


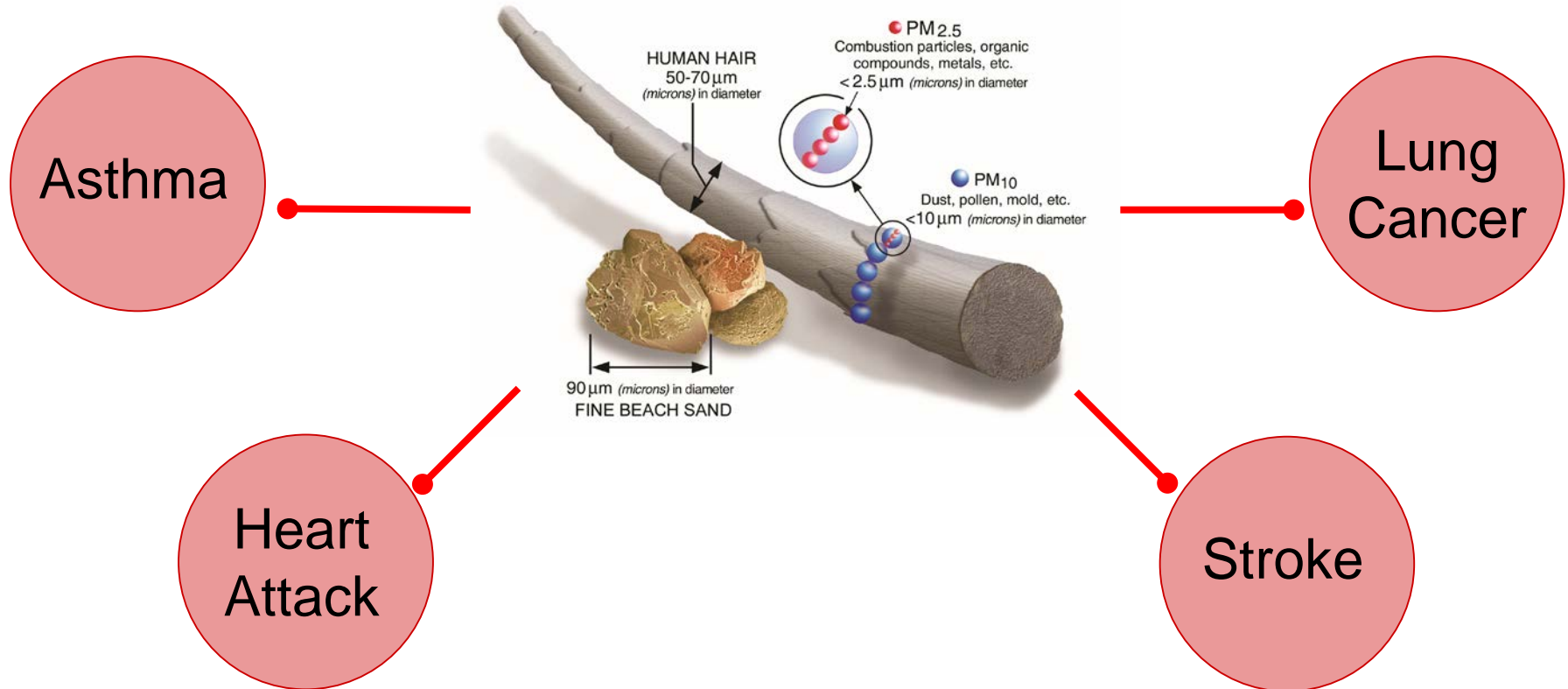
# HSPH Capstone Project

## Air Pollutant Models



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# Pollution Smollution...



# Partner Mission:

What's hurting us? How? What do we do?

