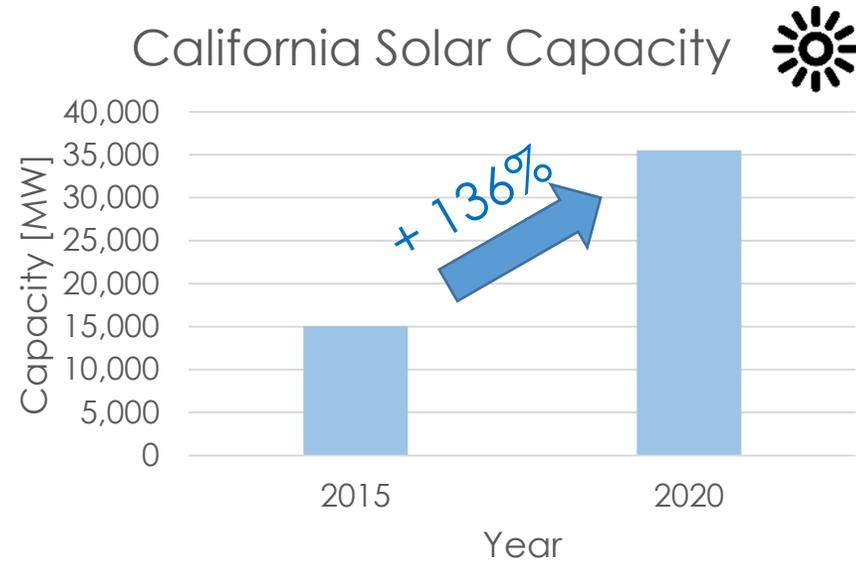


# SPATIOTEMPORAL PV

Emily Nathan  
Emily Wallace  
Jeffrey Nash  
Jerald Han  
Robert Spragg

# Existing Problem

The solar industry is growing rapidly:



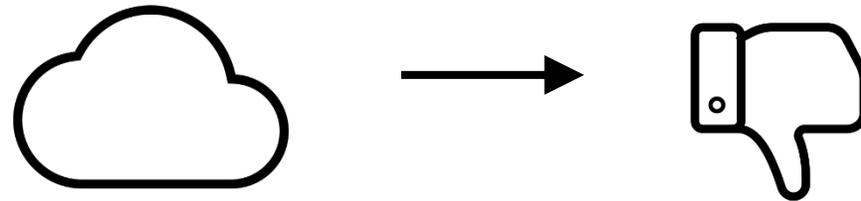
Costs are falling rapidly 

Down **66%** since 2010 



# Existing Problem

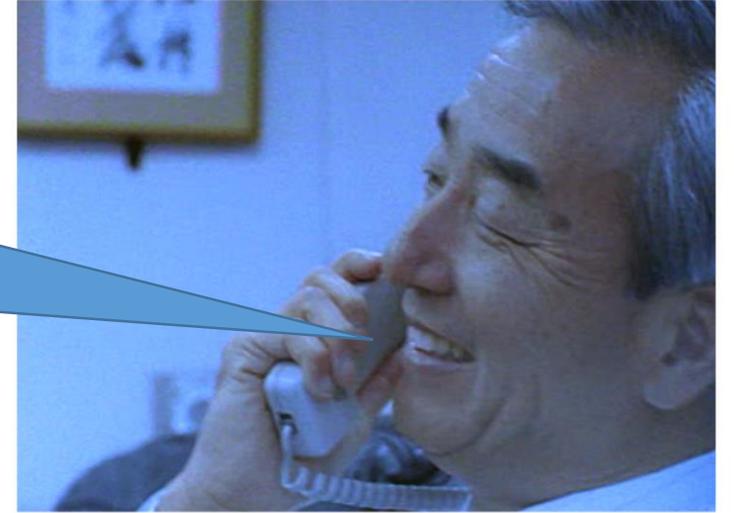
“Clouds have the strongest impact on solar energy production”  
(Chow, Belongie, Kleissl, 2015)



# The Predictive Network



My kids and I are at the park and BOY is it windy in El Cerrito



I'm at my start-up in the Mission and it's super cloudy!



