization. Ultimately this project enables users to easily prototype and control a generic swarm of robots. In the event that new controls or interfaces are needed, the modularity of this project makes it easy to implement new functionality.

## Assisted Autonomy Dashboard

Gathering and Presenting Sensor and Control Data from  
Autonomous Agents, Interpreting High Level User Behavior Inputs

UCLA Samueli School of Engineering  
SUMMER UNDERGRADUATE RESEARCH PROGRAM

Sudarshan Seshadri, Dr. Ankur Mehta,  
The Laboratory for Embedded Machines  
and Ubiquitous Robots, UCLA

UCLA Electrical and Computer Engineering

### Introduction

A successful user interface for controlling a group of robots must:

- Gather and visualize data from multiple sources and sinks
- Be highly modular: any part can be replaced
- Record data for playback, to compare robot runs

### Web App Structure

### Results

The dash can control boats, cars, Blimps, any new robots developed.

**Input Components:**

- Text
- Buttons
- Joysticks
- Macros
- Sliders

**Display Components:**

- Text
- Video
- Rotation Display
- Graphs

### Protocols

- Websockets
  - Full duplex over TCP
  - HTTP initiates connection
- MQTT
  - Publish / subscribe
  - Broker / clients

### Conclusion

- Control any group of robots.
- Add new controls and data visualization elements easily (modularity)
- Future developments:
  - add more input and output components
  - add more troubleshooting/prototyping tools
  - integrate into RoCo (origami robot design tool)

### Acknowledgements

- Dr. Ankur Mehta, UCLA LEMUR
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- William Herrera, Summer Undergraduate Research Program



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## Expanding Human-Computer Interaction via Object Recognition Implemented into a Hand Signal Actuated Robotic Arm (SARA)

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ABSTRACT

Human-computer interaction (HCI) has advanced the efficacy of a multitude of sectors such as communication and consumerism. However, there exists a gap where most HCI research is conducted to improve quality in industrial aspects rather than personal aspects. Our research extends HCI to improve quality of life by designing and implementing a hand signal response AI into a six degree of freedom (6DoF) robotic arm. We call this our hand signal actuated robotic arm, SARA. An implementation of forward kinematics (FK) and inverse kinematics (IK) in python allows the robotic arm to actuate in response to complex hand signals, made possible via our hand recognition software. This software presents a real-time object-tracking process that recognizes hand signals by finger landmark mapping. A rule classifier distinguishes different variations of raised fingers. To confirm mechanical actuation and limitations, we developed a simulator in MATLAB using a virtual robotic arm that parallels SARA. Our research ultimately produced a design that, when implemented, gives SARA the capability to react to diverse hand signals independently. Qualitative demos conducted with a variety of hand signals validated our research design and implementation. A set of thirty-two hand signals was displayed to SARA that resulted in successful actuation in accordance with the simulator. The application of this design aims to assist individuals with physical limitations, making HCI more personal. The success of implementing a hand signal response AI makes the interaction with a robotic arm intuitive, ultimately expanding the scope of HCI to enhance the human experience.

## Expanding Human-Computer Interaction via Object Recognition Implemented into a Hand Signal Actuated Robotic Arm (SARA)

FAST TRACK  
TO SUCCESS  
UCLA Electrical and  
Computer Engineering



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<sup>1</sup>Faculty Advisor, <sup>2</sup>Daily Lab Supervisor



UCLA Samueli  
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SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

### Introduction

Human-computer interaction (HCI) has advanced the efficacy of a multitude of sectors such as communication and consumerism.

However, there exists a gap where most HCI research is conducted to improve quality in industrial aspects rather than personal aspects.

Previous research has shown that it is possible to enhance HCI by integrating robotic arms into the human body.[1]

The focal point of our research involves a robotic arm, which is a mechanical appendage consisting of 6 anthropomorphic joints.

### Objective

Our research extends HCI to improve quality of life by designing and implementing a hand signal response AI into a six degree of freedom (6DoF) robotic arm. We call this our hand signal actuated robotic arm, SARA. Using SARA, we aim to bridge the gap between humans and computers.

### Principles/Concepts

#### Forward Kinematics (FK)

is the mathematical process that allows us to find the position and orientation of the end effector on the X, Y, and Z axes from the joint angles.

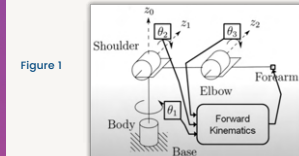


Figure 1 shows the relationship between joint angles ( $\theta_1, \theta_2, \theta_3$ ) and the position of the end effector through FK.[2]

#### Inverse Kinematics (IK)

is the mathematical process that allows us to find the joint angles from the X, Y, and Z coordinates of the end effector.

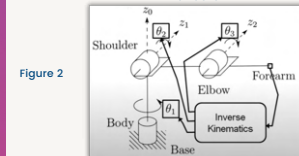


Figure 2 shows the relationship between the position of the end effector and the joint angles ( $\theta_1, \theta_2, \theta_3$ ) through IK.[2]

### Materials

- Python IDE Pycharm
- Python Library MediaPipe
- R+ Manager
- a six degree of freedom (6DoF) robotic arm
- six Dynamixel XM540 motors
- 11.1 V Battery
- Peter Corke's Robotics Toolbox MATLAB



### Methods

#### Step 1: Coding in Python

- Utilizing the library MediaPipe, we implemented a hand tracking and signal recognition software
- Using FK and IK concepts, we created software that outputs the six joint angles with an input of a position
- Referencing the motor documentation, we created code to actuate SARA to our preferences

#### Step 2: Simulator

To confirm mechanical actuation and limitations, we developed a simulator in MATLAB using a virtual robotic arm that parallels SARA. This was written with the help of Peter Corke's Robotic Toolbox.

#### Step 3: Experimental

In-lab qualitative demos conducted with a variety of hand signals enhanced our research design and implementation. Actuation was observed, recorded, and analyzed. The code was optimized based on the previous results.

### Mathematical Methods

#### DH Parameters

A DH parameter table was used to find the end-effector position, via FK. The DH parameters consist of four factors: 1. link length, 2. link twist, 3. link offset, 4. joint angle. These factors can be inserted in the following table:

Joints	Theta	Link Twist (alpha)	Link length(r)	Link Offset (d)
0 - 1	0°	90°	2"	0"
1 - 2	0°	0°	6.75"	0"
2 - 3	0°	0°	8"	0"
3 - 4	0°	90°	0"	0"
4 - 5	0°	90°	0"	0"
5 - 6	0°	90°	0"	0"

#### Rotation Matrix

Rotation matrices were derived from the DH Table above. The following formula shows the relationship between the different matrices:

$$R_6^3 = R_3^{0-1} R_6^0$$

The formula corresponding to the rotation for joints 3-6 is:

$$R_6^3 = \begin{bmatrix} -s\theta_3 c\theta_4 c\theta_5 - c\theta_3 s\theta_4 & s\theta_3 c\theta_4 c\theta_5 - c\theta_3 s\theta_4 & -s\theta_3 s\theta_4 \\ c\theta_3 c\theta_4 c\theta_5 - s\theta_3 s\theta_4 & -c\theta_3 c\theta_4 c\theta_5 - s\theta_3 s\theta_4 & c\theta_3 s\theta_4 \\ -s\theta_3 c\theta_4 & s\theta_3 s\theta_4 & c\theta_3 \end{bmatrix}$$

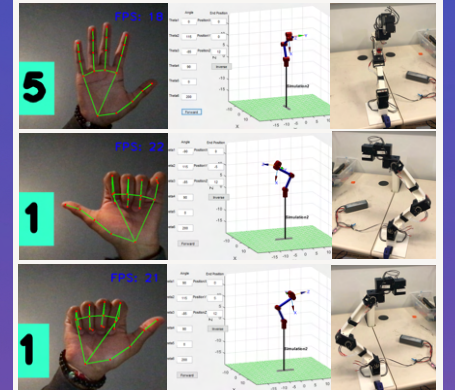
The formula to find all theta angles is:

$$\begin{aligned} \theta_1 &= \tan^{-1}(y/x) \\ \theta_2 &= \tan^{-1}(s_3/c_3) \\ \theta_3 &= \tan^{-1}((c_3a_3 + a_2)(z - S_{23}a_4) - S_3a_3(xc_1 + yS_1 - C_{23}a_4) / ((C_3a_3 + a_2)(xc_1 + y - C_{23}a_4) + S_3a_3(z - S_{23}a_4)) \\ \theta_4 &= 234 - 2 - 3 \\ \theta_5 &= \tan^{-1}(C_{234}(Clax + Slay) + S_{234}az / S_{234} - Clax \\ \theta_6 &= \tan^{-1}(-S_{234}(Clnx + Slny) + (C_{234}az - S_{234}(ClQx + SlQy) + (C_{234}Qz) \end{aligned}$$

\* s = sin; c = cos; x,y,z = end position; # =  $\theta_n$ ; a = link length; O = link twist; n = origin

### Results

Below are specific results obtained from our research. The first of each set of images is the hand signal displayed to SARA. The middle image contains the simulated positions and joint angles obtained through our simulator. The last image is what SARA has actuated to after processing the hand signal shown to it.



Similar to the results shown above, an additional twenty-nine hand signals were displayed to SARA that resulted in successful actuation in accordance with our simulator.

### Conclusion

In this research, we successfully implemented a hand signal recognition AI, an accurate simulator, and actuation with FK and IK. Our research ultimately produced a design that, when implemented, gives SARA the capability to react to diverse hand signals independently.

This design aims to assist individuals with physical limitations, making HCI more personal. This ultimately reduces the communication gap between computers and humans.

Continued research of signal recognition could explore the possibility for machines to read and react to human emotions.

Future studies may involve the expansion of the SARA prototype to include an applicable end effector, such as a gripper or other tools.

### References

- [1] Sasaki, Tomoya, et al. "MetaArms: Body Remapping Using Feet-Controlled Artificial Arms." The 31st Annual ACM Symposium on User Interface Software and Technology Adjunct Proceedings, 11 Oct. 2018, pp. 65-74., doi:10.1145/3266037.3271628.
- [2] "Forward and Inverse Kinematics Part 1." YouTube, August 3, 2011, <https://www.youtube.com/watch?v=Vjsu8T4NpVx>

### Acknowledgements

We would like to thank Professor Chen for providing us the opportunity to do research through the UCLA Summer Undergraduate Research Program (SURP). We also would like to thank Nick Li for offering us guidance and knowledge throughout our time with him. Lastly, we would like to express gratitude towards Will Herrera and the SURP staff for their hard work in organizing this program.

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## Viterbi Algorithm for Decoding TCM based PAS

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ABSTRACT

The development of a trellis-coded modulation (TCM) based probabilistic amplitude shaping (PAS) coding scheme has the potential to greatly improve the rate of data transmissions to meet the rapidly growing data demands. Previous studies on convolutional codes have determined that there is a theoretical maximum channel noise in the memoryless channels used for data transmission; a TCM based PAS design has the potential to reach a higher maximum threshold in comparison to low-density parity-check (LDPC) codes. To obtain the initial data sequence, we propose an implementation of the maximum likelihood soft decision Viterbi algorithm that calculates the branch metrics using a probability vector for the constellation design in order to determine the survivor path.

## Viterbi Algorithm for Decoding TCM based PAS

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Fast Track to  
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### Introduction

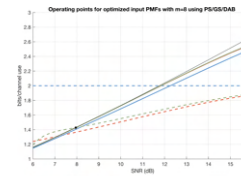


Figure 1. Theoretical performance limit.

- Problem:** There is a theoretical maximum noise threshold in the memoryless channels used for data transmission that has not been achieved at short block lengths.
- Approach:** Using a nonuniform input and a Trellis-coded modulation (TCM) based Probabilistic amplitude shaping (PAS) system may approach this theoretical limit.
- This Project:** Implement the maximum likelihood soft decision Viterbi algorithm to determine the original transmitted data from the received data sequence.
- Significance:** This work seeks to increase the speed and reliability of short transmissions.

### Trellis Coded Modulation

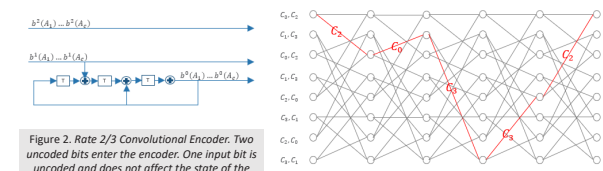


Figure 2. Rate 2/3 Convolutional Encoder. Two uncoded bits enter the encoder. One input bit is uncoded and does not affect the state of the encoder, and the remaining bit is processed into two coded bits. The T boxes represent the states of the shift register. The + represents an XOR notch that process any two bits.

Figure 3. Trellis diagram of the convolution encoder in Figure 2. Each node indicates a unique state in the shift register. Each path between nodes represents the next possible states, depending on the input symbol. The red lines indicate an example path of encoder states over time. This trellis uses parallel branches.

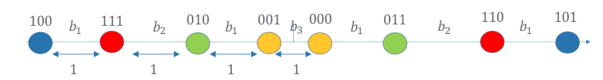
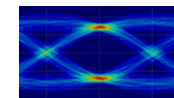


Figure 4. Constellation diagram for the encoder in Figure 2. The first two bits represent the two coded bits outputted from the encoder. The third bit is the uncoded bit that passes through the encoder.

