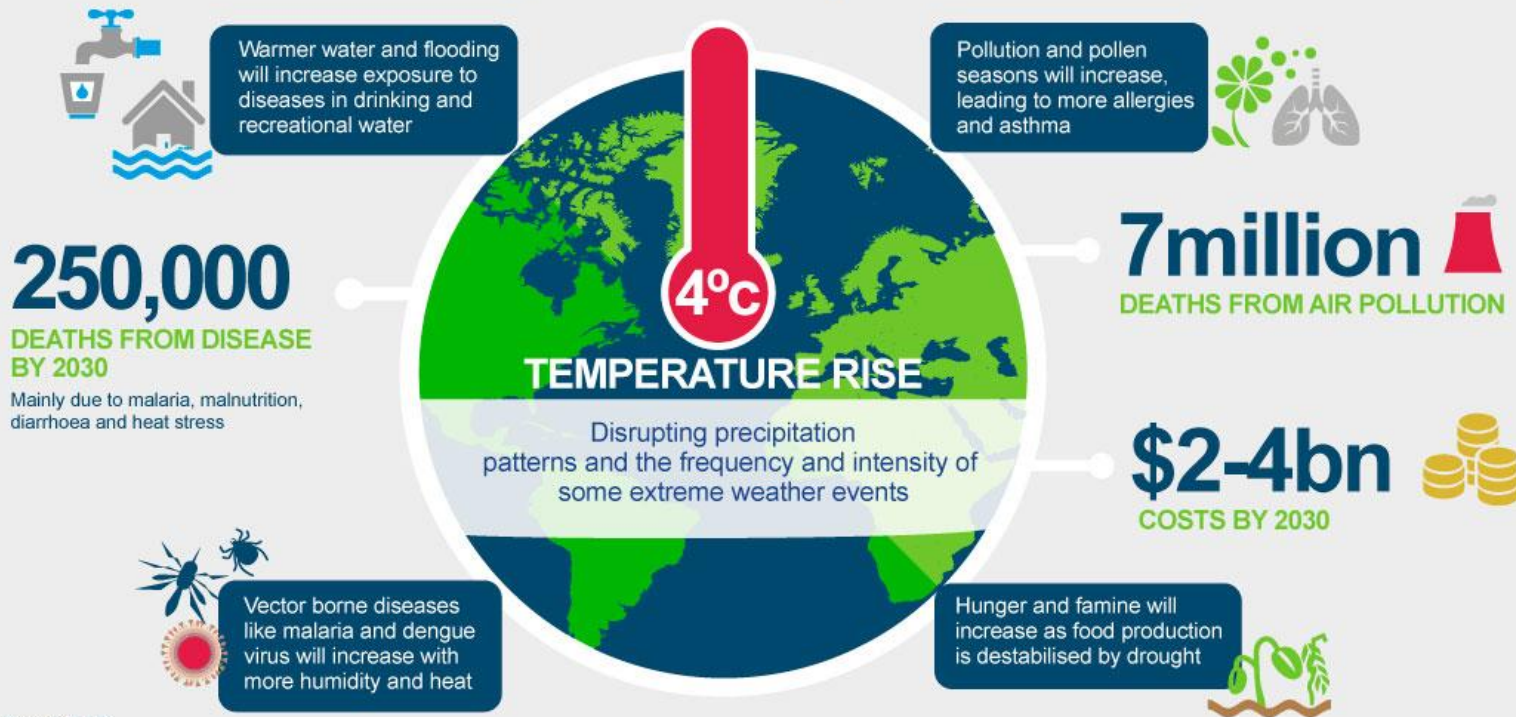


# **A Smart Space Initiative for Zero Waste**

Primal Pappachan

# How climate change could impact the world



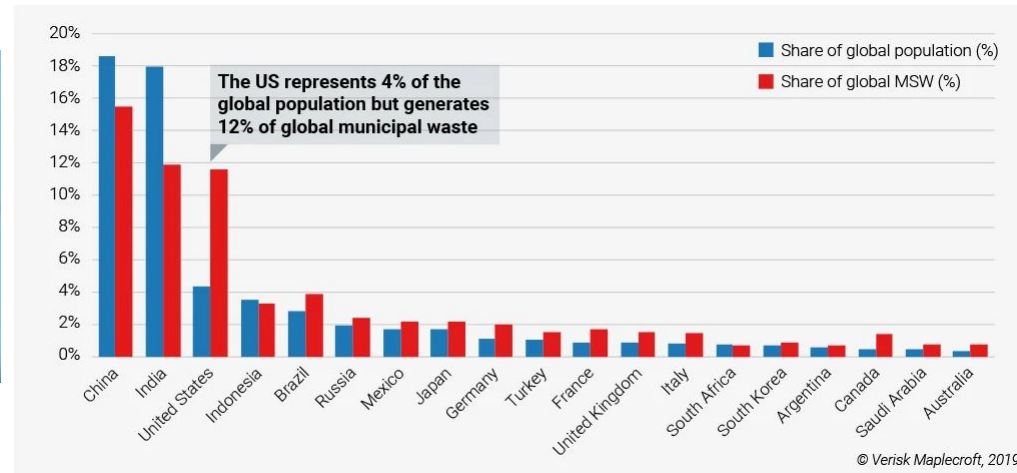
Source: WHO

Credit: Rebecca Robinson/LSHTM

# Waste Management contributes to Climate Change



Source: EPA Reports 2018



# Better Waste Practices - 5 R's



## REFUSE.

### SAY NO TO SINGLE USE PLASTICS.

Back up your NO with a reusable item ready on hand. Bring to-go containers such as lunchboxes, tumblers, and eco-bags.

## REDUCE

### STOP BUYING NON-ESSENTIALS.

As much as possible, avoid non-recyclable or non-compostable packaging. Reduce waste by buying goods with little to no packaging.