It's raining in Marin. Again.

# Location Selection



Figure 1: Clouds streaming through the Golden Gate

## LOCATION

Locations account for a variety of weather patterns  
Considered microclimates  
(foggy, colder areas)

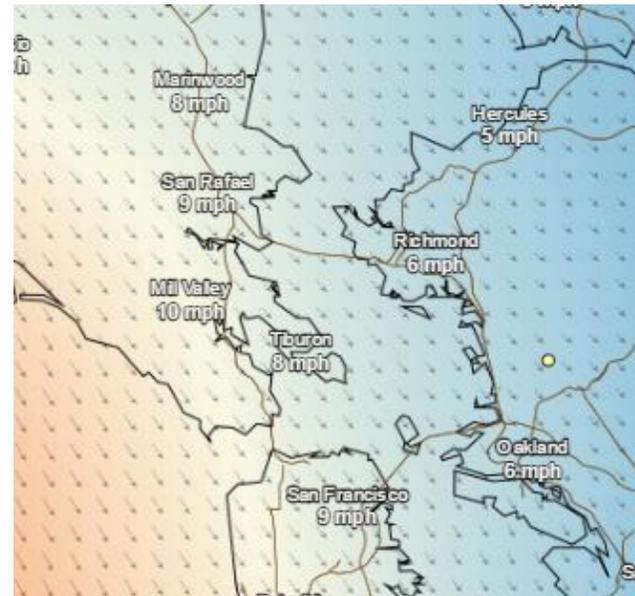


Figure 2: Typical prevailing winds following a winter storm

## HARDWARE

Temperature Sensor  
Light to Frequency Sensor  
Light Filter  
Micro-SD Card (data storage)

