

Downwind of the Flames:

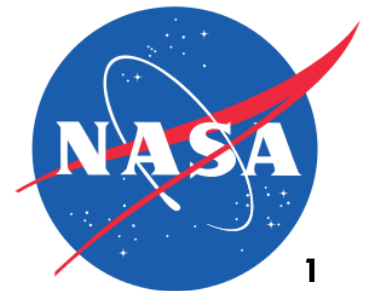
Assessing and Predicting
Wildfire Smoke Related Morbidity
Using Satellites, In-Situ Measurements, and Models

Jeff Pierce

*Sheryl Magzamen, Emily Fischer, John Volckens, Gabriele Pfister
Bonne Ford, Ryan Gan, Will Lassman, Katelyn O'Dell*



This work is funded by NASA project number **NNX15AG35G**.



Project Overview

Objectives:

1: Estimate the respiratory and cardiovascular health risks for specific demographic populations exposed to wildfire PM.

2: Evaluate and develop forecast tools that predict wildfire PM concentrations, population exposure, and the potential increased morbidity due to wildfire smoke.

Team:

CSU Atmospheric Science: Jeff Pierce, Emily Fischer, Bonne Ford,
Katelyn O'Dell

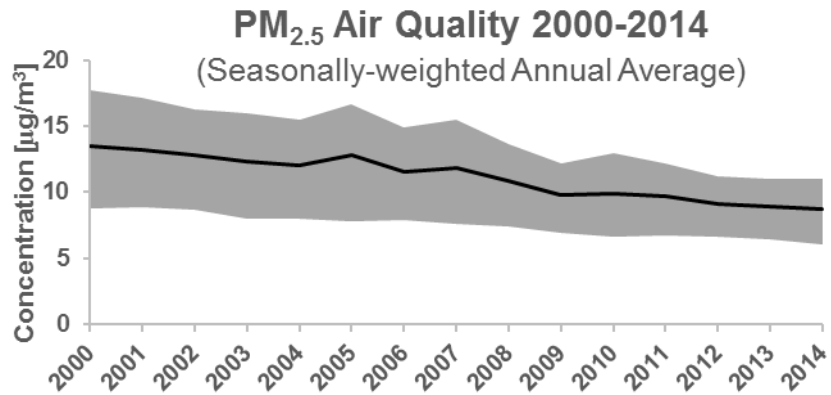
CSU Mechanical Engineering: John Volckens