## REUSE

### KEEP ITEMS OUT OF THE LANDFILL.

Always find a way to keep an item out of the landfill by keeping it in great condition, repairing or upcycling it when it breaks. Don't throw away anything if you can still squeeze some use out of it.

## ROT

### LET IT ROT.

For biodegradable waste such as food scraps, let it rot. Separate them from other types of waste. Set up a compost system for your food scraps.



## RECYCLE

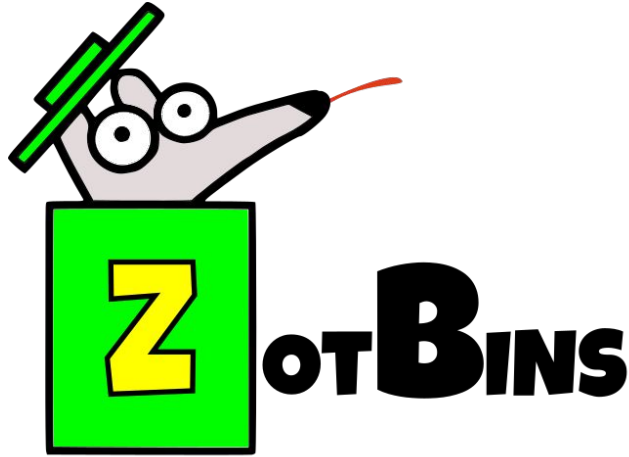
### THE LAST RESORT.

If you can't refuse, reduce, reuse, or rot it, then and only then should you recycle it. Research on the recycling systems of your area and work from there.



# Zero Waste as a Movement





## **A Smart Space Initiative for Zero Waste**

Help keep communities clean, make waste management more efficient, and encourage the practice of zero waste

# Focus of ZotBins



Waste Sorting

Waste  
Management

Waste Education

# Waste Sorting





# Waste Sorting

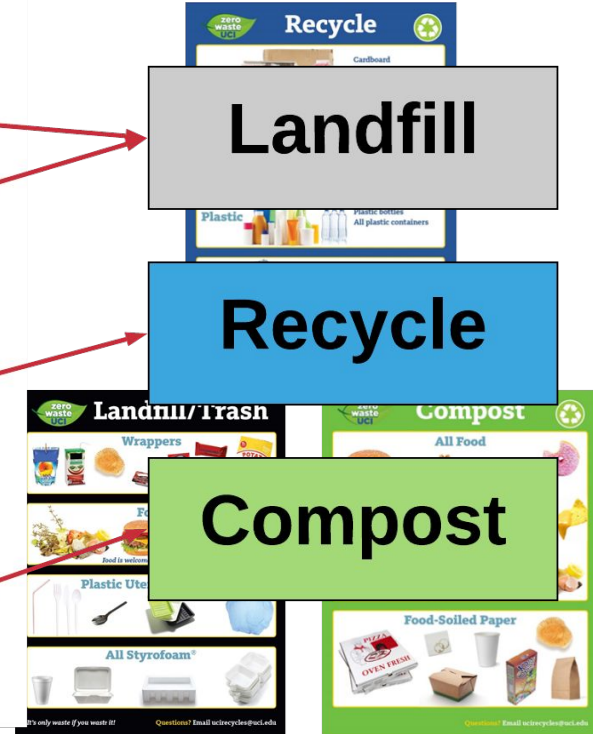




# Waste Management overhead



# Waste Education



What is the solution?

*“Another has developed a “**smart bin**” that uses image recognition to track how much food is wasted in a house or business. It gives you a report on how much you threw away, along with its cost and its carbon footprint. The system may sound invasive, but giving people more information can help them make better choices.”*