1



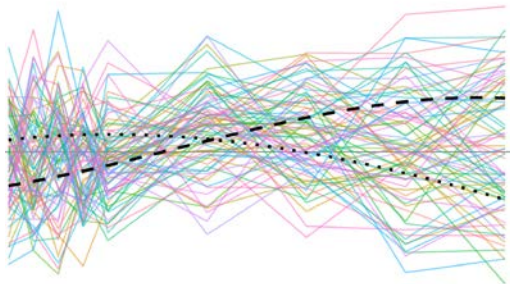
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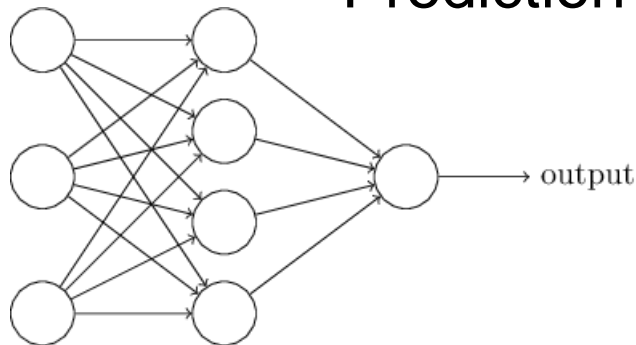
3



# Confidence with Causation



Geographic  
Data

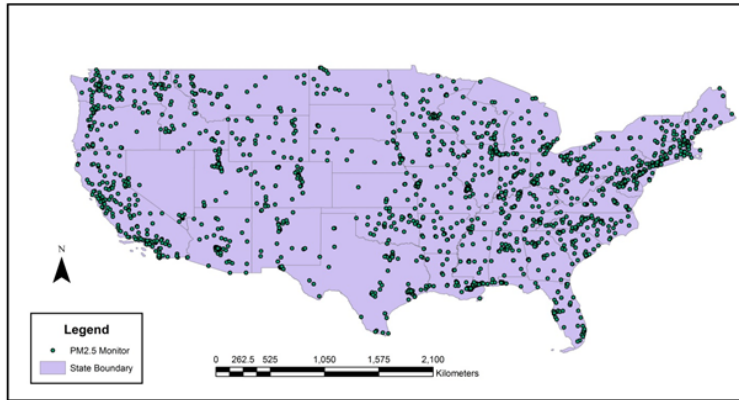


Pollution  
Prediction

Causal Health  
Outcomes



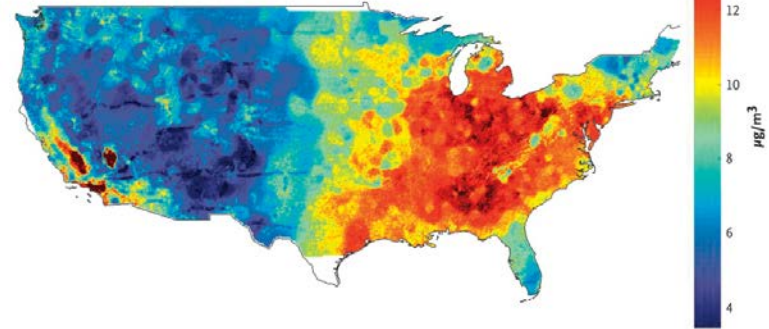
# PM<sub>2.5</sub> Predictions



Sensor Network

- We have PM<sub>2.5</sub> sensor outputs for locations with monitors
- Goal is to produce accurate PM<sub>2.5</sub> values for the entire US