- The convolutional encoder:
  - Creates a redundant bit for every 2 bits in the data sequence before transmission.
- The trellis:
  - Stores the next possible states from any given state and the coded output bits for any uncoded input bit.
  - Does not consider the uncoded bit that passes through the encoder.
  - Each path represents two parallel branches for the two possible uncoded bits that passed through the encoder.
- The constellation design:
  - Separates constellation points share two parallel branches, i.e. that differ only in an uncoded bit, to have the maximum possible distance.

### Methods

- All code was implemented in MATLAB, using the Communications Toolbox.



### Soft Decision Viterbi Algorithm

- Viterbi Algorithm:
  - Cannot determine the original sequence with complete certainty.
  - Calculates most likely transmitted sequence given the received sequence.
  - The path through the trellis that has the highest probability is selected by the Viterbi algorithm.
- Soft Decision Decoding:
  - Calculates the path metric of each path through the trellis using a priori probabilities of the input symbols, which are not equal in our design.
  - More reliable but also more computationally complex than hard decision decoding, which computes path metrics using Hamming distance.

### Design

- Inputs:
  - Vector of encoded channel symbols.
  - Trellis corresponding to the encoder used.
  - Probability vector of the constellation design.
  - Vector of constellation points.
- Output:
  - Vector of decoded bits
- Implementation:
  - Starting from the zero state, traverse each next possible state in the trellis.
  - Calculate the squared Euclidean distance and sum the new path metric for each branch.
  - For converging paths, discard the branch with the greater path metric.
  - Store the input symbols, paths choices, and path metrics of each state in the trellis.
  - Select path having the highest probability, i.e. smallest path metric.
  - Return the sequence of input symbols reshaped as a vector of bits.

### Conclusion and Future Work

- The TCM based PAS coding scheme has the potential to greatly improve the rate of data transmissions.
- Examples: performance benefits in any digital video, radio, or mobile communication systems.
- Prospects:
  - Further optimizations of decoder.
  - Translation to C++
  - Measure the performance of TCM based PAS system with this decoder.

### Acknowledgements

We would like to thank the National Science Foundation, UCLA ECE Fast Track Program, and UCLA Summer Undergraduate Research Program for funding our project and providing the research opportunity. We would like to thank Professor Wesel, Dan Song, Linfang Wang, and Felipe Areces for the extensive guidance throughout the research process.

### References

- [1] Ungerboeck, G. (1982). Channel coding with multilevel/phase signals. *IEEE Transactions on Information Theory*, 28(1), 55–67. <https://doi.org/10.1109/tit.1982.1056454>
- [2] Xiao, D., Wang, L., Song, D., & Wesel, R. D. (2021). Finite-Support Capacity-Approaching distributions for Awgn channels. *2020 IEEE Information Theory Workshop (ITW)*. <https://doi.org/10.1109/itw46852.2021.9457608>
- [3] Wesel, R. D. (2004). Reduced-State representations For Trellis codes Using CONSTELLATION SYMMETRY. *IEEE Transactions on Communications*, 52(8), 1302–1310. <https://doi.org/10.1109/tcomm.2004.833023>



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## Origami Webapp User Interface & Integration of New Designs

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### ABSTRACT

The Origami Design App is a web application that can view, compile, and change the parameters of robots along interfaces. UCLA's LEMUR originally designed this webapp as a means to make robot compiling easier for those that lack the engineering or the programming background. I integrated some of the functionalities such as being able to view necessary component files when inputting a subcomponent into a html form by using a PATH method. This is significant because a user could potentially compile a robot easier or faster than using the standard RoCo application. I also edited some of the existing user interface such as editing the style of transitioning buttons with css files to provide the user with optimal visual experience. For the future, I plan to conduct a user study to observe that the changes I have implemented have benefited the Origami Design App and prove that the changes within the user interface were successful. I also plan to implement the functionality to combine components along interfaces which will most likely reduce the time that a user needs to spend in order to design a robot.

## Origami Webapp User Interface & Integration of New Designs

Jaehoon song, Ankur Mehta, The Laboratory for Embedded Machines and Ubiquitous Robots



### Introduction

The Origami Design App is a web application that can view, compile, and change the parameters of robots along interfaces.

### Objective

The goal is to improve the user interface of Origami Design App and to create an environment where a user without an engineering or programming background can easily and quickly compile robots.

### RoCo

**RoCo: Robot Compiler**

**Builder files**

- Standard RoCo application is a set of python scripts
- component files that the webapp uses are generated here

**Output files**

Model of an 'L': used for thumbnails

### RoCo Library

**Rocolibrary:** Library that contains pre-built/newly built component/models

- Webapp uses Rocolibrary to render designs

### Jinja

By using **Jinja**, a templating engine, I was able to:

- Inherit templates
- Used python codes on html
- Used delimiters to fetch the user input

```
"{{ request.form["nm"] }}"
```

### User Interface

**CSS Stylesheets:**

- Used for general styling and layout
- Bigger and aligned transition buttons

### Web Interface Interaction

Flask allows easier module programming

Python scripts can be integrated using Flask.

Used for displaying, styling, and implementing content.

Displays content on the web browser

### HTML

**HTML and Jinja** was used to inherit templates:

- Used delimiters to inherit the navigation bar
- Used html tags to create an easily navigable builder option which directs to the builder page

```
{% extends "layout_and_nav.html" %}
```

**Builder**

### GET

**GET method:** fetches data from the server

- Used for rendering designs from thumbnails

CLIENT → GET → SERVER

example.php?date=1

### Post

**POST method:** sends data to the server

- HTML input sends data to the server
- Loads the model that was sent

CLIENT → POST → SERVER

example.php#

### Results & Discussion

**URL:** 192.168.86.82:5000/Paperbot#

Loading models using **POST** method:

- Enables loading models much easier
- Can automatically call models within the library
- Load in new designs for better view

**Tank Model:**

- Loaded using POST method
- The '#' indicates that it has used POST

**Component**

Tank

- Takes user input and converts it into a component
- the need for compiling two additional python scripts eliminated

### Conclusion

- Easier robot compiling for those that lack the engineering or the programming background
- Plan to implement combining components along the interface
- New Interface Design

### MODELS

name	name	name
name	name	name
name	name	name

### Acknowledgements

- Dr. Ankur Mehta, UCLA LEMUR
- William Herrera, Summer Undergraduate Research Program
- Grace Kwak, Bhavik Joshi, Jillian Pantig, Marisa Duran, Shahrul Kamil Hassan, and Sudarshan Seshadri
- NSF REU

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## Analysis of Frame Error Rate (FER) and Bit Error Rate (BER) of Viterbi Decoding with Periodic Puncturing

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## ABSTRACT

Communications systems are crucial to modern everyday life – whether it be Wi-Fi, satellite communications, or storing and sharing documents digitally. However, imperfect communication channels can result in noise distorting transmitted data. Error correcting codes seek to identify and correct distorted data. Error correction comes at the cost of efficiency – this project's rate- $\frac{1}{3}$  trellis encoder outputs three encoded bits per every one information bit, making it three times as inefficient as only sending the original data. By puncturing – omitting certain bits in transmission – higher efficiency can be attained, but the chance of receiving the correctly decoded information decreases. Previous literature has investigated the characteristics of a rate- $\frac{1}{3}$  64-state 8PSK-modulated trellis encoder under puncturing and used these characteristics to develop a bit error rate (BER) union bound on the data. By running BER data simulations using C++ and the Hoffman2 Cluster and comparing them to theoretical union bound plots in MATLAB, this project has confirmed the results found in previous literature. Additionally, this project will extend the BER union bound methods to develop a union bound for the frame error rate (FER), as well as simulating the FER performance for this specific encoder and various puncturing patterns of interest. Whether in satellite transmissions, self-driving cars, streaming, Wi-Fi, memory storage hard drives, 5G, or GPS, our research has countless applications in the modern, digital world.

## Analysis of Frame Error Rate (FER) and Bit Error Rate (BER) of Viterbi Decoding with Periodic Puncturing

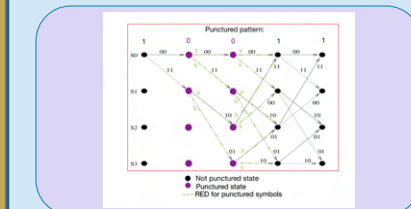
Shakeh Kalantarmoradian<sup>1</sup>, Alethea Sung-Miller<sup>1</sup><sup>1</sup>ECE Department, UCLA; Communications Systems Laboratory (CSL)  
Research Mentors: Richard D. Wesel, Alexander Baldauf

## Introduction

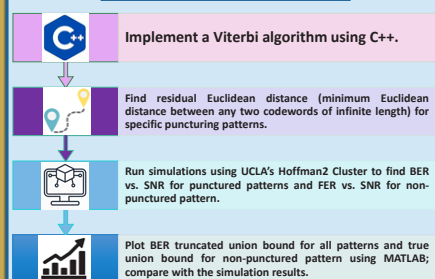
When transmitting data over a noisy channel, the noise can cause information bits to be distorted at the receiver, resulting in the receiver selecting the wrong codeword. Error correcting codes add bits for redundancy to enable detection and correction of errors at the receiver.

This project uses a rate- $\frac{1}{3}$  64-state 8PSK-modulated trellis code, which sends three encoded bits as one symbol per information bit. Periodic puncturing – intentional omission of certain symbols – has been implemented to reduce the number of symbols sent, where patterns are denoted as ones and zeros (zeros indicate omitted symbols).

This project has confirmed the results of previous papers by investigating the characteristics of the trellis encoder, as well as simulating the bit error rate in comparison to truncated and non-truncated bit error rate (BER) union bounds. Ongoing progress includes developing union bound equations for the frame error rate (FER).

Fig. 1 – Four-state rate- $\frac{1}{3}$  punctured Viterbi diagram.

## Method



The truncated union bound is  $N_b(\bar{a})Q\left(\sqrt{\text{RED}^2(\bar{a})\varepsilon_x/(2N_0)}\right)$  where  $N_b(\bar{a})$  is the number of bits that are incorrect among the nearest neighbor paths (paths that share the same residual Euclidean distance, or RED).  $\varepsilon_x/N_0$  is the magnitude of SNR. The union bound equation used for the non-punctured pattern is  $\frac{1}{k_p} Q\left(\sqrt{\text{RED}^2(\bar{a})\varepsilon_x/(2N_0)}\right)e^{\text{RED}^2(\bar{a})\varepsilon_x/(4N_0)} \frac{\partial^2 P(W_{1:p}, W_{p+1:L})}{\partial I}$ , where  $I = 1, W_j = e^{-|a_j|^2/(4N_0)}$ .

## Analyses

For lower SNRs, the data lies above the truncated union bound. This is expected, as the truncated union bound is an approximation of the true union bound. At higher SNRs, the truncated union bound converges to the true union bound and acts like an upper bound to the data. Interestingly, the truncated and true union bounds match better for more aggressive puncturing patterns. Similarly, the truncated union bounds and the data seem to approach each other much more quickly for more aggressively punctured patterns.

## Results and Conclusion

Punctured Pattern	Code 13 RED	Code 14 RED
11111	4.11	4.21
01111	3.03	3.25
11110	3.43	3.63
11101	3.51	3.68
11011	3.66	3.25
10111	3.31	3.22
00111	2.08	2.08
01110	2.27	2.27
11100	3.03	3.03
11001	3.03	3.16
10011	3.03	2.57
01011	2.40	2.40
10110	2.79	2.79
01101	2.52	2.40
11010	2.93	2.93
10101	2.89	2.79
00101	1.33	1.33
01010	1.33	1.61
10100	1.78	2.27
01001	2.57	1.78
10010	2.27	2.14

Fig. 2 – Residual Euclidean distances of Codes 13 and 14 shown in columns 2 and 3 respectively for each of the punctured patterns listed under column 1.

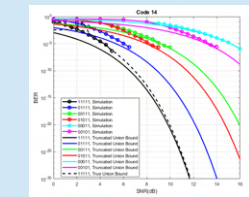
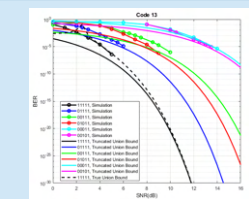


Fig. 3 – Truncated union bound (solid lines) vs. collected data (lines with circular points) vs. true union bound for non-punctured pattern (dashed line) for a) Code 13 and b) Code 14.

## These results indicate:

- Though the literature notes that Code 14 performs slightly better than Code 13 for progressive puncturing patterns, the advantages of Code 14 are minor.
- The truncated union bound provides a good expectation of the true union bound at high SNRs. At lower SNRs the truncated union bound is considerably lower than the true union bound.
- Though the true union bound is a good match for the non-punctured pattern data, we are still finishing developing the true union bound for punctured patterns.