CSU Environmental Health: Sheryl Magzamen, Ryan Gan

NCAR: Gabriele Pfister

Role of wildfire emissions in air quality is increasing

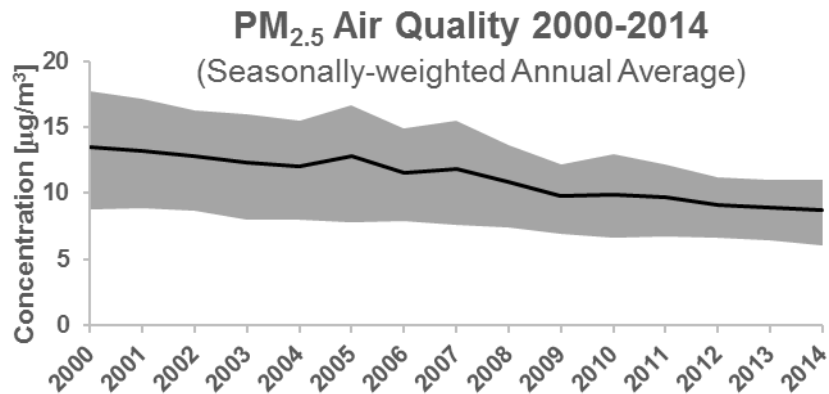
Anthropogenic Emissions have decreased



epa.gov

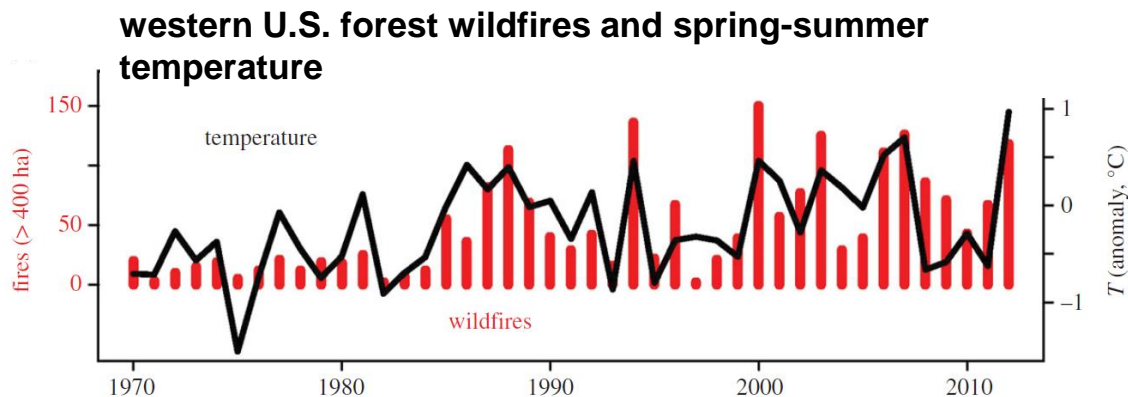
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epa.gov