A Average Concentrations of PM<sub>2.5</sub>

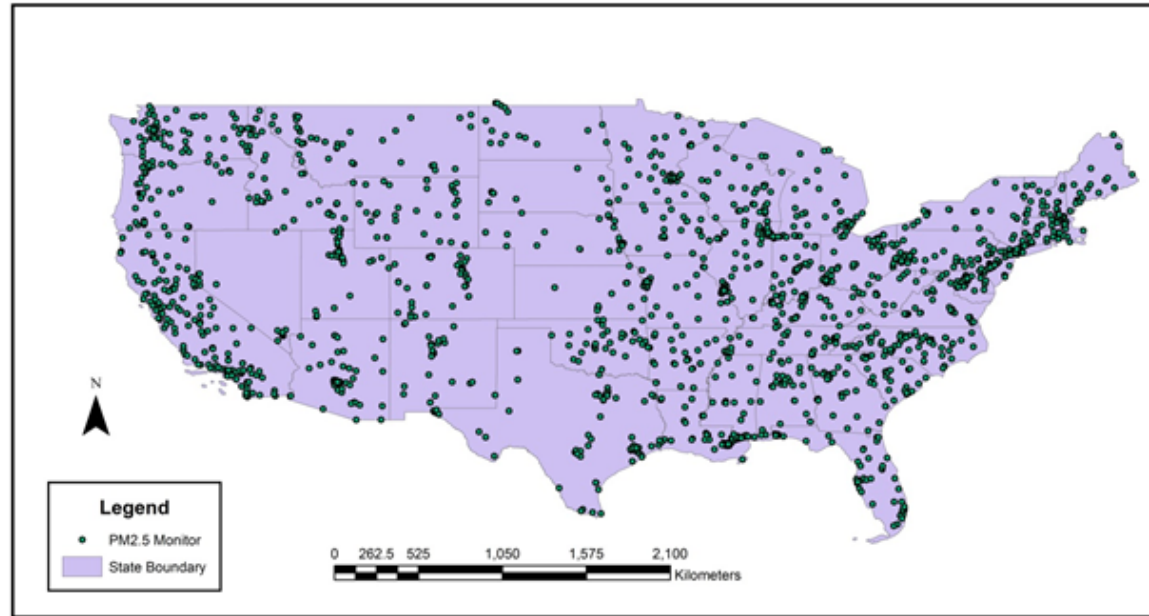


Prediction Map



# PM<sub>2.5</sub> Sensors

- Daily PM<sub>2.5</sub> outputs from 2,156 monitors over the course of 16 years (2000 - 2016)
- Sensors tend to be located along the coasts and in more heavily populated areas



# Model Inputs - Geographic Data

- Weather, topography, and satellite information for areas across the US
  - ~18 GB
- Examples include precipitation rate, air temperature, soil moisture content, and UV index
- Significant proportion of missing data - all variables have at least some missing values



# Things to consider

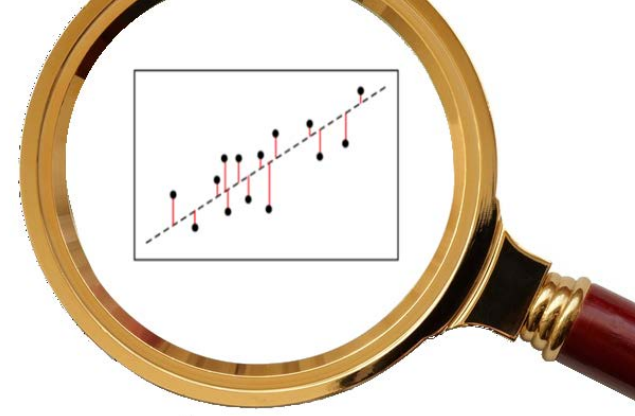
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- The data has spatial and temporal components that we need to consider when determining the structure of our model
  - RNNs, CNNs?
- The areas without sensors may be quite different than the areas with sensors, so need to concern ourselves with degree of extrapolation of  $\text{PM}_{2.5}$  predictions