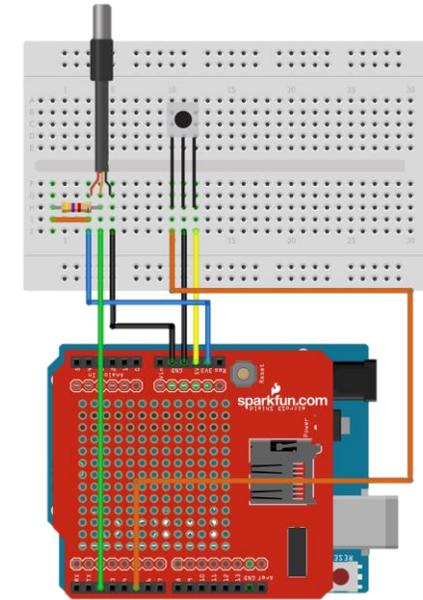


Figure 3: Schematic of the deployed sensors



# Location Selection

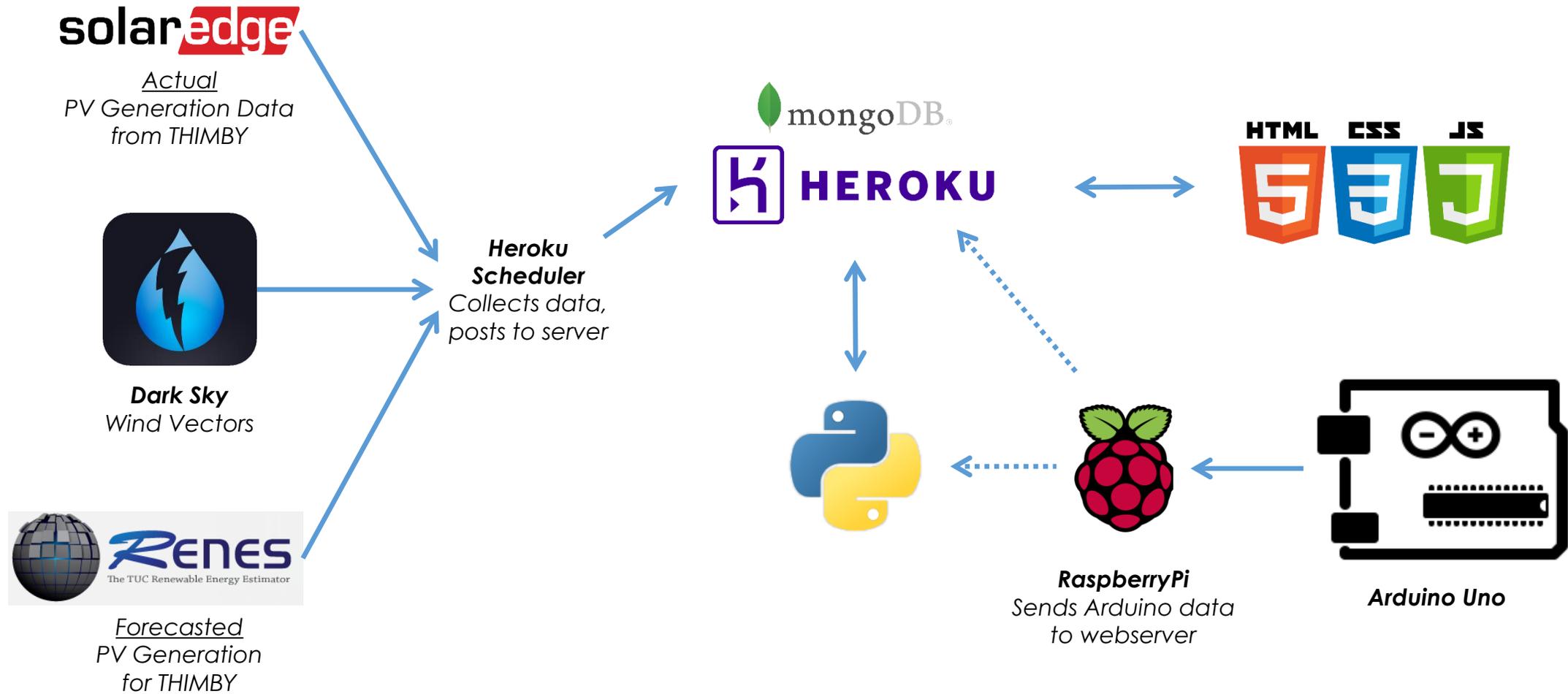


# Solar Prediction Inaccuracies

“An advantage of using ground-based sensors is that PV power output can be inferred directly... without independent estimates of the height, density, reflectivity, or spectral properties of clouds.”  
(Lonij, et. al, 2013)