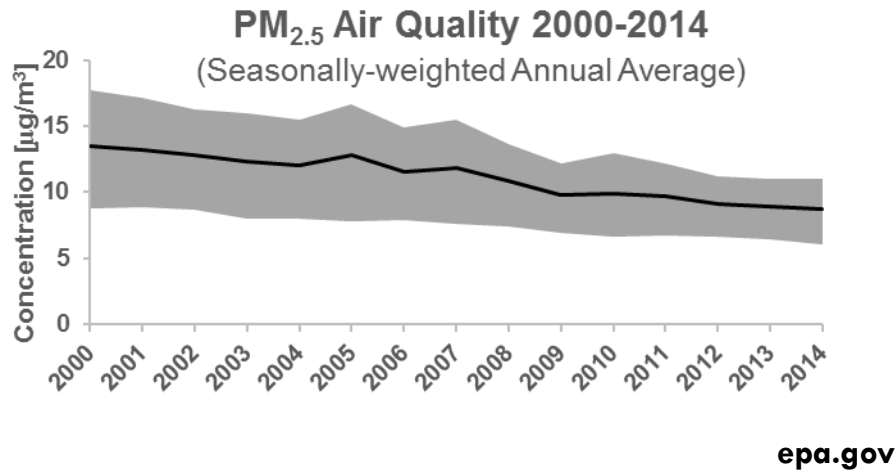
Wildfire Frequency has increased



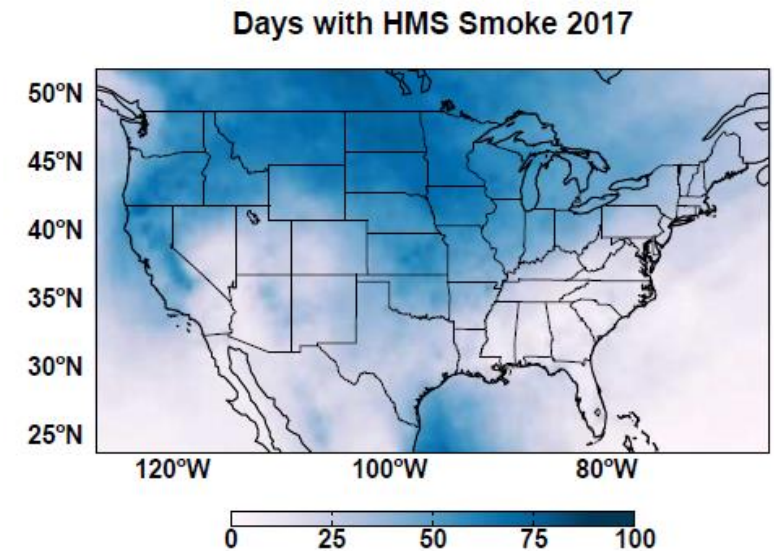
Westerling et al., 2016

Role of wildfire emissions in air quality is increasing

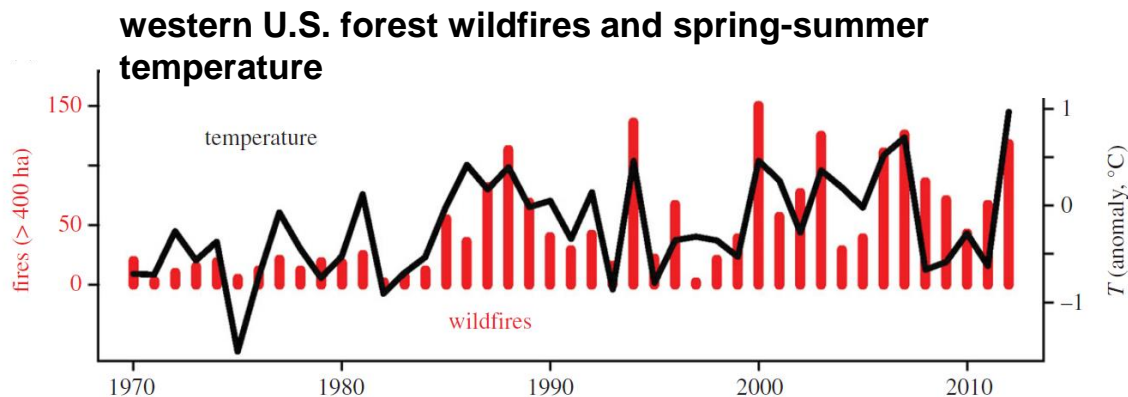