**BILL GATES**

---

**HOW TO  
AVOID A  
CLIMATE  
DISASTER**

---

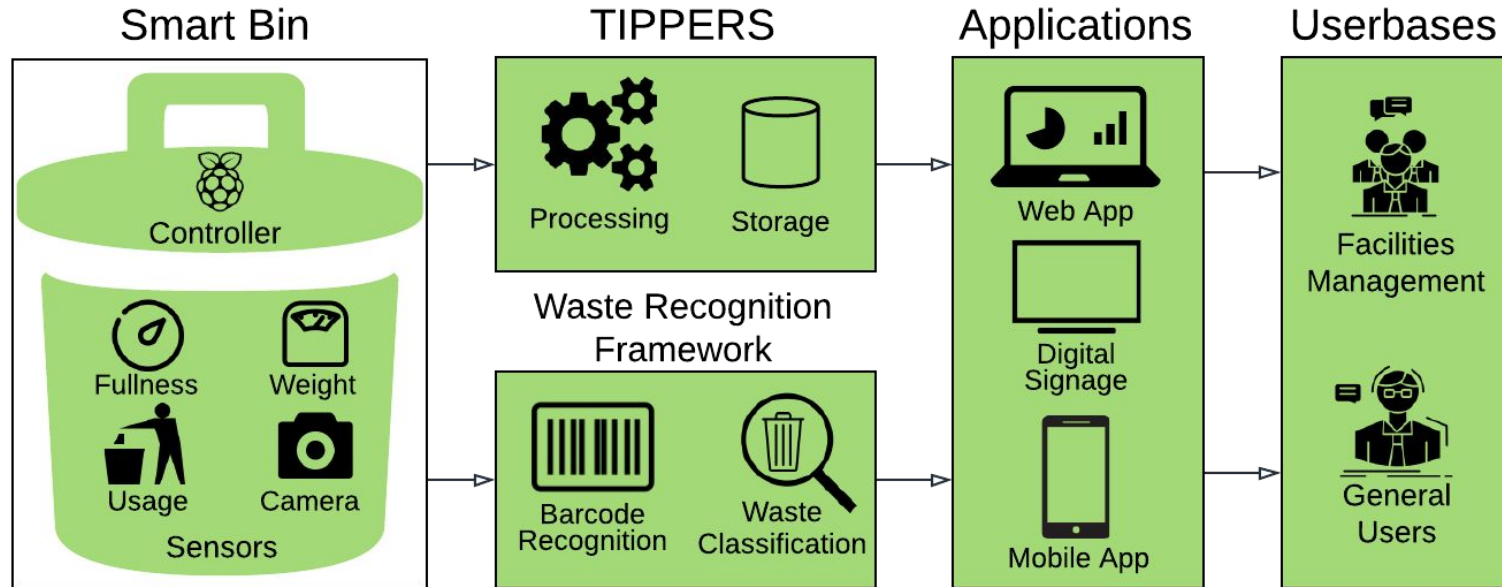
**THE SOLUTIONS WE HAVE AND THE  
BREAKTHROUGHS WE NEED**

---

# Transforming Waste Management



# ZotBins System Overview





# Smart Bin

- A smart bin is a regular bin equipped with **microcontroller and multiple sensors** that is connected to the internet
- Ideally deployed in a set (landfill, compost, recycling) but some are deployed individually
- The main challenge in building the smart bin are the placement of sensors
  - Accurate measurement
  - Does not get in the way of waste disposal and emptying of bins



# Evolution of ZotBins

## Prototype 1

Deployed in Apartment  
Kitchen

Summer  
2017



## Prototype 2

Deployed in Donald Bren  
Hall

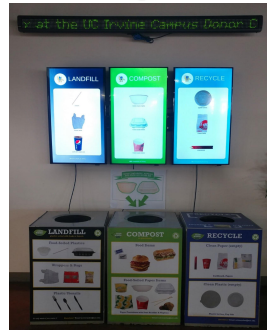
Summer  
2018



## Prototype 3

Collaboration with Digital Waste  
Bins, deployed in UCI Food  
Court

Summer  
2019



## Prototype 4

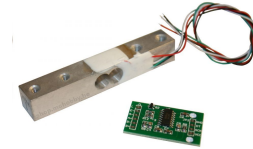
More flexible design to  
account for various types of bins,  
simpler design for quicker set up

TBA



# What Sensors Are We Using?

- Ultrasonic Sensor (HC-SR04)
  - Measures the current fullness of the waste bin
- Strain Gauge Load Cell (HX711 amplifier)
  - Measures the current weight of the waste inside the bin
- IR Break Beam Sensor
  - Indicates that trash has been placed in the bin
- Camera
  - Located in some bins, takes a photo of the contents of the bin
- Raspberry Pi platform (RPi3)
  - Manages the sensors and detects failures
  - Stores data locally and sends it via an API



# TIPPERS

- TIPPERS is a system that manages collected sensor data and can help build smart applications like ZotBins.
- We use TIPPERS as IoT data management system for our sensor data.
- E.g., ultrasonic data points are turned into fullness level data points.
- <https://tippers.ics.uci.edu/>



# TIPPERS + ZotBins

- ZotBins REST API
  - All of the sensor data is sent to TIPPERS using APIs where it is processed and saved to a DataBase Management System
  - Our web and mobile team uses these APIs to build different services for waste management
- Mock Sensors
  - are used to generate mock data for our web and mobile app team to continue development due to the inability to access the bins
- Error detection
  - In the case of sensor failure, the system will notify the API, so our team can fix the faulty sensor

#	Method	Endpoint
1	POST/GET	/bin-info
2	GET	/bin-info-all
3	POST/GET	/weight
4	GET	/weight-all
5	POST/GET	/fullness
6	GET	/fullness-all
7	POST/GET	/usage
8	GET	/usage-all
9	POST/GET	/image

s	Headers (4)	Test Results
Raw	Preview	Visualize
JSON		
<pre>{   "data": [     {       "bin_id": 2,       "bin_weight": 25.0,       "timestamp": "2015-11-04 19:06:25"     },     {       "bin_id": 2,       "bin_weight": 55.0,       "timestamp": "2015-11-04 19:06:25"     }   ] }</pre>		



# Waste Recognition



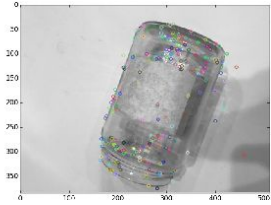
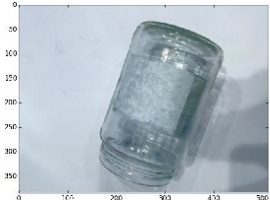
**Objective** - user inputs information about type of waste they have and are given proper waste disposal instructions

# Waste Recognition - Barcode



- Pros
  - Relatively simple to implement Low room for error
  - Reliable and fast
- Cons
  - Requires item has a barcode
  - Not all barcodes will be stored and labeled on database
  - Must be updated as barcodes are updated
- Current Status
  - API in place on mobile app already
  - Collab with UCI Dining who is providing us with 13,000 of the most common barcodes on campus

# Waste Recognition - Image Classification



- Pros
  - Waste doesn't need a barcode
  - Easier from a user standpoint
  - Won't require updating as product names or barcodes change
- Cons
  - Hard to develop, Requires lots of data!
  - Larger room for error

## Current Status

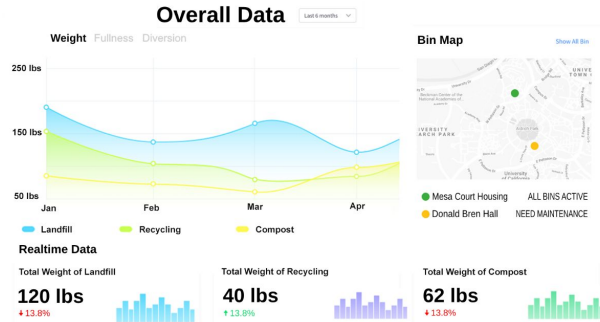
- Achieved 93% accuracy on 10 different classes of waste (close to ideal for image recognition which is 99%)