# Our Solution Network



# Data Collection & Visualization

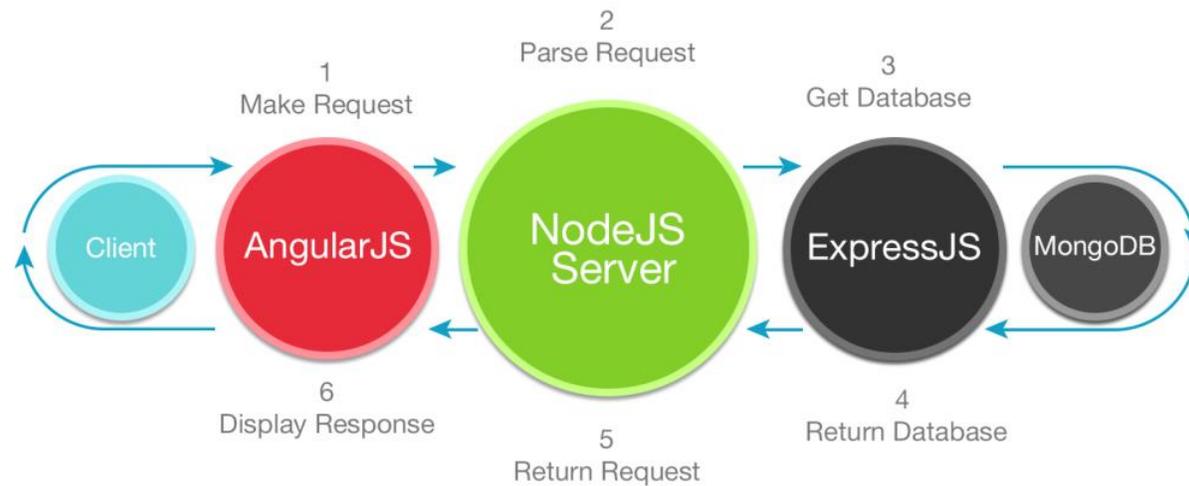
## Server

### HEROKU

Git version control allows for portable solution

Scheduler periodically runs script, stores data from external API

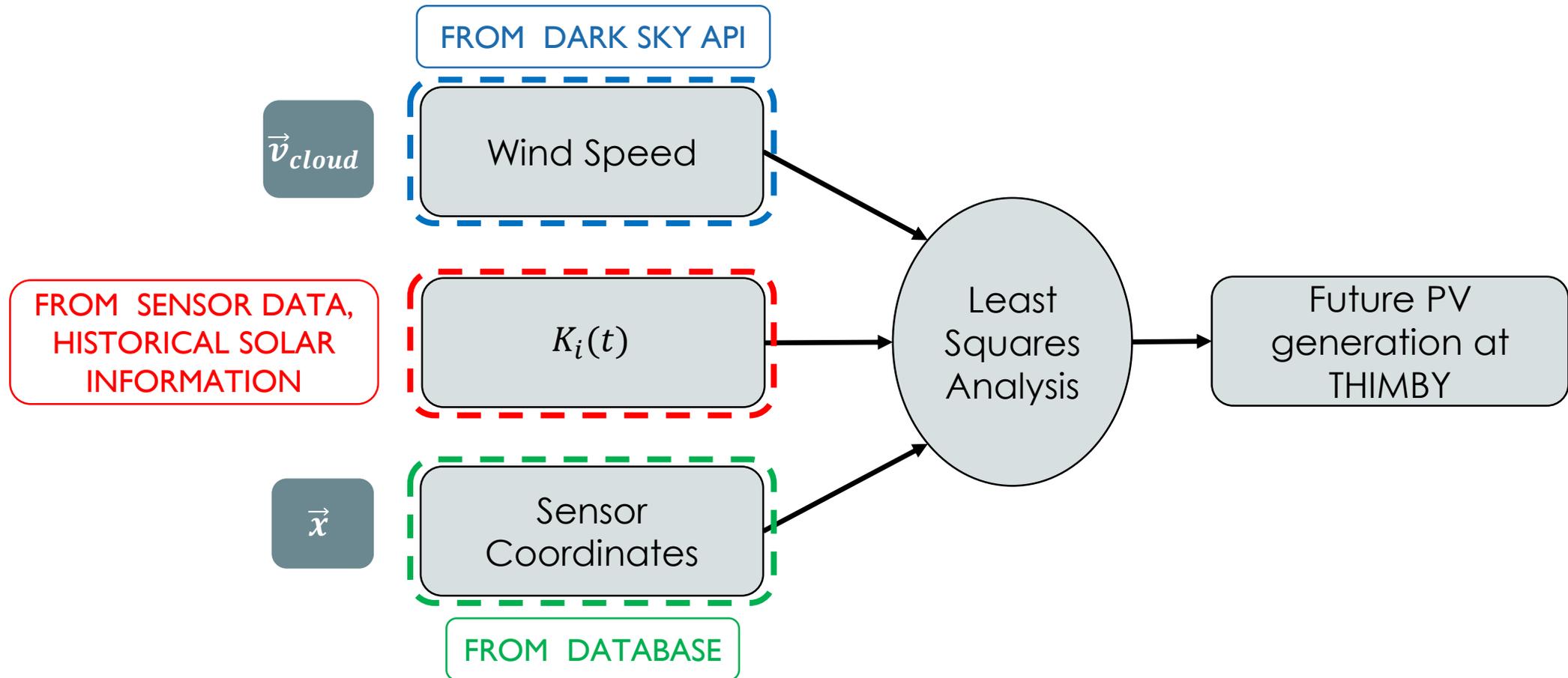