# Promising Leads

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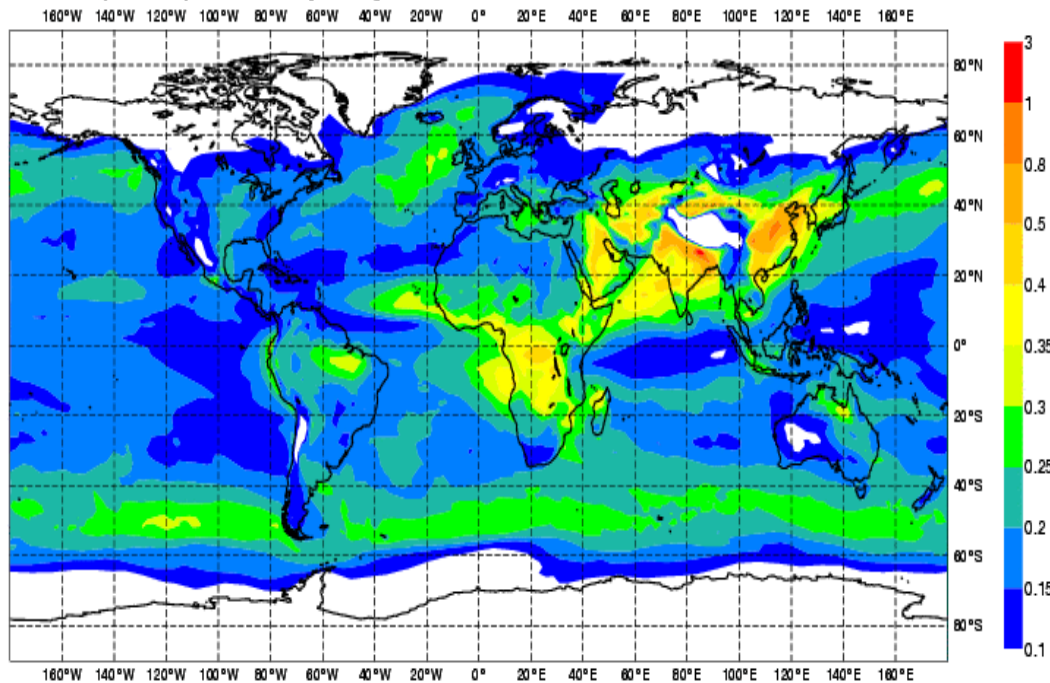


- Properties of locale of interest
  - Elevation, road density, vegetation, natural features
  - Satellite measurements of atmospheric properties
- Spatial and temporal nearby terms