# Image Classification steps

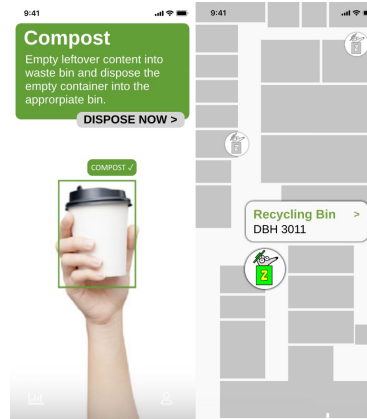
1. **Collecting Data:** *ImageNet, Interns Collecting Data, etc.*
2. **Preprocessing Images:** *Resizing, Segmentation, Removing Noise, Data Annotation*
3. **Data Augmentation:** *Helps with enlarging of a small data set*
4. **Training the Models:** *Utilizing distinct architecture of CNN and Resnet (Pytorch, Keras)*
5. **Fine-tuning hyperparameters**
6. **Testing the performance** *of different models on tensorboards for common data set.*
7. **Predicting the accuracy** of each model on test data set.

# Applications

- Three applications that allows people to interact with our system



Web App



Mobile App



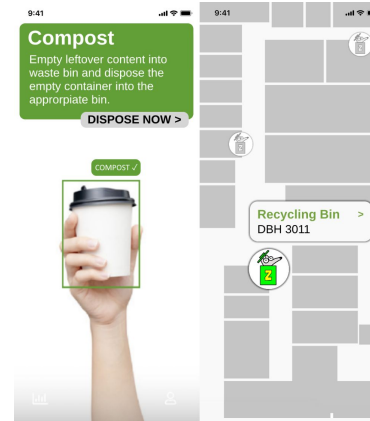
Digital Signage





# Applications: Mobile App

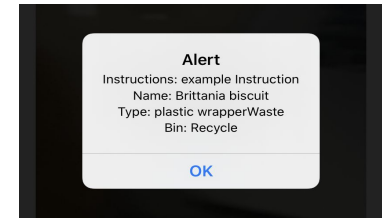
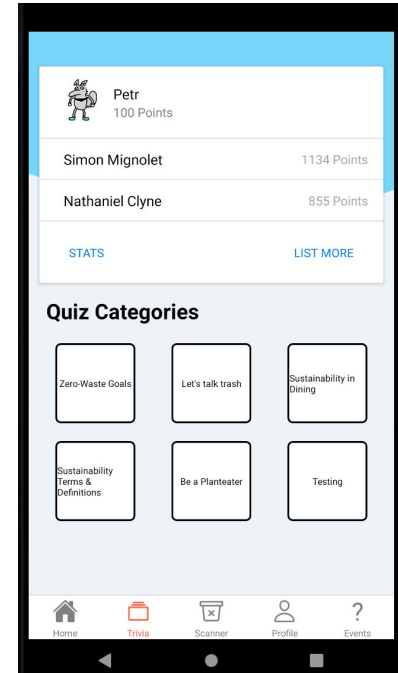
- **Map:** Displays the locations of all the ZotBins on campus and provides directions to the nearest ZotBin.
- **Barcode scanner:** Scan a barcode and learn how/where to dispose the item.
- **Image Recognition:** Click picture of the trash to learn how/where to dispose item.
- **Login/Sign up:** Allows users to track points, update their profile.
- **Trivia:** Trivia questions on waste management for incentivization. Leaderboard maintained (amongst all users) based on user Trivia performance. Top users get prizes from UCI Dining.
- **Events:** Events page containing the latest/upcoming events from UCI Dining.



Email

Password

Button



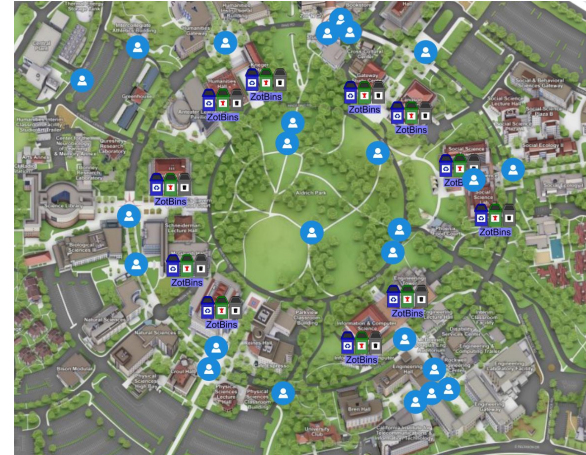
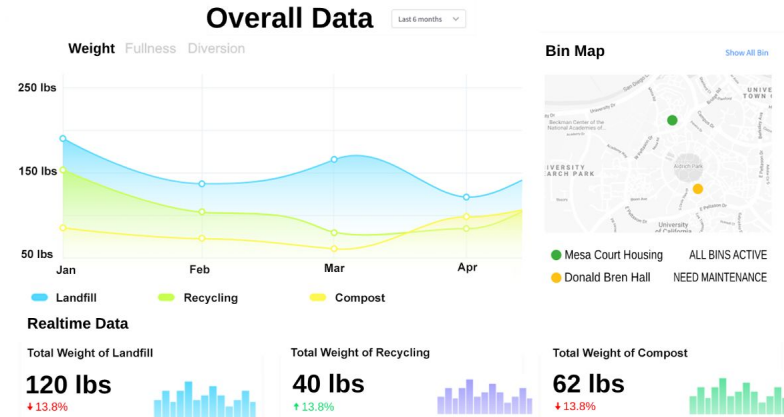
# Applications: Web App