## MEAN Stack



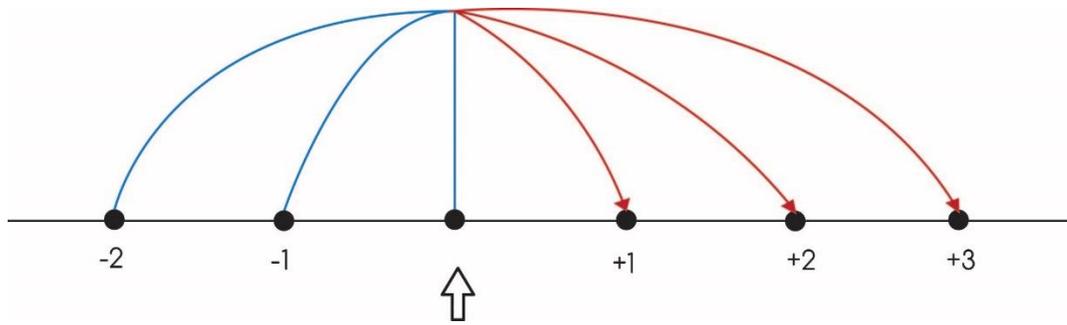
## Visualization



# Data Analysis



# Data Analysis



$$\hat{P}_{Thimby} = \hat{P}_{API} + \sum_{n=1}^3 \sum_{i=1}^3 B_{ni} \cdot K_i(t) e^{-|\Delta \bar{x}_i - \vec{v}_c \Delta t_n|}$$