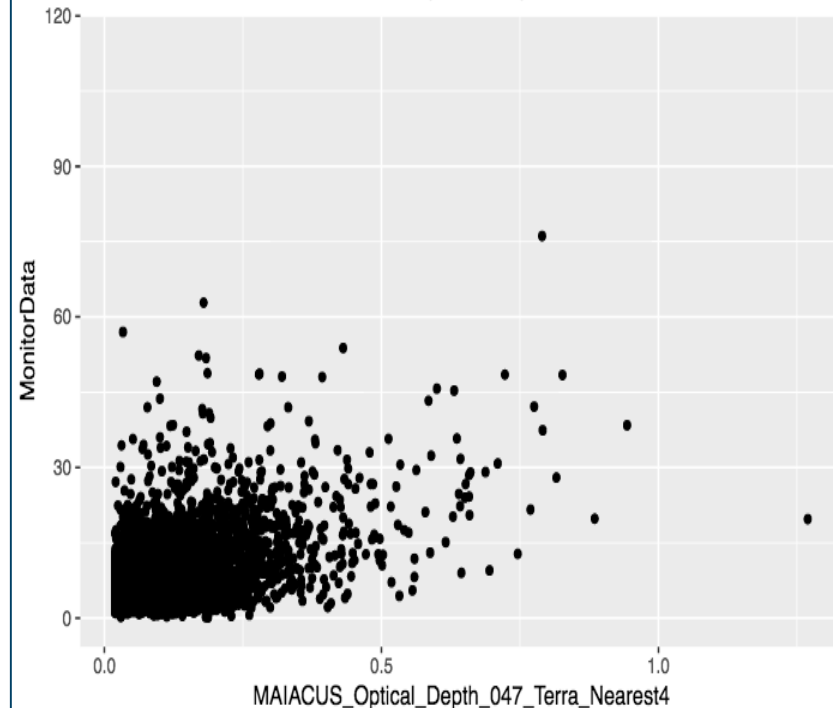
# Promising Leads - Aerosol Depth

MACC Reanalysis Global Monthly Mean November 2011

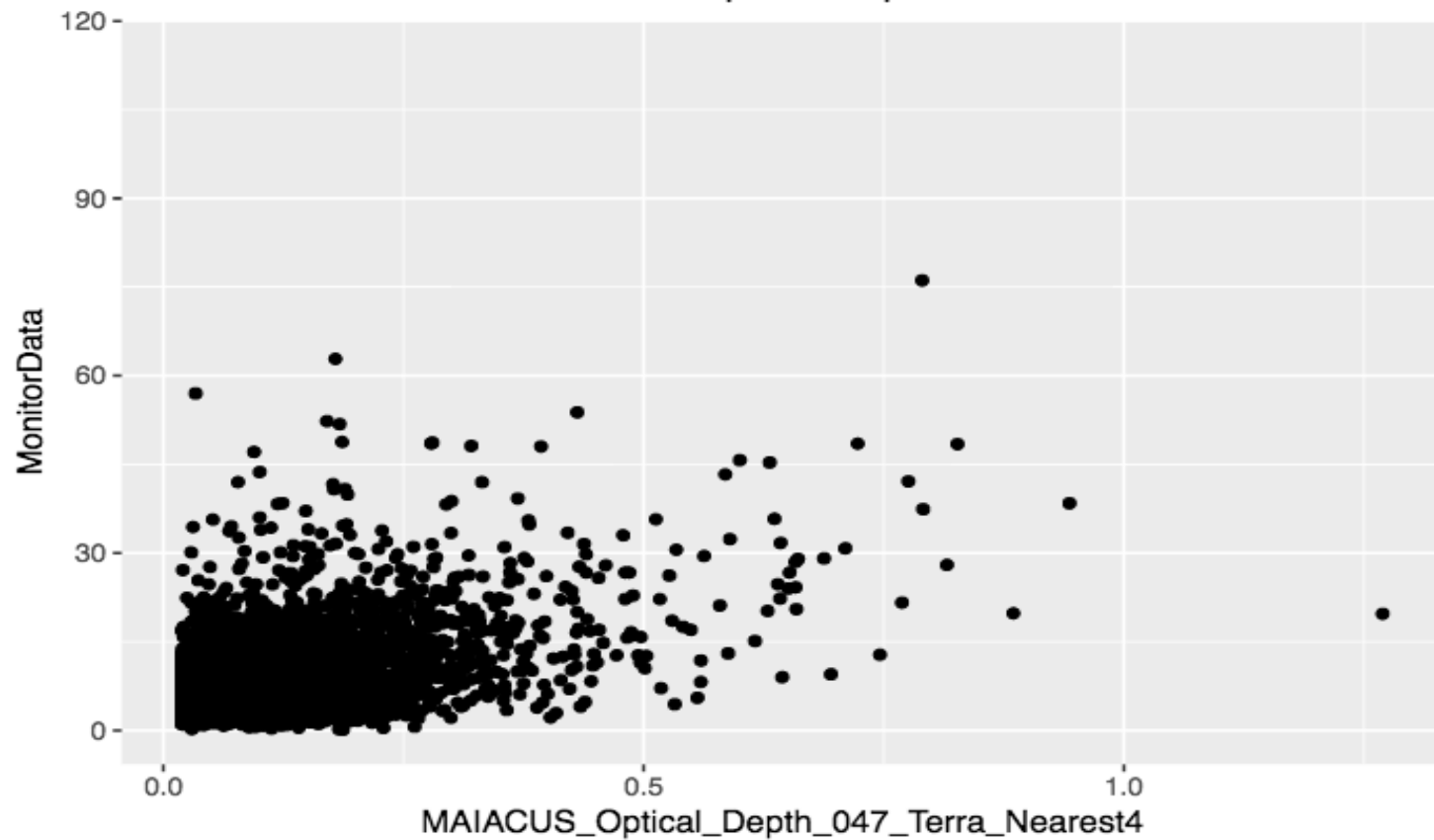
Aerosol Optical Depth at 550nm [None] mean: 0.16 max: 1.06