## Developing the FER union bound:

- FER equations based on the bit error rate union bounds developed in [1], [2], and [3].
- Dan Song (CSL, UCLA) adapted the BER true union bound for FER.
- This project has adapted this general FER union bound to the case of puncturing, as follows:

$$FER \leq Q\left(\sqrt{\text{RED}^2(\bar{a})\varepsilon_x/(2N_0)}\right)e^{\text{RED}^2(\bar{a})\varepsilon_x/(4N_0)} \sum_{i=p+1}^L T_i(W)$$
$$T_i(W) = \left[ d_{a_i} c_{a_i} \right]_{W=-|a_i|^2/(4N_0)}^{L-2} \left( \left[ d_{a_j} c_{a_j} \right]_{W=-|a_j|^2/(4N_0)} \right) \left[ d_{a_{i-1}} \right]_{W=-|a_{i-1}|^2/(4N_0)}$$
$$d_{a_j}^* = d_{a_j} - 1$$

$\bar{a}_j = \begin{cases} 1, \text{not punctured} \\ 0, \text{punctured} \end{cases}$   
 $\bar{a}$  is a vector of punctured pattern symbols with length  $p$   
 $v$  is the encoder memory  
 $\begin{bmatrix} d & c \\ b & a \end{bmatrix}$  is the reduced state transition matrix

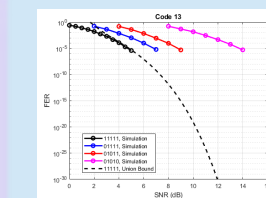


Fig. 4 – Collected data (lines with circular points) and FER equation for non-punctured pattern (dashed line) for Code 13.

## Code 13 vs. Code 14:

- Rate- $\frac{1}{3}$  8PSK codes with period 5.
- Code 13 maximizes  $\sum_j \log(\text{RED}_j^2)$  for each periodic pattern  $j$  considered in the channel [4].
- Code 14 is designed to perform better over progressive puncturing patterns (11111 01111 01011 01010).

## Key findings:

- Residual Euclidean distances for both codes 13 and 14 match values reported in [4].
- As the signal to noise ratio (SNR) increases, the bit error rate (BER) curves from our simulations and the truncated union bound curves converge for both codes 13 and 14.
- Code 13 performs as well or better than Code 14, except for 01111. Code 13 is better for 00111 and 00011, but neither of these appear in our progressive puncturing patterns.

## Next steps:

- Add feedback using the reliability output Viterbi algorithm (ROVA).
- Identify best order of punctured symbols to send during incremental retransmissions.
- Add list decoding:
  - List decoding ranks the most likely decoded sequences for the received codeword.
  - Correction involves comparing to all these options (which is inefficient).
  - At some point, entries in the list are unnecessary; they create more errors than they correct.
  - Imposing a maximum list length will avoid unnecessary entries, increasing efficiency.

## References

- [1] R. D. Wesel and X. Liu, "Analytic Techniques for Periodic Trellis Codes," 36th Annual Allerton Conference on Communication, Control, and Computing, September 23-25, 1998.
- [2] R. D. Wesel, "Reduced-State Representations for Trellis Codes Using Constellation Symmetry," IEEE Transactions on Communications, vol. 52, no. 8, August 2004.
- [3] R. D. Wesel, "Reduced Complexity Trellis Code Transfer Function Computation," Communication Theory Mini-Conference at ICC '99, June 6-10, 1999.
- [4] R. D. Wesel, X. Liu, and W. Shi, "Trellis Codes for Periodic Erasures," IEEE Transactions on Communications, vol. 48, no. 6, June 2000.

## Acknowledgments

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# Differentially Private Algorithms for Federated Learning

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## ABSTRACT

In machine learning, the main objective is to learn a centralized model by exploiting the numerous data which is available from the clients. However, the clients' data might contain personal and sensitive information, and hence, it is required to provide privacy guarantees on the clients' data. In this work, we examine differentially private training algorithms for convolutional neural networks on training practical datasets such as MNIST, ENMIST, and CIFAR10. In order to maximize testing accuracy within a fixed privacy budget, we explore the usage of novel noise functions instead of Gaussian noise in the differential privacy algorithm and transfer learning for CIFAR10 from a network trained on CIFAR100. Furthermore, we consider the problem of retaining privacy while training neural networks in a federated learning framework, where data is stored and accessed locally by the client and a central server builds and updates the neural network model. Also, separately, we examine different mechanisms for updating the global model other than the aggregate average of the local updates.

# Differentially Private Algorithms for Federated Learning

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RESEARCH PROGRAM



## Introduction

- The surge in machine learning has necessitated greater amounts of training data. Often times this data contains client's sensitive information, such as medical information or personal images. Without a private training algorithm, attacks such as model inversion can be used on machine learning models and compromise client privacy.
- As such, neural network training algorithms have incorporated differential privacy. Differentially private algorithms provide a robust privacy guarantee based on the probability of discerning the inclusion of any single training example within the training dataset, however they still lag behind in performance compared to the non-private counterpart.
- Furthermore, with the advent of personal computers and smart phones, the notion of a federated learning framework, where a central server never directly accesses client data, becomes very practical. In a federated learning framework, the central server stores and updates a global model based off information provided by clients who train the global model on their local data.
- In this work, we consider training a differentially private neural network in both a conventional central framework and a federated learning framework. Notably, we consider, different L-norms, and implementing a differentially private learning algorithm into a federated learning framework.

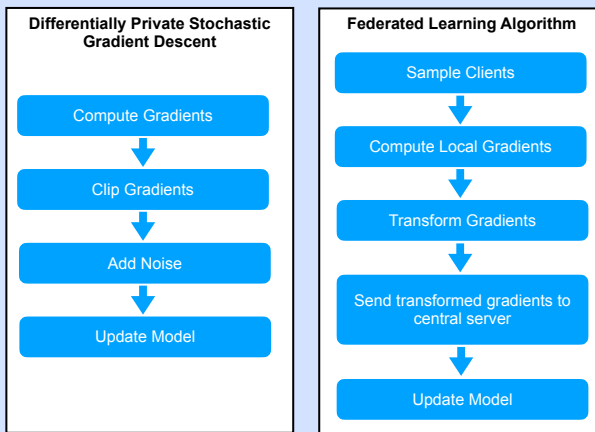
## Objective

- Explore different L-norms other than the L2-norm in the clipping function
- Test performance of a differentially private federated training algorithm for ENMIST dataset

## Materials

- MNIST, ENMIST,
  - MNIST - Handwritten digits from 0 to 9
  - ENMIST - Handwritten digits and characters grouped by client
- TensorFlow Privacy - allows for gradient clipping and Gaussian noise addition
- TensorFlow Federated - allows for neural network training in a federated learning framework

## Methods



## Acknowledgements

I would like to thank Antonious Girgis and Professor Suhas Diggavi. Also I would like to thank the National Science Foundation (NSF) for funding this project. This work was funded by a REU supported by National Science Foundation (NSF) grant # 1740047.

## Results

Layers	Parameters
Convolution	16 filters of 8x8, Stride 2, tanh
Max-Pooling	2x2
Convolution	32 filters of 4x4, Stride 2, tanh
Max-Pooling	2x2
Fully Connected	32 units, tanh
Softmax	10 units

Table 1: Model Architecture for MNIST

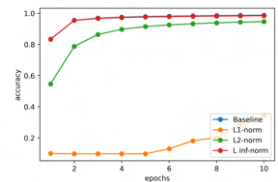


Figure 1: MNIST DP-SGD Training

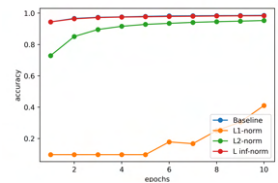


Figure 2: MNIST DP-SGD Validation

Layers	Parameters
Convolution	32 filters of 3x3, Stride 1
Convolution	64 filters of 3x3, Stride 1, ReLU
NA pooling	2x2
Dropout	p = 0.25
Fully Connected	128 units
Dropout	p = 0.5
Softmax	62 units

Table 2: Model Architecture for ENMIST

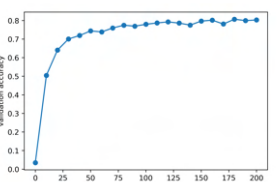


Figure 3: ENMIST Baseline

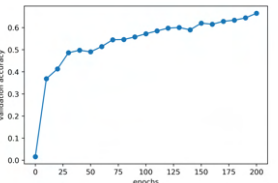


Figure 4: ENMIST with C=1 Clipping

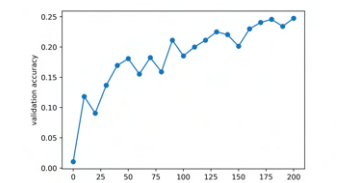


Figure 5: ENMIST with C=1 Clipping and Var=0.5


## Conclusion and Future Work

- For MNIST validation accuracy, we see that as the dimension of the L-norm increases, it functions closer to the baseline. A higher dimensional norm is more impacted by a single data point thereby implying the gradient norm is not dominated by a few single points.
- For ENMIST with clipping at C=1 there is a drop in validation accuracy compared to the baseline model. This is expected because the C=1 bound used is the same for the MNIST training, however the ENMIST model has more trainable parameters and therefore more gradients.
- Future work includes use of different mechanisms to send the gradients from the client to the central server and further optimizing the hyper parameters for the federated learning network.

## References

- Antonious M. Girgis, Deepesh Data, Suhas Diggavi, Peter Kairouz, & Ananda Theertha Suresh. (2020). Shuffled Model of Federated Learning: Privacy, Communication and Accuracy Trade-offs.
- Nicolas Papernot, Steve Chien, Shuang Song, Abhradeep Thakurta, & Ulfar Erlingsson. (2020). Making the Shoe Fit: Architectures, Initializations, and Tuning for Learning with Privacy.
- Abadi, M., Chu, A., Goodfellow, I., McMahan, H., Mironov, I., Talwar, K., & Zhang, L. (2016). Deep Learning with Differential Privacy. Proceedings of the 2016 ACM SIGSAC Conference on Computer and Communications Security.
- Sashank Reddi, Zachary Charles, Manzi Zaheer, Zachary Garrett, Keith Rush, Jakub Konecny, Sanjiv Kumar, & H. Brendan McMahan. (2020). Adaptive Federated Optimization.

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# Low Complexity Algorithms for Transmission of Short Blocks over the BSC with Sparse Feedback

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## ABSTRACT

Practically speaking, most communications channels are imperfect; noise will interfere with the communications and corrupt transmitted data. In order to combat this, many communications systems utilize feedback- the practice of relaying information regarding received data back to the transmitter- in order to efficiently transmit and decode messages. Research in this field, arguably set in motion by Michael Horstein in 1963, studies this phenomena and ways to mitigate interference. This research builds off an existing algorithm created by Amaael Antonini and Rita Gimelshein, which uses causal encoding over the the BSC (Binary Symmetric Channel), a channel through which binary messages can be transmitted with an equal crossover probability of zeros and ones. It modifies the algorithm to utilize sparse feedback instead of bitwise feedback- sending feedback after a specially determined number of bits have been sent through the channel, rather than after every bit, aiming to increase efficiency without loss in performance.

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Low Complexity Algorithms for Transmission of Short Blocks over the BSC with Sparse Feedback

UCLA Samueli  
School of Engineering

CSL

SUMMER UNDERGRADUATE  
RESEARCH PROGRAM

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INTRODUCTION

Most communications channels are imperfect; noise will interfere and corrupt transmitted data. To combat this, communications systems relay information (regarding data sent to a receiver) back to the transmitter.

Encoder → Channel → Decoder →

The current method uses causal encoding, which simultaneously transmits and verifies bits.

OBJECTIVE

New research modifies the algorithm to utilize sparse feedback: sending feedback after a determined number of bits have gone to the receiver, instead of every bit, to increase efficiency without loss in performance.

MATERIALS

• Matlab • GMP Library • CLion Software • CLion

PARTITIONING

After systematic transmission, we must determine how many partitions we should use for the number of bits being transmitted. We do this by:  $\log_2((1-p)^k)$  Where p is the error probability of the channel, and k is the number of bits to be transmitted.

RESULTS

Channel Error vs. Rate for Binary Set System

Figure 1. Regular Feedback System. ref. A. Antonini & R. Gimelshein

Regular Feedback System

The graph displays the error probability p of the channel against the performance rate (rate at which messages are transmitted & decoded) As the transmitted bits k increase, we approach performance closer to channel capacity.

Transmissions vs Channel Uses for Sparse System

Figure 2. Sparse Feedback System

Sparse Feedback System

The graph displays the transmissions vs channel uses of the Sparse Feedback system. We see that as we increase the transmissions, the channel usage will increase. (Plot shown for block size 2, partition count 4)

SPARSE SYSTEM

16-bit system; all messages have equal probability of being true. Receiver's belief state of each is 1/16. The true message in yellow.

Partition all messages into four sets with equal probability (S0, S1, S2, S3). Transmitter sends data about theta being in a set.

After some communication between the transmitter & receiver, the probability of S0 has gone up, and other sets have gone down.

Rearrange messages within sets so probabilities of each set is close to equal. We then continue the process from steps 2 & 3.

After much repetition, the true message reaches a probability such that it is the only message contained in a set. We enter confirmation phase.

METHODS

Updating Probabilities.