## Data visualization in charts and graphs

- Total trash collected over time
- Tracking diversion rate
- Types of trash collected over time (Recyclable, Landfill, Organic, E-Waste)

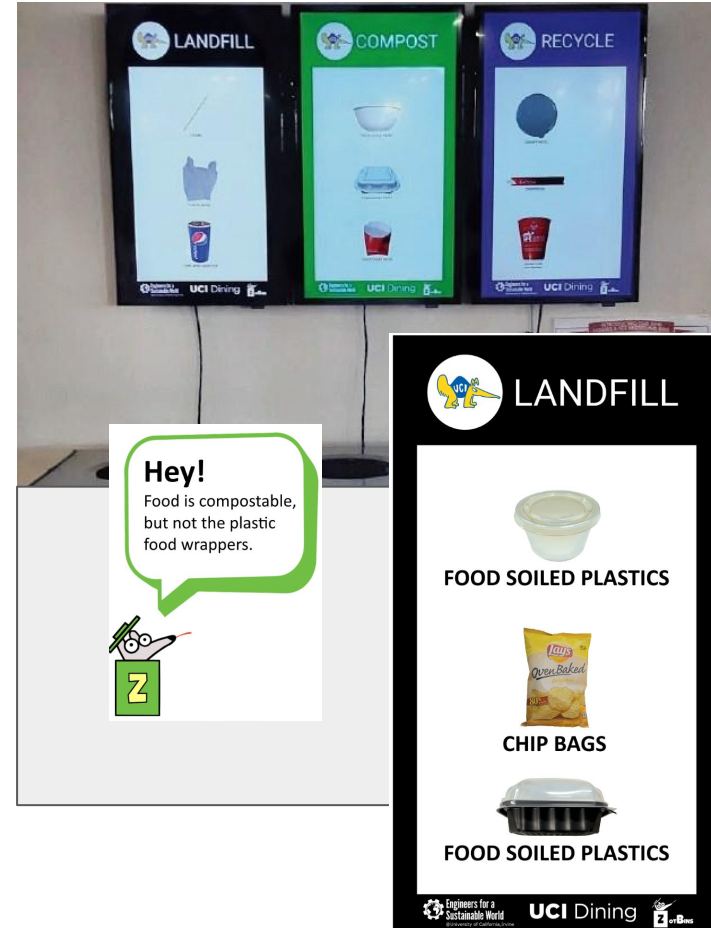
## Check individual bin status

- Checking if a bin needs maintenance
- Tracking the weight in each bin
- Check if bin is full
- Registering new bins to collect data