$$error(t) = P_{Thimby}(t) - \hat{P}_{Thimby}$$

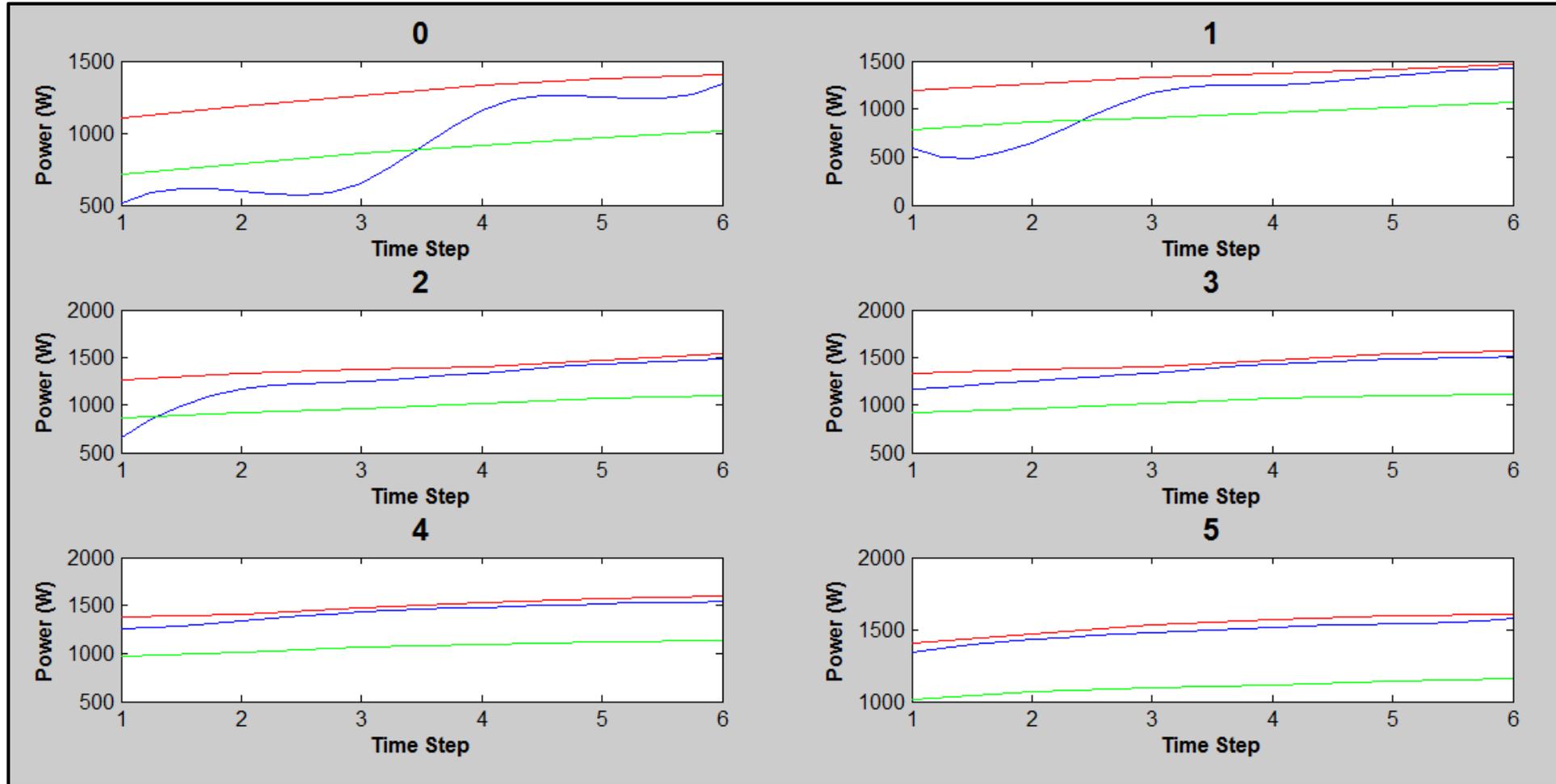
Perform least squares analysis to solve for prediction coefficients

$$B = (X^T X)^{-1} X^T Y$$

Smart algorithm recalculates coefficients every 15 minutes



# Results



- Model
- Actual
- RENES



# Impact of Results

## SO WHAT?

Energy security is extremely valuable

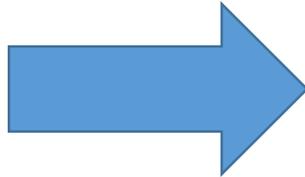
NREL study showed that energy security at Belvoir military base is valued at **2.2-3.9M**

The research at the University of Texas is worth an estimated **500M**

(Energy Efficiency Markets, 2016)

Value of our model grows with solar implementation 

Useful for essential systems (hospitals), military bases, universities, microclimate research, any region



## OUR ROLE

We can provide data for the following...

Energy security optimization  
Grid Energy purchase optimization  
Stabilizing small / island energy grids  
Predictions for all locations within network

## OUR PERKS

Low cost ~ **\$75**  
Independent  
Does not rely on data from multiple homes, which may be unreliable



# Future Improvements

## Hardware

- Improved waterproofing and sensor reliability
- Fine-tune sensor calibration
- Decrease deployment costs

## Networking

- Avoid Raspberry Pi by leveraging affordable data logging systems
- Update all sensors to include live updates
- Google Project Fi  SIM card shield

## Expanding

- More sensor locations throughout the bay.
- Continued iterations of regression models
- Integration with other existing models



# Q & A