Anthropogenic Emissions have decreased



Large portions of the US experience smoke

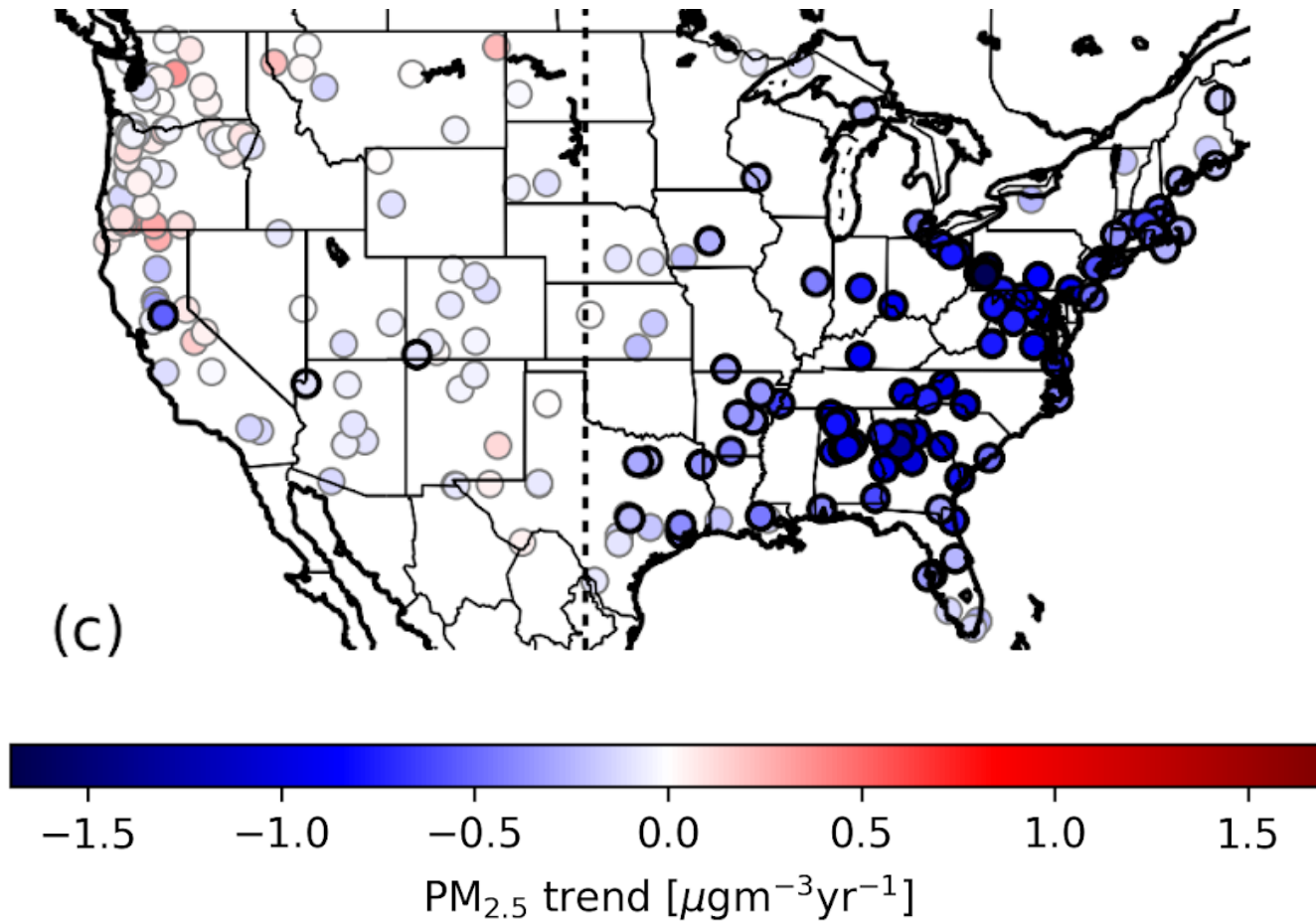


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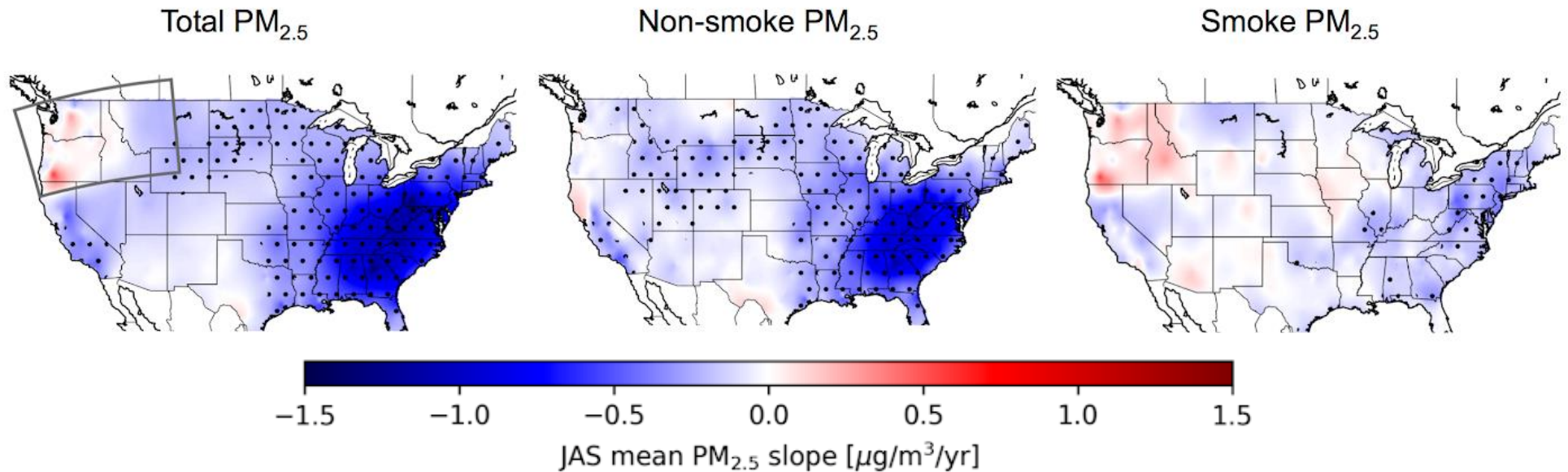
Westerling et al., 2016