PM2.5 MonitorData vs. Aerosol Optical Depth

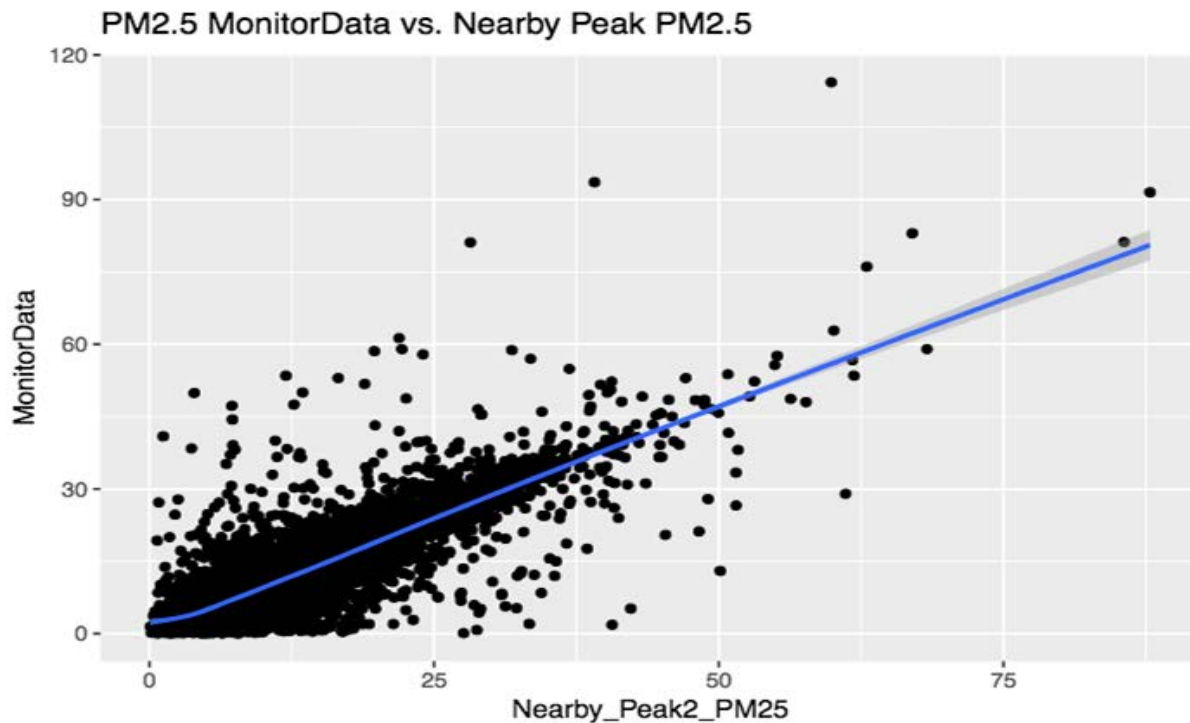


PM2.5 MonitorData vs. Aerosol Optical Depth



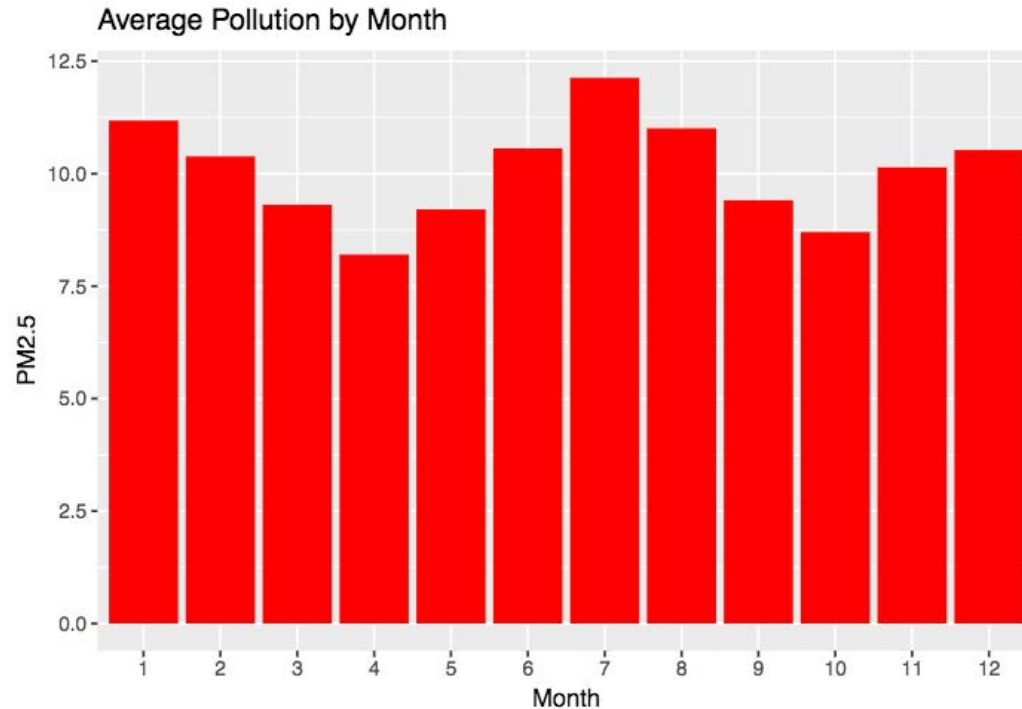