Using GMP library for arbitrary precision + Matlab functionality. Modify the current algorithm to update & merge probabilities of multiple sets. First, recalculate multiple-way probabilities using Bayes' Rule of Conditional Probability, which is:

$$p(B|A) = \frac{p(A|B)p(B)}{p(A)}$$

Must use the error probability p and its complement q, aka (1-p), to calculate probability of the transmitted message.

Merging Probabilities.

We must store all messages with their probabilities in an ordered fashion, so we can later sort through them & partition appropriately. To do this, we place the message structs into an ordered linked list, ordering them by decreasing probability.

Regrouping The Sets.

Reorganize messages into determined number of sets with equal (or close to equal)probability. Use partition (see: sparse system) to organize groups by filling up each probability "bucket" (partition) to a value within tolerance of the target probability. Once message reaches a probability that exceeds a bucket's tolerance, we halve number of partitions.

CONCLUSION

Regular Feedback System

Sparse Feedback System

Binary Set system- splits all messages into one of two sets. Uses a version of ACK/NACK (Acknowledgement/Negative Acknowledgement) feedback to determine probability of theta.

Multiple Set system- finds the ideal number of partitions based on # of k bits. Splits probabilities into the "buckets". Uses more complicated logic to determine probability of theta from a message of multiple bits.

Pros: Simpler logic means less processing time/overhead

Cons: Channel use is less efficient, bitwise transmission and decoding

Pros: Channel use decrease within certain range of tolerance, improved performance

Cons: Limited range of improvement, overhead affected by extra processing

ACKNOWLEDGEMENTS

We would like to thank the National Science Foundation, UCLA Summer Undergraduate Research Program, and UCLA's Fast Track to Success for providing the resources for this publication. We would also like to thank Professor Richard Wesel, and Amaael Antonini for their guidance and support.

REFERENCES

Antonini, Rita G. and Richard Wesel. Causal (Progressive) Encoding over Binary Symmetric Channels with Noiseless Feedback, D1-S3-T1.2, ISIT 2021.



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# High Rate Tail Biting List Decoder using a Dual Trellis

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ABSTRACT

Encoders and decoders in communications systems are critical for the accurate and efficient transmission of information over noisy channels. Our research is focused on encoders and decoders for tail-biting convolutional codes used in conjunction with cyclic redundancy check (CRC) codes. We implement encoders and decoders that correct errors in the received message when possible. Often, when an error cannot be corrected, the CRC informs the decoder that the selected codeword is unreliable. In our research, we extend the work of Liang et al., who demonstrated that the use of distance spectrum optimal cyclic redundancy checks (DSO CRCs), along with list decoding, offered significant improvements in signal to noise ratio (SNR) with minimal additional computational cost for low rate convolutional codes of the form  $1/n$ , which have  $n$  output bits for every 1 input bit. Our research applies this approach to high rate convolutional codes of the form  $(n-1)/n$ , which have  $n$  output bits for every  $n-1$  input bits. Specifically, we implemented the decoder for a rate-3/4 tail-biting convolutional encoder, and used the dual trellis approach proposed by Yamada et al. for efficient decoding, along with the tree-trellis list decoding algorithm proposed by Roder and Hamzaoui. By implementing this system in C++, we have the ability to simulate its performance at low frame error rates and compare it to both the random coding union bound and the performance of a standard maximum likelihood decoder.

High Rate Tail-Biting List Decoder using a Dual Trellis  
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### Introduction

- Transmitting data across noisy channels using high rate convolutional codes and standard maximum likelihood decoding on the encoder-based trellis incurs high decoding costs. To improve efficiency, we implement the dual trellis proposed in Yamada et al. [1], which is based on the parity check matrix of the original code, and improves efficiency for high rate decoding by reducing the number of comparisons performed at each state in the trellis.
- To improve robustness, we built off the work of Liang et al. [5], who demonstrated that for low rate convolutional codes (of the form  $1/n$ ), using distance spectrum optimal cyclic redundancy checks (DSO CRCs), in conjunction with serial list decoding, provided significant improvements to signal to noise ratio (SNR) at a fairly low cost.
- Our work extends this approach to high rate codes (of the form  $(n-1)/n$ ), to identify if such an approach is viable for high rate codes as well.

### Materials

We implemented the dual trellis list Viterbi algorithm with DSO CRCs in C++, and plotted the results in Matlab.

### Methods

- We started by building the maximum likelihood high rate tail-biting decoder, then incorporated the dual trellis, and finally implemented list decoding.
- Fig. 1 on the right outlines the process of evaluating the system.
- For each SNR, we ran trials until we reached 200 frame errors, so our FER would have a statistically significant number of errors.

Figure 1: Evaluating performance of the system

### Convolutional Codes

- Convolutional codes use memory elements in the encoding process to add redundancy to the encoded signal, which can be used to correct errors in the received message.
- Since the outputs are a function of the memory elements and inputs, this can be viewed as a state machine, which we can arrange on a trellis to account for multiple input blocks. For brevity, only one state transition is shown in Fig. 2.

Figure 2: An example of a rate-3/4 convolutional encoder and the corresponding trellis. Each adder is modulo 2, so each value will remain a binary 1 or 0. This encoder has two memory elements, denoted by sigmas.

### Dual Trellis

- For standard maximum likelihood decoding, we want to find the message closest to the received message by comparing all possible paths through the trellis, however, directly enumerating them all is computationally intractable.
- The Viterbi algorithm efficiently finds this sequence by only storing the locally optimal path at each state, upper bounding the number of paths to keep track of at the number of states.
- While highly efficient relative to the naive approach, the Viterbi algorithm on the standard trellis still struggles with high rate codes due to the high number of comparisons needed at each state.
- Using the dual trellis, which is based on the parity check matrix of the code, reduces the number of comparisons needed at each state, improving efficiency despite the larger number of states and state transitions.

Figure 3: In this small example of one state transition, the Viterbi algorithm would discard the lower paths, since they are locally worse than the top path.

Figure 4: Standard (left) vs Dual Trellis (right)

### List Decoding

- Adding DSO CRCs provides a further layer of redundancy to rule out invalid decoded messages.
- If a decoded message fails the CRC check, serial list decoding computes the next most likely path by using the paths that were more likely, but failed the CRC.
- The locally second best path will either be one divergence from one of the locally best paths, or a path corresponding to a different starting state, since more than one divergence will always add additional weight compared to one divergence on its own.
- This can be efficiently implemented by using a red-black binary search tree, as described by Röder and Hamzaoui [5].
- To cap decoding complexity, we fix the list size, which is the maximum number of messages that can be checked.

Figure 5: Valid and Invalid Next Best Path Topologies

### Results

- As seen in Fig. 6, increasing list size offers significant improvements in FER for a given SNR.
- Use of the dual trellis reduced decoding complexity by 75% compared to the standard trellis for a rate-3/4 system with two memory elements.
- Larger list sizes produce less frame errors in the decoded message at the cost of increased decoding complexity.

Figure 6: Frame error rate for list sizes of one and two, using the optimal rate-3/4 code with six memory elements, and a blocklength of 30 bits.

### Conclusion, Future Works, and Limitations

- The improvement to FER provided by the list decoding algorithm, with minor increases in decoding complexity, indicates that the method of using S-LVA with DSO CRC for low rate codes presented in Liang et al. [5] generalizes well to high rate codes.
- We're still working on the software implementation, so this poster only includes data for small list sizes. When fully implemented, we plan to test longer list sizes, as well as varying blocklengths and code rates.
- A high rate tail-biting list decoder using a dual trellis accurately and efficiently decodes transmitted data. However, information theory provides theoretical limits on the performance of any communication system, regardless of decoding complexity.

### References

- [1] Yamada, T. et al. "A New Maximum Likelihood Decoding of High Rate Convolutional Codes using a Trellis".
- [2] Seshadri, N. and Sundberg, C.-E.W. "List Viterbi Decoding Algorithms with Applications".
- [3] Yang, H. et al. "CRC-Aided List Decoding of Convolutional Codes in the Short Blocklength Regime".
- [4] Röder, M. and Hamzaoui, R. "Fast Tree-Trellis List Viterbi Decoding".
- [5] Liang, E. et al. "List-Decoded Tail-Biting Convolutional Codes with Distance-Spectrum Optimal CRCs for 5G".

### Acknowledgements

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## Development of SpectraPlot Application for Broadband Spectral Line Survey

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### ABSTRACT

Laser spectroscopy has been utilized to advance studies and efficiency in various fields such as energy, environment, and aerospace by providing quantitative, species-specific measurements of molecular temperature, pressure, and composition. For accurate measurements of those quantities, measured spectral data are often compared with standard calibrated databases. SpectraPlot is a web-based application that allows its users to simulate spectra and obtain calculations by sourcing from various databases including HITRAN, NIST, AD, and HITEMP. These databases have their own respective libraries of data regarding a large range of gaseous species at different conditions. The objective of this project is to create a relational database server with various spectroscopic databases and to develop application capabilities for broadband spectral simulations and line surveys. MySql was utilized as an efficient tool to manage databases with interconnected data tales and various different data types. In MySql, the server was configured, data was then uploaded as tables into their respective database within the server. When connected to the database server, the Python IDE was used to fetch data remotely and perform spectral simulations and surveys. Fetching data from the relational database is shown to be roughly four times faster (twenty times after connecting to the server), than reading data directly from local text files. Broadband line surveys were then conducted using data fetched from the server and linestrengths of different molecules within the wavenumber range of interest were plotted to provide visualization of results. Along with the line surveys, a hardware search on lasers was performed within the same wavenumber range of interest. The present work will help researchers target specific spectral regions of various species.

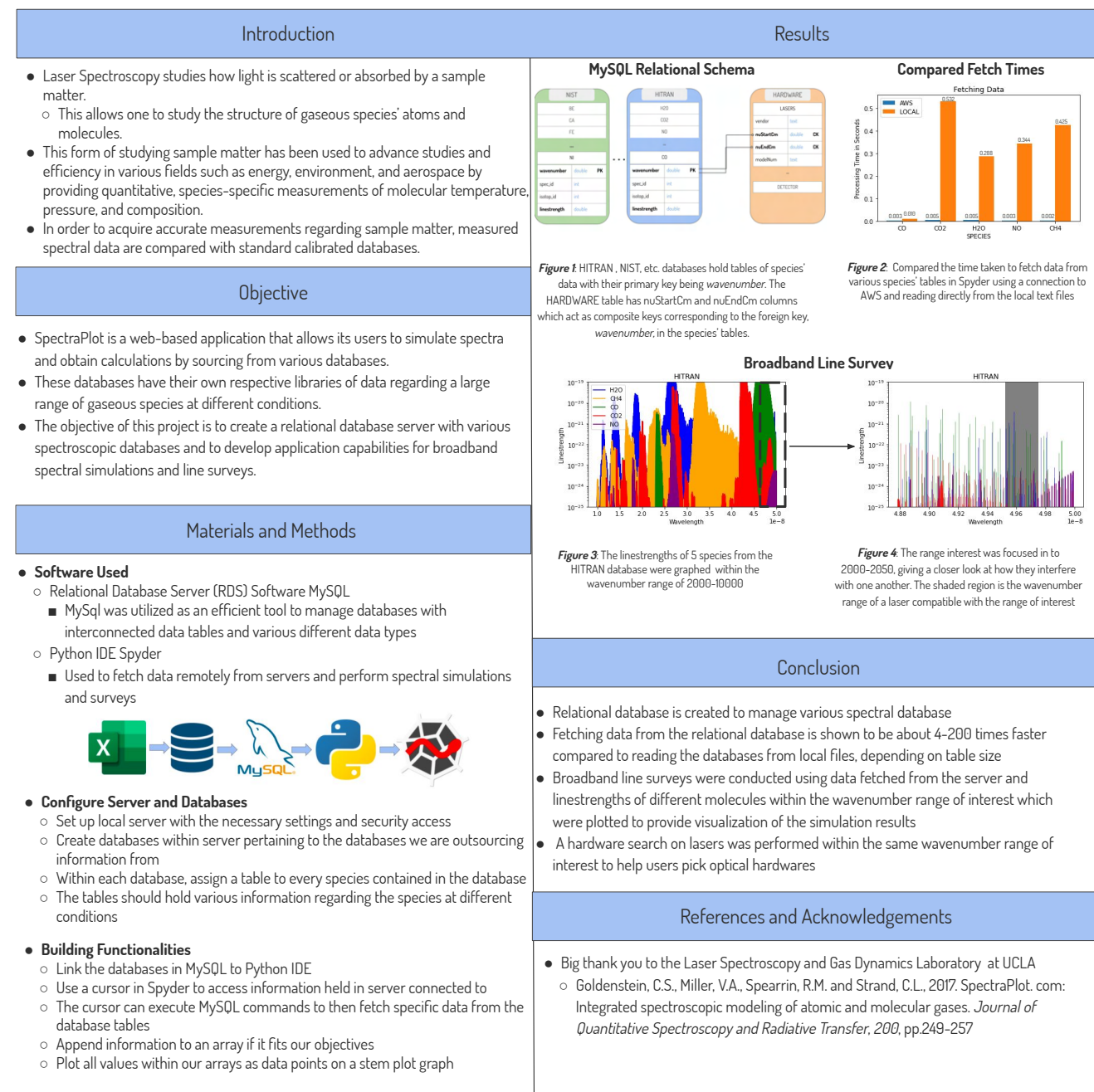


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## Development of SpectraPlot Application for Broadband Spectral Line Survey

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## Can Satellites Actually Measure the Turbidity of the Water in Southern California

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### ABSTRACT

Turbidity is the measurement of how much light passes through a liquid. Turbidity is important to study as particles in turbid water can act as vectors to bacteria. In this study, images taken from the Sentinel-2 satellite measured the turbidity of beaches around Los Angeles. First, we compared satellite-derived turbidity from the Nechad algorithm to in situ turbidity samples, then turbidity was compared to Fecal Indicator Bacteria. This experiment was split up into three parts: first, the total suspended solids (TSS) test, measuring how many particles are in a sample. Second, the fecal indicator bacteria (FIB) test, measuring the probability of how much bacteria is in 100mL of the sample. Lastly, Google Earth Engine (GEE), a cloud-based platform for planetary-scale geospatial analysis, calculated turbidity from the Sentinel-2 satellite. After collecting water samples from Los Angeles beaches for in situ TSS and FIB tests, the correlation was found to be low ( $R^2=0.2$ ), suggesting that the clarity of the water does not translate to how much bacteria was in the sample. Yet, there was a correlation between in-lab TSS and the Turbidity from Sentinel-2 ( $R^2=0.8$ ), indicating that Sentinel-2 accurately measured turbidity. In the future, research should be done to compare TSS from different algorithms, satellites, and different beaches. This would have a major impact on society as satellites would be able to detect whether water is safe to recreate in.