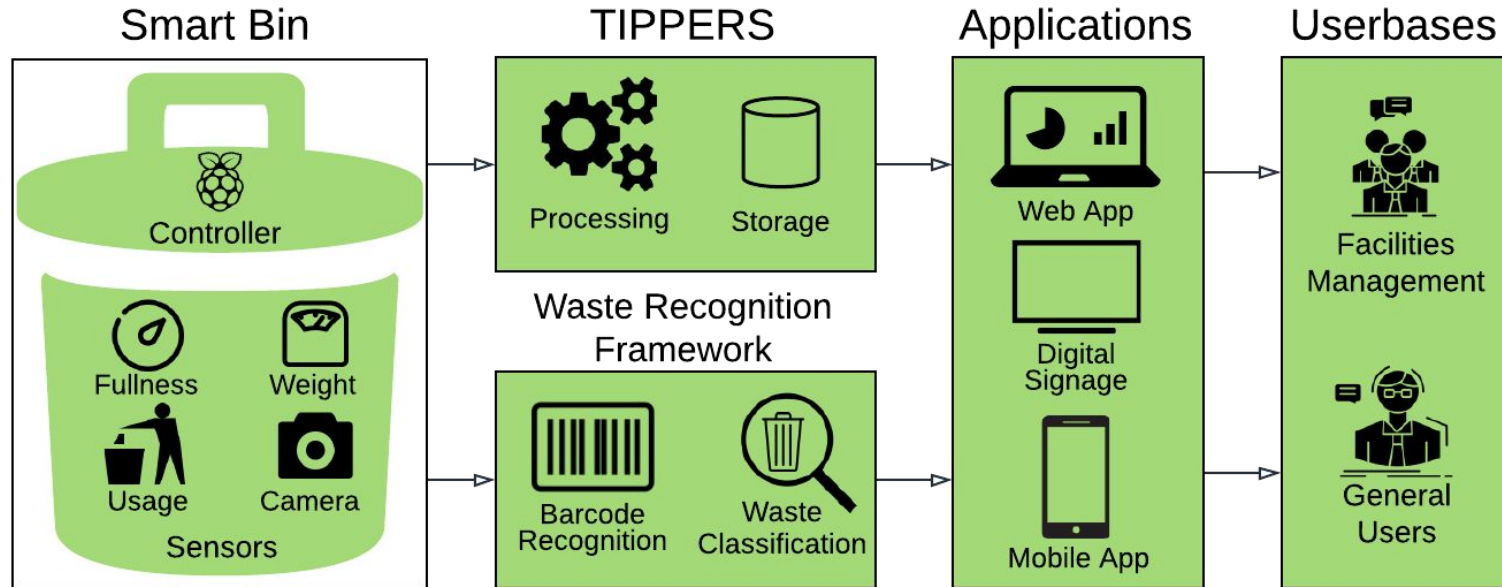


# Digital Signage

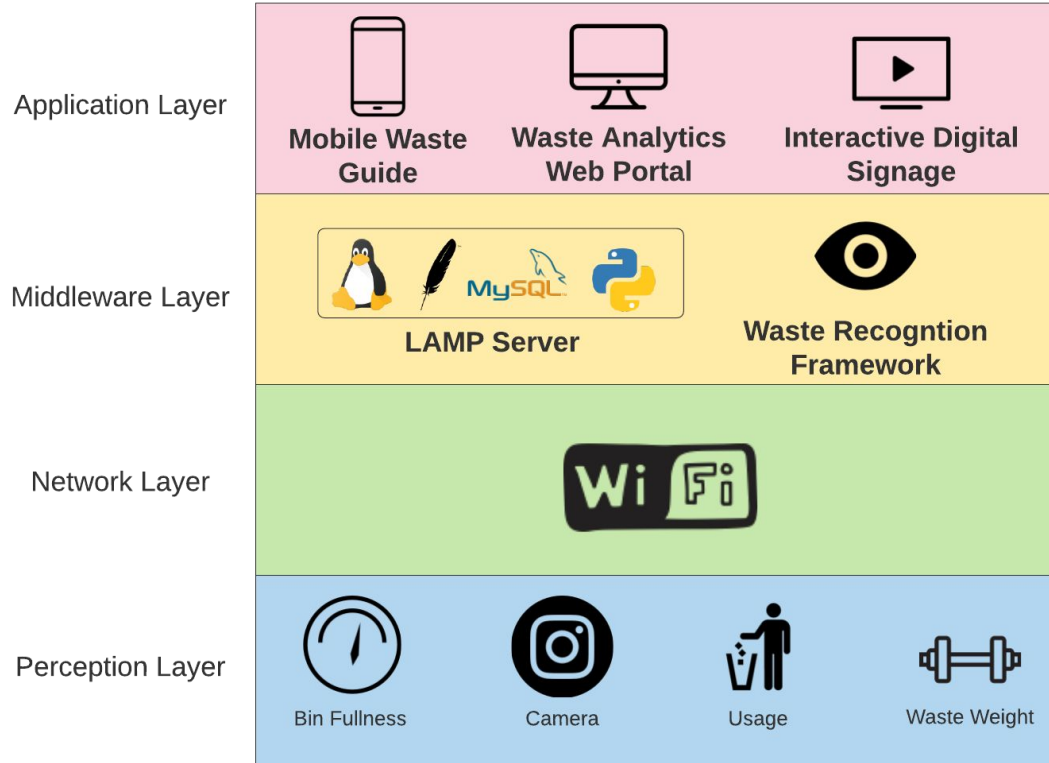
- Provide immediate feedback for users as they dispose their trash
- Mounted on the smart bins
- Displays animated customized signage and interactive pop-ups of educational content whenever a waste item is thrown away
- Disposal instructions for waste items most commonly thrown away at a particular location
- Plan to leverage the camera inside of the bin along with the Waste Recognition Framework in order to identify and provide feedback for incorrectly disposed waste items



# ZotBins System Overview



# IoT Architecture



# Deployment Story So Far

- 8 bins deployed on campus
  - 6 bins in UC Irvine's cafeterias
  - 2 bins in our computer science buildings
- Collected over **100,000** weight and ultrasonic data points
- Over a period of 3 months, ZotBins was recorded to have **increased composting by 22.72%** and **recycling by 5.53%**
- One set of bins have an estimated **\$20,000 savings** from recovering more compost and recycling material over 10 years (estimated lifetime of a ZotBins' set w/ regular maintenance)



ZotBins Set deployed  
in West Food Court



# ACM SenSys 2020 Publication



ACM SenSys 2020  
Yokohama, Japan  
November 16 – 19, 2020

## Poster abstract: The ZotBins solution to Waste Management using Internet of Things

Joshua Cao, Jesse Chong, Marissa Lafreniere, Owen Yang, Primal Pappachan, Sharad Mehrotra, Nalini Venkatasubramanian  
University of California, Irvine  
{cao111, chongjl, mlafreni, okyang}@uci.edu  
{primal, sharad, nalini}@ics.uci.edu

### ABSTRACT

The growing use of Internet of Things (IoT) technologies has the potential to improve waste management. In this work, we present *ZotBins*, a system that facilitates sustainable practices for individuals and improves waste management efficiency for organizations. *ZotBins* consists of smart bins fitted with sensors, a waste recognition framework, and a variety of user applications. Currently, eight smart bins have been deployed in University of California, Irvine (UCI) campus and the preliminary estimates show that it improves the diversion rate (percentage of waste diverted from landfills through methods such as recycling) by about 20% while generating tens of thousands of dollars in revenue over the course of next ten years for the university.

### CCS CONCEPTS

• Hardware → Sensor applications and deployments; • Applied computing;

### KEYWORDS

Internet of Things, Waste Management, User Applications

### ACM Reference Format:

Joshua Cao, Jesse Chong, Marissa Lafreniere, Owen Yang, Primal Pappachan, Sharad Mehrotra, Nalini Venkatasubramanian. 2020. Poster abstract: The *ZotBins* solution to Waste Management using Internet of Things. In *The 18th ACM Conference on Embedded Networked Sensor Systems (SenSys '20)*, November 16–19, 2020, Virtual Event, Japan. ACM, New York, NY, USA, 2 pages. <https://doi.org/10.1145/3384419.3430441>

### 1 INTRODUCTION

Waste poses significant economic, environmental, and public health threats if not addressed properly. At the current rate where 64.8% of waste (specifically municipal solid waste) is being sent to landfills, the economic opportunity to reuse materials is lost, greenhouse gas emissions are produced, and air and water quality are compromised for certain communities [1]. To maximize the diversion rate, three critical challenges must be solved: 1) in-depth analysis of waste trends [5]; 2) maximizing material reuse potential through waste recognition [2]; 3) reduction of facilities management overhead [3].