# Promising Leads - Nearby Terms

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# Promising Leads - Seasonal Variations

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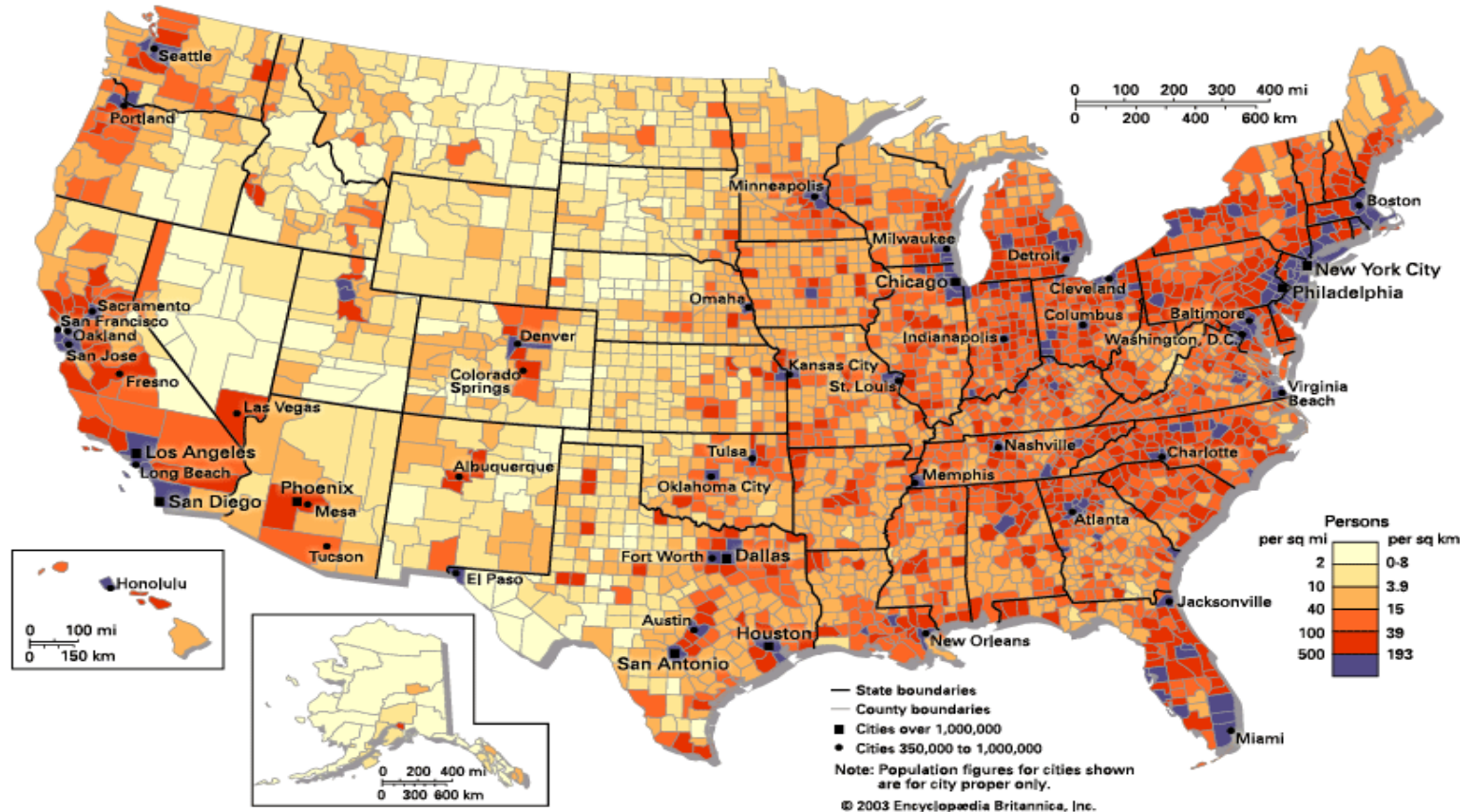