## Can Satellites Actually Measure the Turbidity of the Water in Southern California

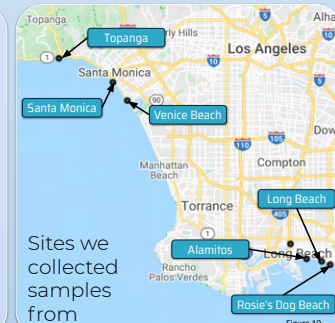
Sophie Wells, Yuwei Kong, Marisol Cira, Ileana Callejas, Professor Jennifer Jay

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Research  
Scholars

### Abstract

Turbidity is the measurement of how much light passes through a liquid. Turbidity is important to study as particles in turbid water can act as vectors to bacteria. In this study, images taken from the Sentinel-2 satellite measured the turbidity of beaches around Los Angeles. First, we compared satellite-derived turbidity from the Nechad algorithm to in situ turbidity samples, then turbidity was compared to Fecal Indicator Bacteria. This experiment was split up into three parts: first, the total suspended solids (TSS) test, measuring how many particles are in a sample. Second, the fecal indicator bacteria (FIB) test, measuring the probability of how much bacteria is in 100mL of the sample. Lastly, Google Earth Engine (GEE), a cloud-based platform for planetary-scale geospatial analysis, calculated turbidity from the Sentinel-2 satellite.



Sites we collected samples from

### Results

#### Part 1 - Total Suspended Solid (TSS)

We noticed that after averaging each one of the tss data for each filter, we got the data seen in Figure 11. (the \* are control filters that we filtered distilled water so we know we are filtering properly) We decided to only take into account the data I collected on July 22nd, 2021.

#### Part 2 - Fecal Indicator Bacteria (FIB)

For each site, there was different values for Total Coliform (Fig. 12), *E. Coli* (Fig. 13) and *Enterococcus* (Fig. 14).

Date Collected	Site	TSS Average (mg/L)
7/22/21	SM1	14.3333
7/22/21	SM2	
7/22/21	SM3	
7/22/21	VB1	
7/22/21	VB2	10.6667
7/22/21	VB3	
7/22/21	AB1	
7/22/21	AB2	27.1111
7/22/21	AB3	
7/22/21	LB1	
7/22/21	LB2	87.6667
7/22/21	LB3	
7/22/21	DB1	
7/22/21	DB2	44.3333
7/22/21	DB3	
7/22/21	*1	
7/22/21	*2	0

Key:  
VB = Venice Beach  
SM = Santa Monica Beach  
DB = Rosies Dog Beach  
LB = Long Beach City Beach  
\* = Control (Distilled Water)

Figure 11

### Materials/Methods

This experiment was split up into three parts:

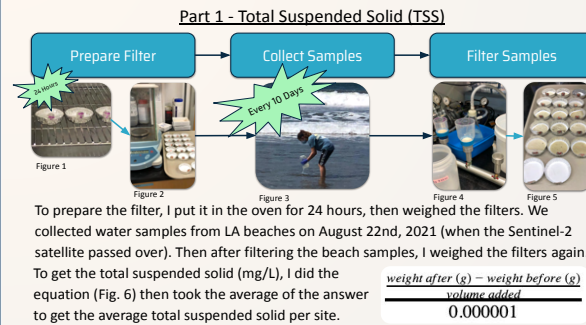


Figure 6

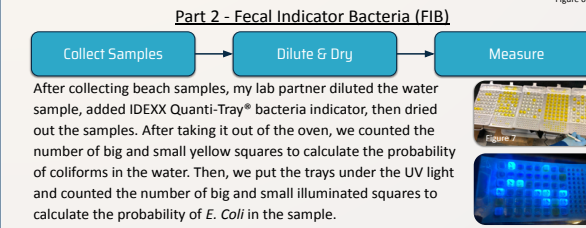


Figure 8

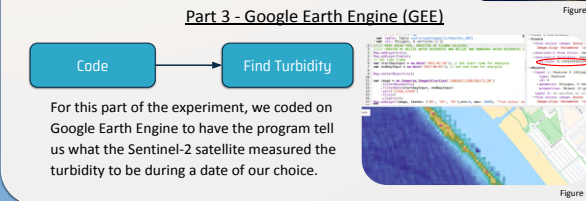


Figure 9

Date	Site	(MPN/100mL)*Dilution
7/22/2021	SM	74
7/22/2021	VB	657
7/22/2021	LB	327
7/22/2021	DB	75
7/22/2021	AB	7270

Figure 12 - TC

#### Part 3 - Google Earth Engine

Also known as the ORCAA tool, I simply pressed a black point seen on Figure 10, and as Figure 9 shows, it gave me the turbidity circled in red.

#### Part 4 - Final Data

We noticed that there was a correlation ( $R^2=.8$ ) meaning that the satellite can accurately measure that the water was not clear (Fig. 16). However, after correlating the TSS with the FIB (Fig 17-19), there wasn't a correlation. This means that murky water doesn't necessarily mean a lot of bacteria in it. So satellites can measure turbidity but not the bacteria.

Site	Date	ORCAA Turb (NTU)
SM	7/22/21	2.744664345
VB	7/22/21	3.850354287
AB	7/22/21	4.139171672
LB	7/22/21	6.369673523
DB	7/22/21	4.14109737

Figure 15

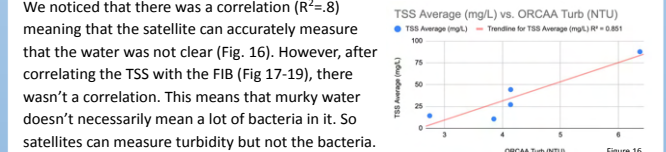


Figure 16

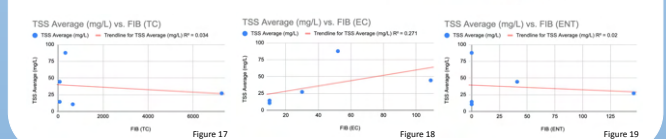


Figure 17

Figure 18

Figure 19

### Conclusion

After collecting water samples from Los Angeles beaches for in situ TSS and FIB tests, the correlation was found to be low ( $R^2=0.2$ ), suggesting that the clarity of the water does not translate to how much bacteria was in the sample. Yet, there was a correlation between in-lab TSS and the Turbidity from Sentinel-2 ( $R^2=0.8$ ), indicating that Sentinel-2 accurately measured turbidity. In the future, research should be done to compare TSS from different algorithms, satellites, and different beaches. This would have a major impact on society as satellites would be able to detect whether water is safe to recreate in.

### Acknowledgement

I would like to thank the Summer Undergraduate Research Program, my professor Jennifer Jay, my daily lab supervisor Ileana Callejas, and my lab partner Yuwei Kong for their help and support on my research.

### References

- Callejas, Ileana A., Christine M. Lee, Deepak R. Mishra, Stacey L. Felgate, Claire Evans, Abel Carrias, Andria Rosado, Robert Griffin, Emil A. Cherrington, Mariam Ayad, Megha Rudresh, Benjamin P. Page, and Jennifer A. Jay. "Effect of COVID-19 Anthropause on Water Clarity in the Belize Coastal Lagoon." *Frontiers*. Frontiers, 12 Apr. 2021. Web. 08 July 2021.
- "Notes from the Field - On the Ground in Belize to Improve How Satellites 'See' Water Quality from Space." NASA. NASA. Web. 08 July 2021.
- Steele, Jim. "Study of How COVID Tourism Decline Affects Belize's Coastal Waters Earns NASA Grant." *The University of Alabama in Huntsville*. The University of Alabama in Huntsville, 24 Sept. 2020. Web. 08 July 2021.
- Written by Brian Spaen, Writer for Green Matters. "Belize's Barrier Reef Is No Longer Endangered." *World Economic Forum*. Web. 08 July 2021.



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# A Personalized Approach to Federated Learning

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## ABSTRACT

Federated learning, a machine learning technique, has been gaining popularity as a method of protecting user data privacy for modern-day devices while still providing a great user experience by only sending model updates to the server instead of exchanging sensitive data. However, utilizing a singular global model is extremely restricting as the data is exceedingly diverse, which limits the global model from maximizing performance for each individual client. This heterogeneously distributed data across multiple clients is the primary motivation in utilizing personalized versions of federated learning. In this research, we implement algorithms that use personalized federated learning techniques such as clustering clients and utilizing temporary models for communication. Various hyperparameters - batch size, local communication rounds, number of clients - are adjusted to maximize the algorithm's accuracy levels. The algorithms are implemented using PyTorch (a machine learning library developed by Facebook's AI Research Lab) and both trained and tested using the CIFAR-10 image dataset. Using random heterogeneously distributed data, the algorithms converge to higher accuracy levels through these personalization techniques when compared to traditional federated learning utilizing a singular global model. Personalized federated learning is a key component within future machine learning applications - such as connecting autonomous vehicles - as it combines the effectiveness of traditional machine learning with crucial cloud security and data privacy protection.



## A PERSONALIZED APPROACH TO FEDERATED LEARNING

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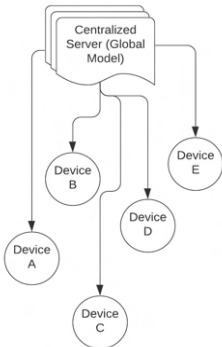
Department of Electrical and Computer Engineering, University of California – Los Angeles



### Introduction

#### Problem

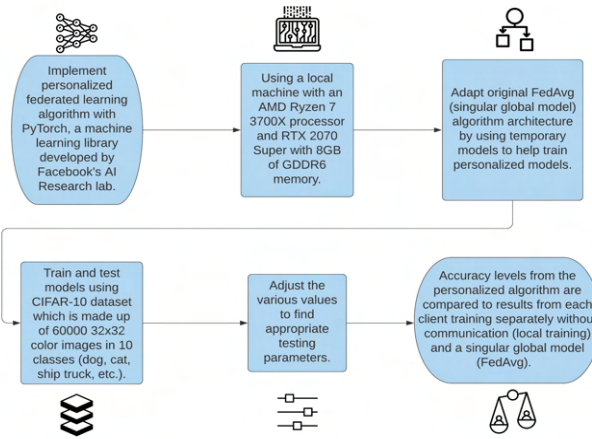
Federated learning struggles with non-IID (non-independent and identically distributed) diverse datasets due to its reliance upon a singular global model for multiple clients (devices). This traditional strategy is limited, as one global model cannot maximize the testing accuracy for different sets of data.



#### Approach

Implement personalized federated learning algorithms. Personalized techniques (client clustering and utilizing temporary models) will result in algorithms converging to higher accuracy levels.

### Materials and Methods



### References

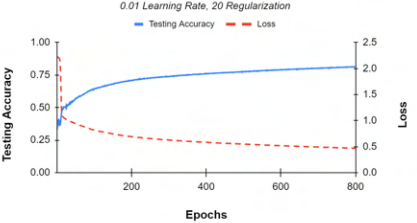
McMahan, H. Brendan, et al. "Communication-Efficient Learning of Deep Networks from Decentralized Data." ArXiv.org, 28 Feb. 2017, arxiv.org/abs/1602.05629.  
Dinh, Canh T., et al. "Personalized Federated Learning with Moreau Envelopes." ArXiv.org, 3 Mar. 2021, arxiv.org/abs/2006.08848.

### Results and Discussion

Setting batch size to 50, local epochs to 20, and number of clients to 6, the hyperparameters of regularization (reg) and learning rate levels are adjusted to achieve the optimized accuracy for the personalized (pFedMe) federated learning algorithm.