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*SenSys '20, November 16–19, 2020, Virtual Event, Japan*  
© 2020 Copyright held by the owner/authors.  
ACM ISBN 978-1-4503-7590-0/20/11...\$15.00  
<https://doi.org/10.1145/3384419.3430441>

*ZotBins*<sup>1</sup> is a holistic IoT based solution that provides many useful features to assist organizations (e.g., facilities management) and general users in maximizing diversion rate by addressing these challenges.

*ZotBins* consists of smart bins fitted with a suite of sensors that monitor data about various waste events. *ZotBins* helps organizations analyze this data using different visualizations to study real-time and historical diversion rates and to determine appropriate strategies for waste pickup and bin placement. It also includes different user applications that guide users to appropriately dispose of their waste. In this work, we present a detailed overview of *ZotBins* and describe the current deployment status of *ZotBins* on UCI campus.

### 2 ZOTBINS SYSTEM

*ZotBins* consists of the following three modules. First, the *Sensors and Controller* are attached to the waste bin and are used for the collection of sensor data and the sending of collected data to *TIPPERS* [4] through API calls. *TIPPERS* is a cloud based IoT data management system that is used to process and store all sensor data. Second, the *Waste Recognition Framework* identifies images or barcode numbers of waste from the smart bin or user applications. Third, *User Applications*, built on top of *TIPPERS* APIs, allows facilities management and general users to utilize various useful features. The data flow through these different modules in *ZotBins* is demonstrated in Figure 1.

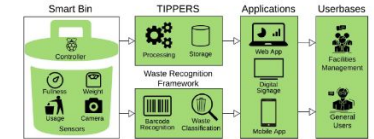


Figure 1: *ZotBins* System Data Flow

#### Sensors and Controller

Smart bins consists of the following sensors: 1) Weight (implemented using a load cell) measures the total weight of waste inside a bin, 2) fullness (implemented using the ultrasonic sensor) determines the percentage fullness of the bin, 3) usage (implemented using the break beam sensor) detects every time a bin is used, and 4) camera captures images of waste thrown away which is later used

<sup>1</sup><https://zotbins.github.io/>

# Recognition

Bren school home / Community / News

## In The News

January 13, 2020

### ZotBins and Zero Waste Anteaters Support UC Goal for 2020

For almost a decade, the University of California has been pushing for zero waste by 2020, even implementing a #MyLastTrash campaign in 2017. The once far-off deadline is finally upon us, and although none of the 10 UC campuses have conquered the ambitious goal of diverting 90% of waste from local landfills, UCI is leading the pack at 80%. Now, as UCI approaches the finish line, it could get a boost from a group of Zero Waste Anteaters (ZOWA) and their deployment of ZotBins.




Zero Waste Anteaters (ZOWA): (from left, front) Joshua Cao, David Pham, Danny Tran (alumnus), Owen Yang and Primal Pappachan; (from left, back) Anthony Lau, Diego Torres (alumnus), Sid Lau (alumnus), Marissa Lafraniere and Kathy Nguyen. (Not pictured: Grace Seung-Mi Choi, Mohammed Hagee, Jesse Chong, Ted Si Zidouri and Miriam Cheiang)

- Featured in UCI [ICS Article](#) (Jan 2020)


UCI STORIES

### Across Campus


SOME OF THE LATEST STORIES FROM THE UCI CAMPUS




**HENRY SAMUELI SCHOOL OF ENGINEERING**  
The University of California Laboratory Fees Research Program awarded a UCI led team \$3.6 million over the next three years for a project that uses science and engineering to help California fight wildfires.  
[engineering.uci.edu](http://engineering.uci.edu)




**DONALD BREN SCHOOL OF INFORMATION AND COMPUTER SCIENCES**  
The ZotBins System, a UCI student invention that tracks the amount of waste left in the special bins with sensors, could help in UCI's waste-free 2020 goal by encouraging the school population to be more mindful of waste.  
[ics.uci.edu](http://ics.uci.edu)



**SCHOOL OF PHYSICAL SCIENCES**  
UCI Professor of Astronomy Paul Robertson recently celebrated "first light" for NEID, a new exoplanet hunting instrument he helped develop. With NEID, astronomers can determine planetary mass.  
[ps.uci.edu](http://ps.uci.edu)



**UCI HEALTH**  
Petra Wilder-Smith, D.M.D., Ph.D., director of dentistry and professor at UCI's Beckman Laser Institute & Medical Clinic, and her colleagues are conducting research using lasers to measure dental plaque in the mouth and testing toothpastes to determine the ones that work best to reduce gum disease.  
[ucihealth.org](http://ucihealth.org)



**SCHOOL OF MEDICINE**  
The UCI School of Medicine, in partnership with Chenega Healthcare Services and MedCognition, gained a \$1.2 million contract through the Medical Technology Enterprise Consortium to examine the psychological effects of augmented reality medical simulation training.  
[som.uci.edu](http://som.uci.edu)