# Extensions



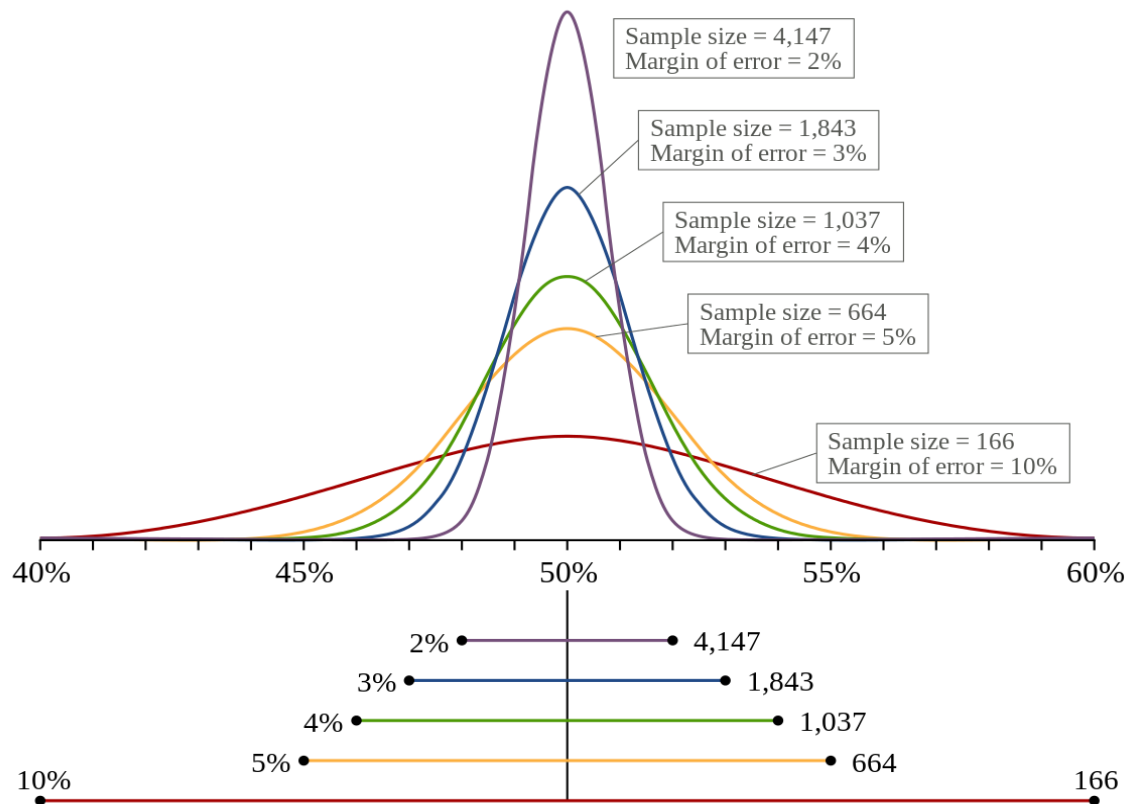


# Incorporating External Data





# Prediction Margin of Error



# Optimal Sensor Locations