FedAvg Individual Client Model (IID)	FedAvg Global Model (non-IID)	pFedMe Personal Model (non-IID)
73%	49%	79%

#### Personalized Federated Learning Results



Learning rate of 0.01 and regularization of 20 converges to the highest testing accuracy rate of 79% for the personalized algorithm. A lower regularization is too slow to converge, while a high regularization will diverge.

	Reg 30	Reg 20	Reg 15	Reg 10	Reg 5
Learning Rate 0.01	76%	79%	78%	77%	74%
Learning Rate 0.05	71%	75%	74%	72%	70%

### Conclusions

Personalized federated learning algorithms allow for models to outperform traditional federated learning algorithms when using non-IID data. Future implementation of other personalized algorithms such as FedFomo will further showcase the advantages of personalization techniques.



These techniques are key components within future machine learning applications (autonomous vehicles, traffic predictions, etc.) as they increase the performance of machine learning models on heterogenous datasets while eliminating data security risks within the cloud.

### Acknowledgements

I would like to thank Kaan Özkara and Suhas Diggavi for their guidance and resources throughout this project. I would also like to thank NSF (REU) for their funding and the UCLA Summer Undergraduate Research Program (SURP) for this research opportunity.



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# Verifying Conditions for Magnetic Alignment in Canine Urination and Defecation with Citizen Science Dataset

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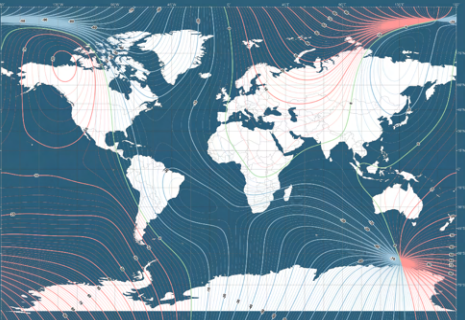
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## ABSTRACT

Numerous species of animals are known to have magnetoreception, or the ability to detect the Earth's magnetic field, for orientation and navigation. However, more research is needed to confirm the underlying mechanics of magnetoreception in animals. Compelling evidence has suggested that dogs align to the Earth's magnetic field during excremental activity if the nearby magnetic field declination, or the difference between true north and magnetic north, is stagnant. Nonetheless, this phenomenon needs a robust source of experimental data before it can be established. We are compiling a large image dataset of urinating and defecating dogs with citizen science and automating the analysis of geomagnetic metadata embedded within these images. We hope to verify whether canine alignment in urination and defecation depends on magnetic field declination. Initial results from a low sample size indicate dogs face random directions even when the percent change magnetic field declination is less than 1%. However, the project will require more image submissions from across the world to yield more refined results. If dogs demonstrate magnetoreception in the course of this project, their potential role as experimental subjects will be pivotal in developing future magnetoreception research.

Previous research suggests **dogs align** with the **Earth's magnetic field** when they **urinate and defecate** if the **magnetic field declination** is **stagnant** at that point in space and time.



World magnetic model of main field declination, the difference between true North and magnetic North, in 2020 [2]. The green curves represent 0 magnetic field declination; the red curves represent positive magnetic field declination, indicating magnetic north is east of true north; and the blue curves represent negative magnetic field declination, indicating magnetic north is west of true north. The thicker curves occur every 10° magnetic north and true north vary from each other.

We seek to establish or refute this fact by **increasing the sample size** with **citizen science** and deploying **metadata extraction** and **automated analysis**.



Scan this to view our website & submit your dog photos!

# Verifying Conditions for Magnetic Alignment in Canine Urination and Defecation with Citizen Science Dataset

Courtney A. Gibbons, Lime Yao, Gina Talcott, Josh Cielo, Greg Damelin, Clarice D. Aiello  
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## Important Concepts

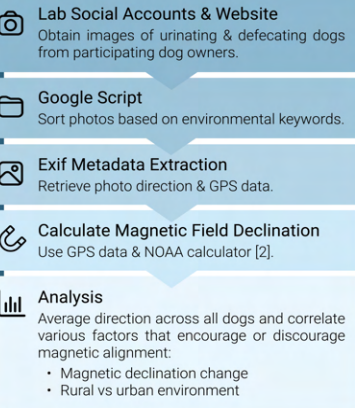
- Magnetoreception:** the ability to detect the Earth's magnetic field.
- Magnetic field declination:** the difference between true north and magnetic north.
- Exif metadata:** information embedded in an image, such as geolocation and camera specifications.
- Citizen science:** when the general public participates in scientific research, often by providing data.

## Researching Magnetoreception in Dogs

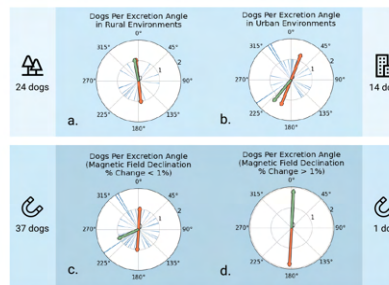
- Previous research suggests **dogs have magnetoreception** and align with the Earth's magnetic field during excremental activity when the magnetic field declination is stagnant [1].
- With a sample size of only 70 dogs located in rural parts of Germany and the Czech Republic, **more research and data is needed** [1].
- We aim to expand the sample size by **compiling a large image dataset** of urinating and defecating dogs with **citizen science** and analyzing the **geomagnetic metadata** embedded within these images.
- We hope to **verify whether canine alignment** in urination and defecation depends on magnetic field declination and environment.

## Fully Automated Image Collection Process

- We asked dog owners to take pictures from behind their dog effectively measuring the dog's magnetic orientation like a compass would, when their dog was urinating or defecating.



## Preliminary Results with a Low Sample Size



- Circular bar plots of excretion angles east of north are sorted by rural (a) versus urban environments (b) and rate of magnetic field declination change below (c) and above (d) %1.
- Red vectors indicate average excretion axis, and green vectors indicate average excretion direction. Vector magnitudes represent the extent of dogs' preference for magnetic alignment towards that direction.
- This preliminary data consisted of only 38 dog images, and the dogs of the current dataset exhibited no preference for a particular angle and faced in random directions.

## Future Prospects and Simulations

- This project will require **more image submissions** from across the world to yield more refined results.
- Simulated plots** indicate the desired result of this project: data from many dogs that allow us to **establish or refute** if dogs align with the Earth's magnetic field when they urinate and defecate.
- Other future prospects include:
  - Update plots on our website every time a new photo is submitted
  - Engage the community by featuring dogs that have contributed to our study
- If dogs demonstrate magnetoreception in the course of this study, their potential role as experimental subjects will be pivotal in developing future magnetoreception research.

## References and Acknowledgements

- [1] Hart et al.: Dogs are sensitive to small variations of the Earth's magnetic field. *Frontiers in Zoology* 2013 10:80
- [2] NCEI Geomagnetic Calculators: Magnetic Declination Estimated Value. National Oceanic and Atmospheric Administration. <https://www.ngdc.noaa.gov/geomag/calculators/magcalc.shtml>
- We would like to thank the National Science Foundation (NSF), the UCLA Summer Undergraduate Research Program (SURP), and the UCLA Fast Track to Success program for this research opportunity. We also thank Professor Clarice Aiello for her knowledge and support.





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Quantifying the Kerr Rotation Angle from the Magneto-Optic Kerr Effect of CoFeB and GdFeCo Films

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ABSTRACT

We explored the magneto-optic Kerr effect (MOKE), which refers to the changes in light reflected from a magnetized surface. In MOKE, the incident circular polarized light becomes elliptically polarized and its axis of polarization rotates after reflection. These changes are termed Kerr ellipticity and Kerr rotation angle, respectively. Our objective is to achieve milli-radian Kerr rotation angle readout resolution on ferro/ferrimagnetic materials, such as CoFeB and GdFeCo, with a MOKE setup at near-normal incidence. By modulating the incident light with a photoelastic modulator (PEM-100), magnetizing the sample by placing it between two solenoids, and extracting voltage signals from a photo-detector with a lock-in amplifier (SR830) and multimeter (Keithley 2000), a magnetic hysteresis loop relating applied magnetic field strength and Kerr rotation angle was generated using MATLAB. The CoFeB sample was a wedge, meaning its thickness changed linearly from 0.4 to 1.4 nm. For this CoFeB wedge, we observed many hysteresis loops along the wedge to find both quantitative Kerr rotation angle and perpendicular magnetic anisotropy at various thicknesses. The GdFeCo film was of uniform thickness, but of a nonuniform makeup as it was a composition gradient from one side being Gd-rich and the other being FeCo-rich. For the Gd-FeCo film, the loops generated near the Gd-rich side neared but did not reach indication of a magnetization compensation point (where the net magnetic moment is 0). Points around the middle of the film were dominated by out-of-plane anisotropy, and the FeCo-rich side displayed predominantly in-plane anisotropy.

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SUMMER UNDERGRADUATE  
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Quantifying the Kerr Rotation Angle from the Magneto-Optic Kerr Effect of CoFeB and GdFeCo Films

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FAST TRACK  
TO SUCCESS  
UCLA Electrical and  
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Introduction and Background

**Magneto-Optic Kerr Effect**

The magneto-optic Kerr effect (MOKE) refers to the changes in light reflected from a magnetized surface.

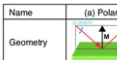
These changes primarily involve Kerr rotation angle, Kerr ellipticity, and intensity.

**Previous Work and Goals**

The limitations of measuring MOKE stem from the extremely small changes that the effect produces, generally below 0.1 degrees. Previous research has explored all geometries of MOKE over a wide range of magnetic materials.

Our objective is to achieve milli-radian Kerr rotation angle readout resolution on ferro/ferrimagnetic materials, such as CoFeB and GdFeCo, with a MOKE setup at near-normal incidence.

**Figure 1: The geometries of MOKE and the changes they introduce to incident light**

	(a) Polar	(b) Longitudinal	(c) Transverse
Name	(a) Polar	(b) Longitudinal	(c) Transverse
Geometry			
Detection	Out-of-plane	In-plane	In-plane
Polarization Variation	Rotation	Ellipticity	None
Measurement	Intensity	Polarization Analysis	Intensity measurement

Results

**CoFeB 10mm to Thick Side**



**CoFeB 10mm to Thick Side**

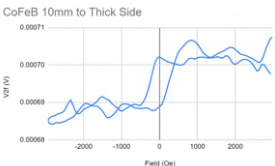


Figure 3: Magnetic hysteresis loops for the CoFeB wedge sample at 10mm to the thick side from the center. Left displays Kerr rotation angle, right displays  $V_{2f}$  for comparison

Figure 3 showcases the out-of-plane anisotropy of the CoFeB wedge sample, as there are two states of Kerr rotation angle corresponding to the two magnetization states. It is worth noting there is noise present in both graphs. In the Kerr rotation angle calculation, the ratio  $V_{2f}/V_{DC}$  is meant to eliminate drift or noise from the  $V_{2f}$  signal, but the  $V_{DC}$  signal itself has noise.

**GdCoFe 10mm to Gd-rich**



**GdCoFe 25 mm to Gd-rich**

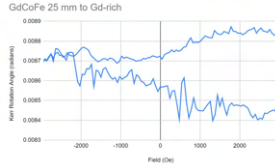


Figure 4: Magnetic hysteresis loops for the GdFeCo composition gradient sample, with one side being Gd-rich and another being CoFe-rich. Length measurements are taken from the center.

The GdFeCo sample had some unexpected results along its length. Figure 4 showcases the most prominent of these oddities, where out of plane anisotropy that is extremely similar to the CoFeB is displayed 10 mm towards the Gd-rich side instead of on the CoFe-rich side. Similarly, the magnetization compensation point, which should be in the middle of the sample, did not show, but 25mm towards the Gd-rich side, which is nearing the edge of the sample, a magnetic hysteresis loop bearing some resemblance to what would normally indicate a magnetization compensation point shows.

**Conclusions and Future Prospects**

Generating the CoFeB sample's hysteresis loops was more demonstrative as it showcased perpendicular magnetic anisotropy and verified the functionality of our setup. However, the GdCoFe sample and the data collected was far more unexpected. We attribute the irregular behavior to the sample, and suspect that the Gd was at no point dominant over the CoFe, and in the future we would certainly like to examine a GdCoFe sample with a centered magnetization compensation point

Ultimately, the data presented here possesses a signal to noise ratio doesn't quite meet the standard we had hoped for. We have a proposed solution that unfortunately the timescale of this project did not allow for, which was to doubly modulate the light with an optical chopper, then add a lock-in amplifier to read  $V_{DC}$  with significantly less noise.

**Acknowledgements**

We would like to thank the National Science Foundation for funding this research project and UCLA ECE Fast Track for the organization of this experience. Finally, we would like to thank Professor Kang Wang, Bingqian Dai, Hanshen Huang and the Device Research Laboratory for giving us this opportunity and their patience, mentorship, and support.