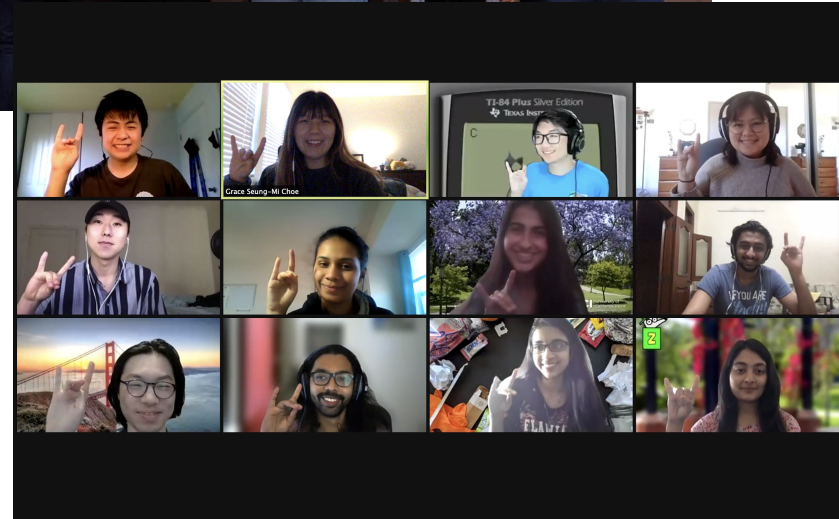
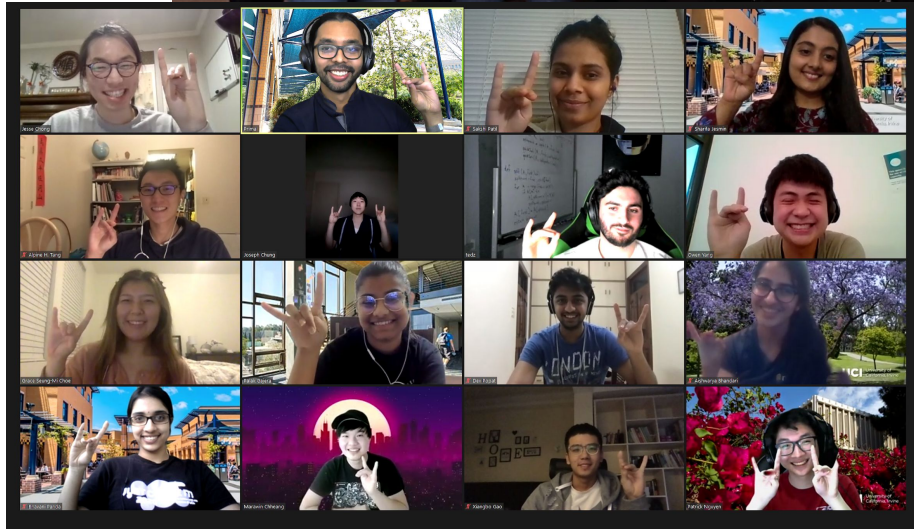
MARCH 2020 / UCI RISE! APPLIED INNOVATION / RISING TIDE

- Featured in UCI [Rising Tide magazine](#) (page 22) (Mar 2020).

# Timeline of ZotBins

- **Won the TIPPERS Hackathon (Jun 2017)**
- Built the first Waste Monitor prototype and the web app (Aug 2017)
- Demoed the Project at ICS 50th Anniversary Gala (Oct 2017)
- **Deployed multiple bins in Donald Bren Hall and started collecting data (Jun 2018)**
- Demoed at UCI Sustainability Fair (Jan 2019)
- Demoed the project at UCI's Sustainability Co-Curricular Working Group (SCWG) (Feb 2019)
- Submitted the proposal for UC Carbon Offset Projects; invited to work with UC level Zero Waste Working group (May 2019).
- Submitted the proposal to NSF Smart and Connected Communities (Sep 2019).
- Demoed the project at UCI's Sustainability Co-Curricular Working Group (SCWG) (Sep 2019)
- **Organized First Zero Waste Symposium at UCI**
- Featured in UCI [ICS Article](#) (Jan 2020)
- Featured in UCI [Rising Tide magazine](#) (page 22) (Mar 2020).
- Submitted poster and presented to IEEE Sustech 2020 (Apr 2020).
- Submitted short paper to ACM BuildSys (Sep 2020).
- **Accepted poster paper to ACM [SenSys Yokohama Japan conference](#) (Oct 2020).**





# ZotBins Advisors and Mentors



**Professor  
Sharad Mehrotra**

Donald Bren School of Information and  
Computer Sciences at UC Irvine



**Professor Nalini  
Venkatasubramanian**

Donald Bren School of Information and  
Computer Sciences at UC Irvine



**PhD Candidate  
Primal Pappachan**

Donald Bren School of Information and  
Computer Sciences at UC Irvine



**Owen Yang**

B.S. Computer Science & Engineering '20  
Lab Engineer @ Microsoft

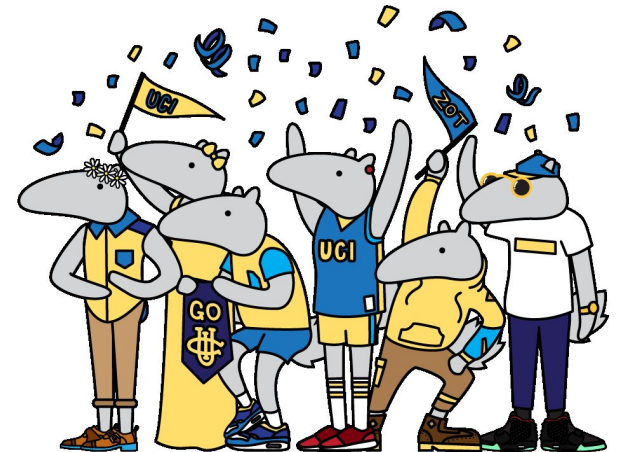


**Jesse Chong**

B.S. Computer Science '21  
Software Dev. Engineer @ Amazon

# Our Collaborators

- UCI Housing
- UCI Dining
- UCI Facilities Management
- City of Irvine
- Orange County Recycling Coalition
- Irvine Unified School District
- Irvine Company
- USC





# Opening it up to the broader community

- ZotBins Community Edition (ZBCE) is an open-source continuation of the ZotBins Project
- Designed so that any community, city, or school could implement a smart waste metrics system
- Join our Discord!

<https://tinyurl.com/discord-zbce>



## Contact Us

Website - [ZotBins.github.io](https://ZotBins.github.io)

Email - [zotbinsuci@gmail.com](mailto:zotbinsuci@gmail.com)