**References**

[https://www.researchgate.net/figure/illustration-of-the-polar-magneto-optical-Kerr-effect-MOKE-Linearly-polarized-light\\_fig1\\_318002760](https://www.researchgate.net/figure/illustration-of-the-polar-magneto-optical-Kerr-effect-MOKE-Linearly-polarized-light_fig1_318002760)

<https://www.hindsinstruments.com/techniques/moke/>

**Experimental Setup**

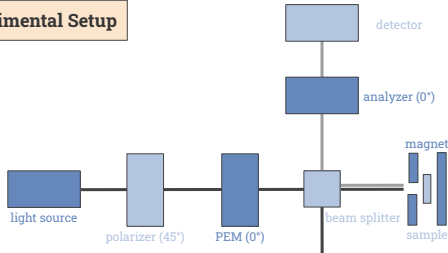


Figure 2: Labeled Diagram of Experimental Setup

**Data Collection**

1. Adjust the Sample Position

The CoFeB wedge sample has linearly changing thickness (0.4-1.4 nm) along its length, and the GdFeCo is a composition gradient along its length. Adjusting where the beam shines on the sample produces a different result.

2. Align the Laser and Equipment

Angle the sample in the magnet so that the laser reflects to the beam splitter at its brightest. Line up the analyzer and detector with the reflected beam until the lock-in amp reads a steady voltage

3. Run the Matlab Program

Run the Matlab program that causes a current sweep from a max to min value at a designated step. A text file containing all the pertinent measurements will be saved.

4. Graph the Data

Using a graphing software, graph Kerr rotation angle (of which the formula is given below) vs magnetic field.

$$\theta_k = \frac{\sqrt{2}}{4J_2} \frac{V_{2f}}{V_{DC}}$$

$\theta_k$  = Kerr rotation angle  
 $V_{2f}$  = PEM 2nd harmonic  
 $V_{DC}$  = DC signal  
 $J_2$  = Bessel function coeff.

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## Solving Large-Scale Non-metric Multidimensional Scaling Problems Using ADMM Optimization

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### ABSTRACT

Analysis of the relative orderings of the differences between model predictions as opposed to a quantitative method is often required in cases such as customers expressing their preferences instead of giving numerical scores. The purpose of this research project is to use an algorithm based on the alternating direction method of multipliers (ADMM) to solve large-scale non-metric multidimensional scaling (NMDS) problems. The NMDS problem seeks to optimize the Gram matrix of the calculated position vectors by minimizing violations of the inequality constraints that express the ordering relations of their pairwise distances. ADMM is a method for large-scale optimization which splits variable  $x$  into two parts and performs alternating optimizations over each part. The problem is coded using Python and Matlab, allowing us to see what fraction of the ordering of the original distances is preserved. We are working with randomly generated datasets. We are also working with more interesting data, including Swiss Roll and S curve data generated using Python, and real-world data such as sets of related images. For our initial results, which did not include any code for ADMM, the fraction of the ordering of distances preserved was quite high, indicating that the relative ordering of the original distances was preserved overall.

## Solving Large Scale Non-metric Multidimensional Scaling Problems Using ADMM Optimization

Tiffany Tsou and Ivy Zhang

Professor Lieven Vandenberghe, Xin Jiang, Taylor Chung



### INTRODUCTION + OBJECTIVE

The goal of this research project is to use an algorithm based on the alternating direction method of multipliers (ADMM), to solve large-scale non-metric multidimensional scaling (NMDS) problems with randomly generated datasets and more interesting and real-world datasets such as the Swiss roll, S curve, and related images. Our hypothesis is that the calculated Gram matrix will preserve the ordering of the original distances between points in our initial dataset.

### PRINCIPLES

**NMDS:** attempts to preserve the original distances between inputs in a dataset.

**ADMM:** a method for large-scale optimization which performs alternating optimizations over two vector variables  $x$  and  $y$ .

**Convex optimization:** a convex objective function is subject to inequality constraints that are summarized by a slack variable that we seek to minimize.



Figures: S curve and Swiss roll.

Source:  
<https://www.semanticscholar.org/paper/Nonlinear-Manifold-Learning-6-454-5dmmmary-lhler/62bc7175071813e7c9c4ac62215d31b06e45da98/figure/0>

### MATERIALS

Python: Optimization package cvxpy  
Matlab: Optimization package CVX  
Datasets: Random datasets of size 50, Swiss roll dataset, S curve dataset, images

### METHODS

1. Generate datasets with random data points, Swiss roll, S curve, images.
2. Code optimization problem along with ADMM solution into Python and then into Matlab.
3. Analyze results in Python and Matlab.
4. Make necessary adjustments to code and repeat.

$$\begin{aligned} \min_{K, \xi_{ijkl}} \quad & \sum_{(i,j,k,l) \in S} \xi_{ijkl} + \lambda \text{Trace}(K) \\ \text{subject to} \quad & k_{kk} - 2k_{kl} + k_{ll} - k_{ii} + 2k_{ij} - k_{jj} \geq 1 - \xi_{ijkl} \\ & \sum_{ab} k_{ab} = 0, \quad K \succeq 0. \quad (\text{GNMDS}) \end{aligned}$$

This is the optimization problem with inequality constraints represented as linear equations of Gram matrix  $K$  which define a unique  $K$  which can solve the problem and have specifications that disallow translations, rotations, and scalings of  $K$ .  
Source: Agarwal et al.

$$\begin{aligned} \text{minimize} \quad & \sum_{k=1}^m \max\{0, u_k\} + \lambda \mathbf{1}^T x + g(x) + h(y) \\ \text{subject to} \quad & \begin{bmatrix} I & 0 \\ 0 & I \end{bmatrix} \begin{bmatrix} x \\ u \end{bmatrix} + \begin{bmatrix} -I \\ -A \end{bmatrix} y = \begin{bmatrix} 0 \\ \mathbf{1} \end{bmatrix}. \end{aligned}$$

This is the optimization problem in an ADMM-ready form, which consists of first optimization over  $x$  and  $u$ , then optimization over  $y$ , and lastly the dual update. Source: Boyd et al.

### RESULTS

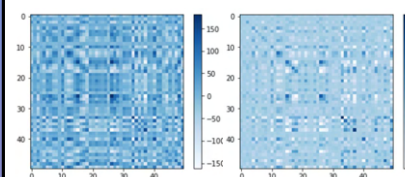
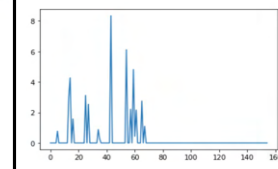


Figure: Shows the original Gram matrix calculated from the original distances matrix (left) and the calculated Gram matrix obtained by solving the non-metric multidimensional scaling problem (right).

Figure: Shows the values of the slack variable (error); ordering of distances is overall preserved.



### REFERENCES

Agarwal, S., Wills, J., Cayton, L., Lanckriet, G., Kriegman, D., & Belongie, S. (2007, March). Generalized non-metric multidimensional scaling. In Artificial Intelligence and Statistics (pp. 11-18). PMLR.  
Boyd, S., Parikh, N., & Chu, E. (2011). Distributed optimization and statistical learning via the alternating direction method of multipliers. Now Publishers Inc.

### ACKNOWLEDGEMENTS

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# Reinforcement Learning in an Imperfect Information Game

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ABSTRACT

Reinforcement learning (RL) has been a growing subset of machine learning with increasing success and promise - but it has just begun to be used in complex, multiplayer environments and games. An agent learns in a complex environment through trial and error, beginning from fully random trials and finishing with sophisticated actions. We apply RL to the imperfect information game known as Liar's Dice, which presents a challenging mix of two-player dynamics and partial information to explore. The game forces players to call bluffs and doubt opponents while reading others' potential actions. Implementing reinforcement learning to imperfect information games allows us to find successful strategies and models in dynamic Markov Decision Process (MDP) environments that require sequential decision making. Utilizing both Python and MATLAB, we employed the popular Q-learning method of RL to train agents that begin with random actions or to use a combination of fixed strategies against others. An agent employing Q-learning improved its win rate from 50% to only 65% within 1,000,000 episodes against a simple agent. On the other hand, an agent that made decisions based on various fixed strategies available increased its win rate from 11% to 77.7% with 100,000 episodes. Those varying speeds demonstrate the difficulty of learning and the variability of Q-learning in a game with partial information. In future work, we may compare counterfactual regret minimization and more state-of-the-art RL algorithms, which would expand our understanding of various methods of a partially observed, dynamic environment such as Liar's Dice. By studying this game, we hope to one day broaden our results to the education space, a similar Markov process where individuals also make decisions sequentially. Using intervention tools such as quizzes and lectures, the interactions between students and instructors may be refined to improve student learning outcomes.

## Reinforcement Learning in an Imperfect Information Game

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### Introduction

- As an imperfect information game, players in Liar's Dice are not omniscient.
- To find optimal strategies and models in dynamic Markov Decision Process (MDP) environments that require sequential decision making, we coded and tested out various agents to find key aspects.
- We applied reinforcement learning (RL), particularly Q-learning, to assist us with producing results regarding the most effective methods.

### Key Terms

- Q-learning is an off-policy RL algorithm, and it learns from outside the policy taking random actions.
- SARSA is State-Action-Reward-State-Action on-policy RL algorithm and it updates the policy based on taken actions.

### Game Rules

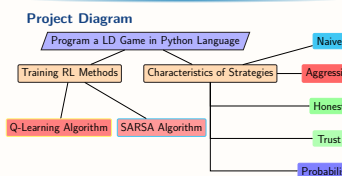
Within the scope of our work, Liar's Dice is a two-player game, where each player rolls 5 dice and has visual access solely to their own hand.

The first player begins bidding and announces any face value (max of 6) and the number of dice (max of 10). The other player has two choices: they may make a higher bid with a larger face or quantity, or they may call "liar," whereupon all dice are revealed to examine the bid. The winner is determined by the validity of the latest bid.

### Objectives

We aim to employ reinforcement learning methods, particularly Q-learning and SARSA algorithms, to attempt to outperform fixed strategies and, ultimately, beat a human player.

### Methods



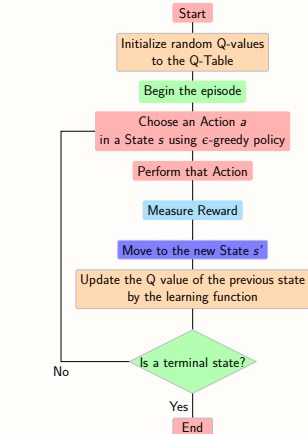
- Set up a sequential environment where an agent's current actions influences its future moves across different episodes.
- Generate a series of game strategies as a baseline.
- Establish two reinforcement learning algorithm methods, tabular and meta-RL, to learn to play against other bots.

### Tools

#### Baseline Bots (Fixed Strategies Agents)

- Naive: Makes a valid random bid.
- Honest: Calls the smallest honest bet in its hand.
- Aggressive: Calls the highest honest bet in its hand.
- Trusting: Makes a bid based on the opponent's call or calls the lowest bid in its hand.
- Probabilistic: Calculates the probability of calls and makes a move based on the results.

### A Reinforcement Learning Bot



The Q-learning equation:

$$Q(s, a) = Q(s, a) + \alpha[R + \gamma \max_{a'} Q(s', a') - Q(s, a)] \quad (1)$$

The SARSA-learning equation:

$$Q(s, a) = Q(s, a) + \alpha[R + \gamma Q(s', a) - Q(s, a)] \quad (2)$$

### Results and Analysis

#### Part 1: Examined Fixed Bots' Performance

	NaiveAg	HonestAg	ProbAg	MixedAg
Human	90%	80%	60%	55%

Figure 1: By playing 25 games, we may evaluate the strengths and weaknesses of each bot. A human can beat the naive and honest agents easily after 3 to 4 games. Since we programmed the various agents with a particular functionality, we are able to quickly distinguish the strategy that the bot employs. The mixed agent, an advanced version of trust, honest, aggressive, and probabilistic agent combined, is more effective against humans.

#### Part 2: RL Bots' Performance

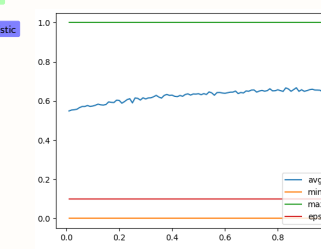


Figure 2: Q-learning agent begins with random actions and learns effective strategies against the naive agent over 1 million episodes of the game with constant epsilon  $\epsilon = 0.1$ . As this algorithm is a direct tabular Q-learning approach with more than 2 million Q-values, its learning curve is flat with a low slope value.

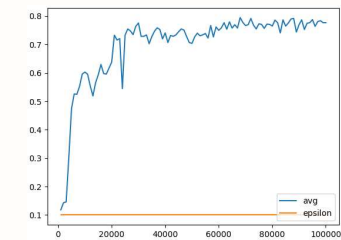


Figure 3: Within 100,000 episodes, the meta/combination agent quickly learns the optimal strategy to utilize in a game with  $\epsilon = 0.1$ .

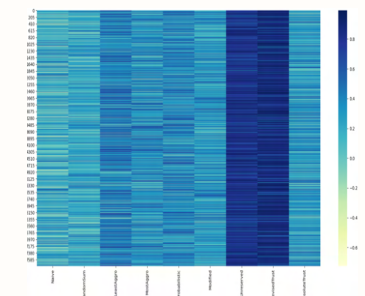


Figure 4: Q-table visualization of the most effective strategy that the meta agent learns to choose. It is trained to determine that the naive agent is a poor selection, while the probabilistic and trust agents are optimal choices. Lighter colors display lower Q-values, whereas deeper colors represent higher values and the most successful strategies.

### Conclusion

The agent employing Q-learning generates a better performance by learning to choose an optimal action compared to other fixed strategies. However, this study indicates that the true Q-learning model is slow and requires innumerable training episodes - at least 2 million - to learn effectively.

In future work, we plan to explore counterfactual regret minimization and the ReBel Facebook algorithm to reverse the downsides of our model and ultimately apply reinforcement learning to other dynamic environments that require sequential decision making, such as education.

### References

- [1] Brown, N., Bakhtin, A. (Dec 03, 2020). ReBel: A general game-playing AI bot that excels at poker and more. <https://ai.facebook.com/blog/rebel-a-general-game-playing-ai-bot-that-excel-at-poker-and-more/>
- [2] Sutton, Richard, Barto: Andrew G. Reinforcement Learning An Introduction, The MIT Press.
- [3] [http://www.en.wikipedia.org/wiki/Liar\\_Dice](http://www.en.wikipedia.org/wiki/Liar_Dice)

### Acknowledgements

We would like to thank the National Science Foundation for funding our research project through the UCLA Summer Undergraduate Research Program. We especially thank Dr. Greg Pottie, who has given us incredible guidance since the first day and our daily lab supervisors, Sunay Bhat and Jeffrey Jiang for their support and resources.



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# Flexible Prined Circuit Boards for Panofsky Quadrupole Electron Beam Guiding

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## ABSTRACT

Electron beam therapy (EBT) utilizes electrons to kill cancer cells with up to 60% less radiation affecting surrounding healthy tissue compared to photon-based radiation therapies. EBT typically uses cm-scale beams; this project focuses on using Panofsky quadrupoles to guide sub-millimeter beams in a flexible and changeable trajectory so that beam placement, and therefore treatment outcomes, are improved. Flexible Printed Circuit Boards (PCBs) were designed in a Panofsky quadrupole-like geometry, which consists of parallel copper traces that generate a quadrupolar magnetic field. The flexible material of the PCB allows for manipulation of electron beams in hard-to-reach areas for deeper tissue treatment. Joule heating of the PCBs was simulated in COMSOL Multiphysics, and the limiting current density extracted. The limiting current density was used in magnetostatic simulations to find the magnetic characteristics of these devices. Particle tracing simulations were then performed to investigate efficiency of guiding electrons at different curvatures of the flex-PCB. Flex PCBs were fabricated for testing and the thermal response of the PCBs was experimentally measured using a FLIR OnePro thermal camera.

## Flexible Printed Circuit Boards for Panofsky Quadrupole Electron Beam Guiding

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### Introduction

Flexible printed circuit boards were designed, simulated, and tested for potential use in Electron Beam Therapy (EBT) treatments.

EBT is a cancer treatment currently administered to patients around the world. It is highly effective and valued for its ability to treat tumors without causing excessive damage to surrounding healthy tissue. This makes EBT ideal for surface tumors, but treatment can improve with greater precision and control of electron beam placement.

### Objectives

- Design smaller, cheaper, and easier to manufacture quadrupoles using Printed Circuit Board (PCB) technology.
- Test characteristics of these PCB quadrupoles to determine if they are feasible for use in real applications using simulations.
- Check if the quadrupoles still work even if they are bent.
- Measure thermal response with manufactured PCB designs.

### Principles

Electrons are influenced by magnetic fields. This behavior is demonstrated in this research project using flexible printed circuit board (Flex-PCB) technology to induce magnetic fields via electric current. Flex-PCBs used as Panofsky quadrupoles guide electrons, focusing them in one axial direction.

A configuration of magnets as shown in Fig. 1 create a magnetic field focusing beams of charged particles.

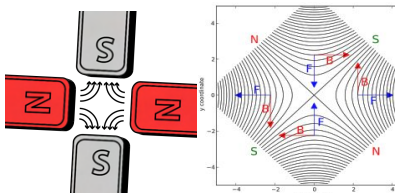


Figure 1: A quadrupole created by four permanent magnets with magnetic field direction.

Figure 2: Magnetic force diagram of quadrupole configuration. Forces focus in vertical direction, and push away from the center in the horizontal direction.

Quadrupoles can be created using either permanent or electromagnets. Electromagnets are generally preferred as they are more easily controlled, allowing adjustment of the amount of current going through to achieve a desired magnetic field strength.

Quadrupole fields linearly vary with the distance from the beam axis. The field gradient of the quadrupole describes how fast the field strength changes with respect to distance from the center.

A higher value for this parameter means that particles feel a stronger force towards/away from the center.

### Materials and Methods

#### 01 CREATE A PCB DESIGN

- Determine magnetic properties of design using FEMM.
- Use Python to simulate electrons passing through multiple quadrupoles.
- Create Gerber files to send to the PCB factory for fabrication.

#### 02 SIMULATE IN COMSOL MULTIPHYSICS

- Joule heating of PCBs was simulated and current density limits extracted.
- The limiting current density was used in magnetostatic simulations to find the magnetic characteristics of these devices.
- Particle tracing simulations were then performed to investigate efficiency of guiding electrons at different curvatures of the flex-PCB.

#### 03 TESTING OUR DESIGNS

- PCBs were bought and tested with various amounts of current.
- Thermal response was recorded using FLIR OnePro thermal cameras.
- The results were compared to expected results from simulations.

### Simulational Data

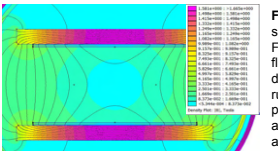


Figure 3: A cross sectional magnetic FEMM simulation of a flex-PCB Panofsky device with current running out of the page. The field lines are similar to that of an actual quadrupole.

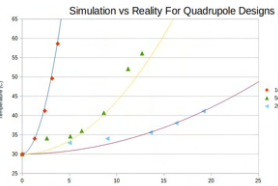


Figure 4: Our heating simulation results (shown by the colored lines) versus experimental results (shown by the data points). The simulation tracks the experimental results closely.

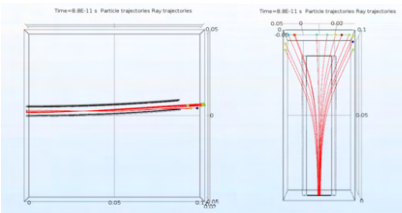


Figure 5: Particle tracing with electrons traveling at 10 MeV. (Left) View from the side. The electrons are following the bent quadrupole (with a 1 meter radius of curvature), and the electrons are focusing at around the 0.03 meter mark. (Right) View from the top. The simulation clearly shows that the electrons are defocusing, as predicted.

### References

D. C. Meeker, Finite Element Method Magnetics, Version 4.2  
Magnetic field of an idealized quadrupole with forces.svg. (2021, June 1). Wikimedia Commons, the free media repository.  
Magnetic quadrupole moment.svg. (2020, September 27). Wikimedia Commons, the free media repository.

### Test Results

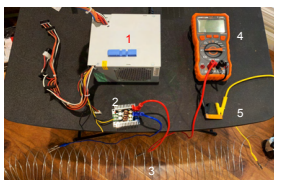


Figure 6: The test setup used consists of a 12V power supply (1), a buck converter (2), steel wire as a variable resistor, (3) and a multimeter to measure current (4). The quadrupole being tested is at (5).

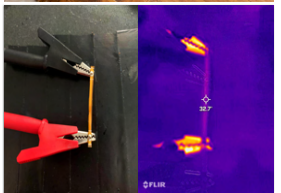


Figure 7: (Left) A picture of the quadrupole under test, with alligator clips to provide current. (Right): A picture of the same quadrupole but imaged with a thermal camera. The PCB is getting slightly warm in the picture.

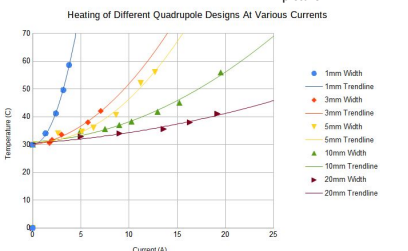


Figure 8: A plot of the temperature of the quadrupoles versus the amount of current passing through them. The temperature increases quadratically with respect to the current as predicted by Joule's Law of Heating. Due to outgassing, only a temperature increase of 10 degrees is allowed. The data shows that pulsed power is necessary for our PCB quadrupoles to reach the required field strength, otherwise overheating would occur with DC currents.

### Conclusions and Applications

Flexible Printed Circuit Boards are viable for use in Panofsky quadrupole electron guiding, but they require pulsed power. Research can further explore the limitations of different designs and their use for Electron Beam Therapy application.

The next step with this research would be to conduct real life tests with electron beams to determine how well the quadrupole directs beams. We could also determine how the quadrupole performs when bent at various angles. A suitable power supply for driving the quadrupole would also need to be designed in order to provide the pulsed power.

In the future, better designs using thicker copper or using superconductors could be created to mitigate heating issues and allow for continuous operation without overheating. A separate cooling system using heat pipes to dissipate heat could also be used.

### Acknowledgements

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SURP is an umbrella program that administers and scaffolds summer undergraduate research opportunities within UCLA Samueli Engineering. SURP participating sub-programs include National Science Foundation (NSF) Research Experience for Undergraduates (REU) Sites, Samueli Research Scholars (SRS) Program, Faculty-funded grants, and Electrical and Computer Engineering Fast Track Program.

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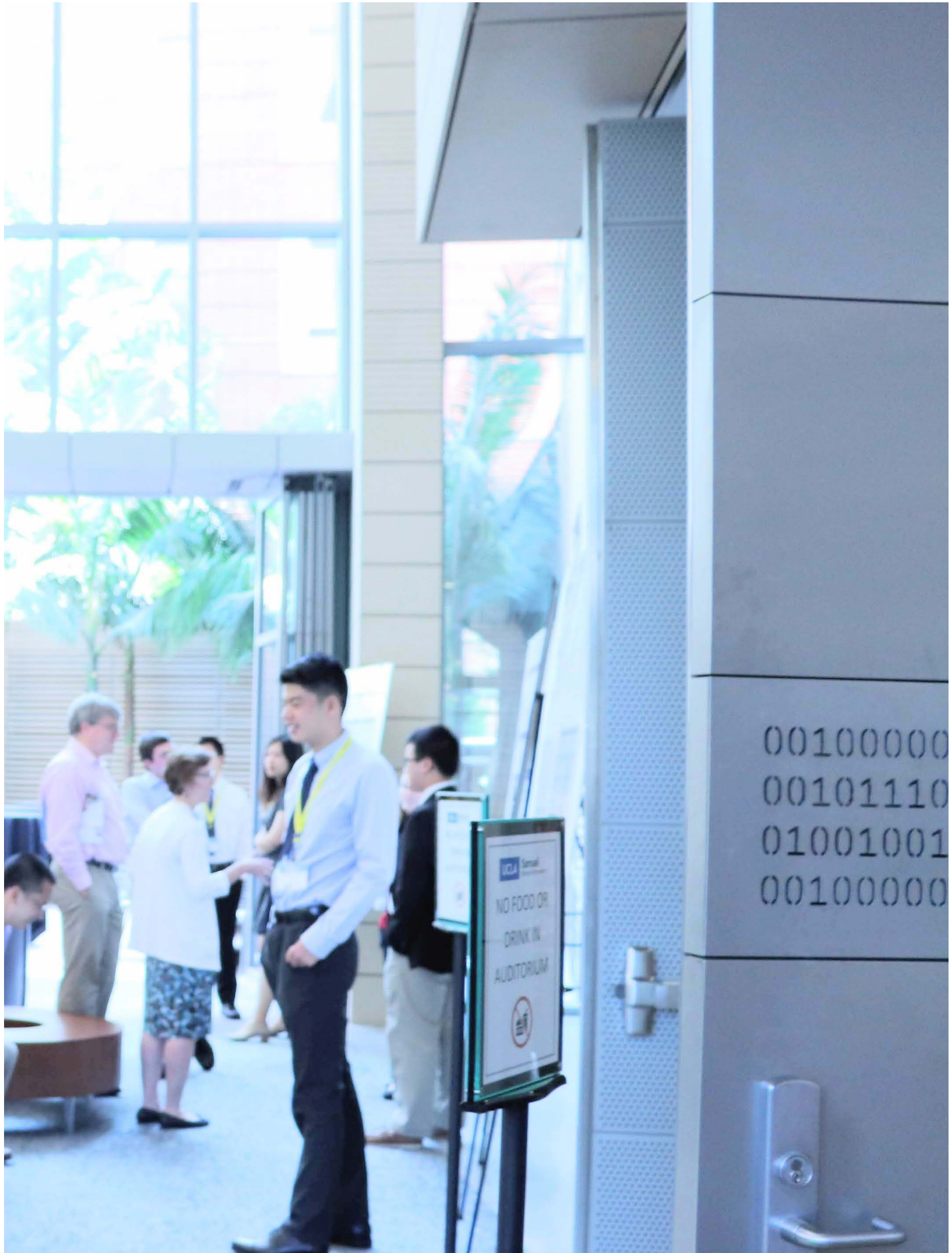
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