PM_{2.5} is not improving in the summer in much of the west



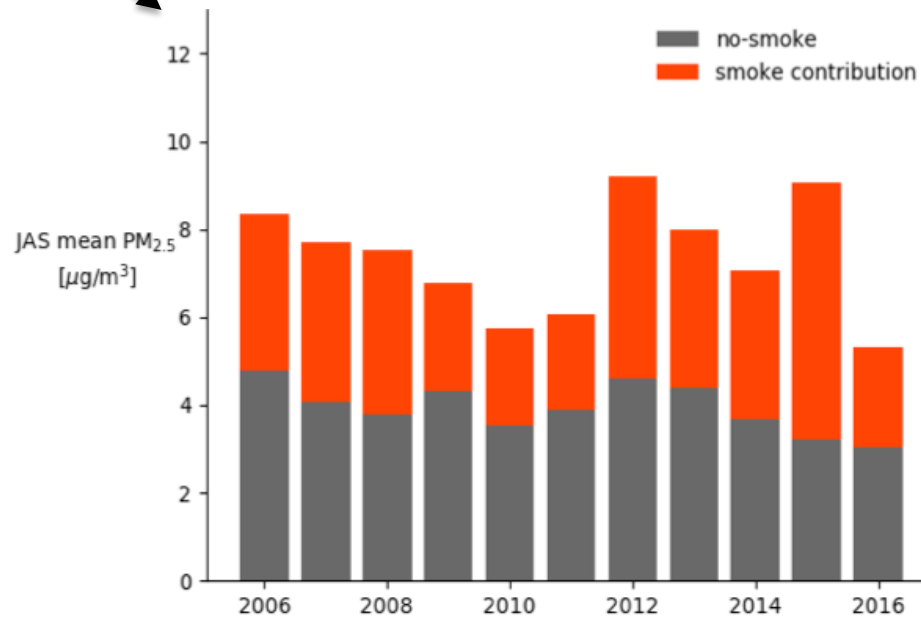
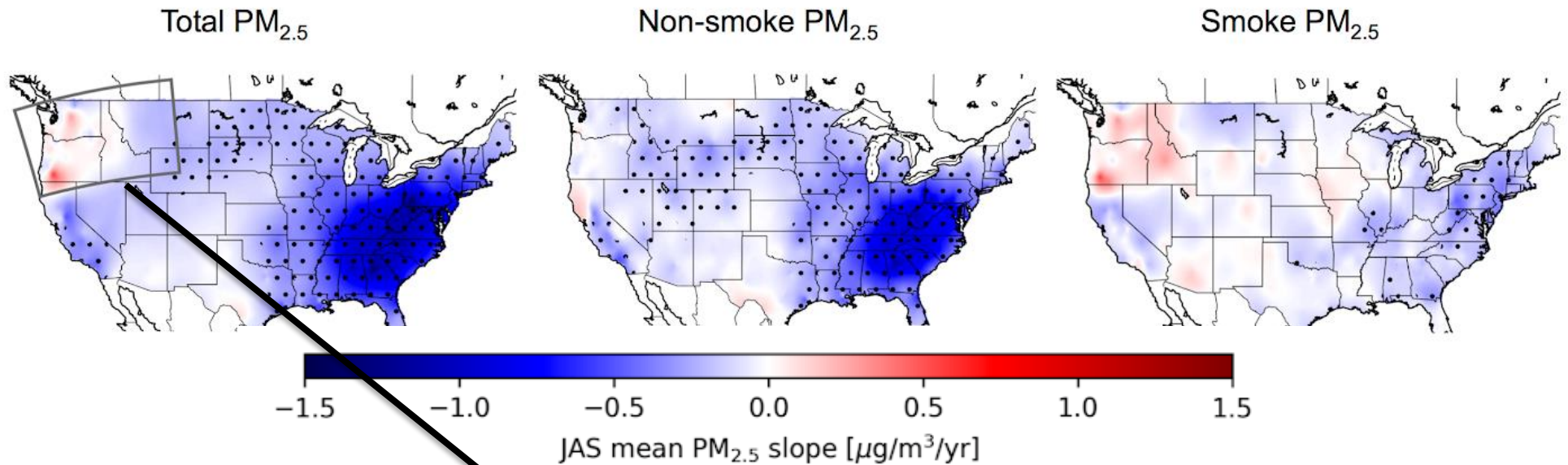
Summer PM_{2.5} trends from 2006-2016 (O'Dell et al., 2018)

Using satellites, we can split this trend into smoke and non-smoke trends (2006-2016)



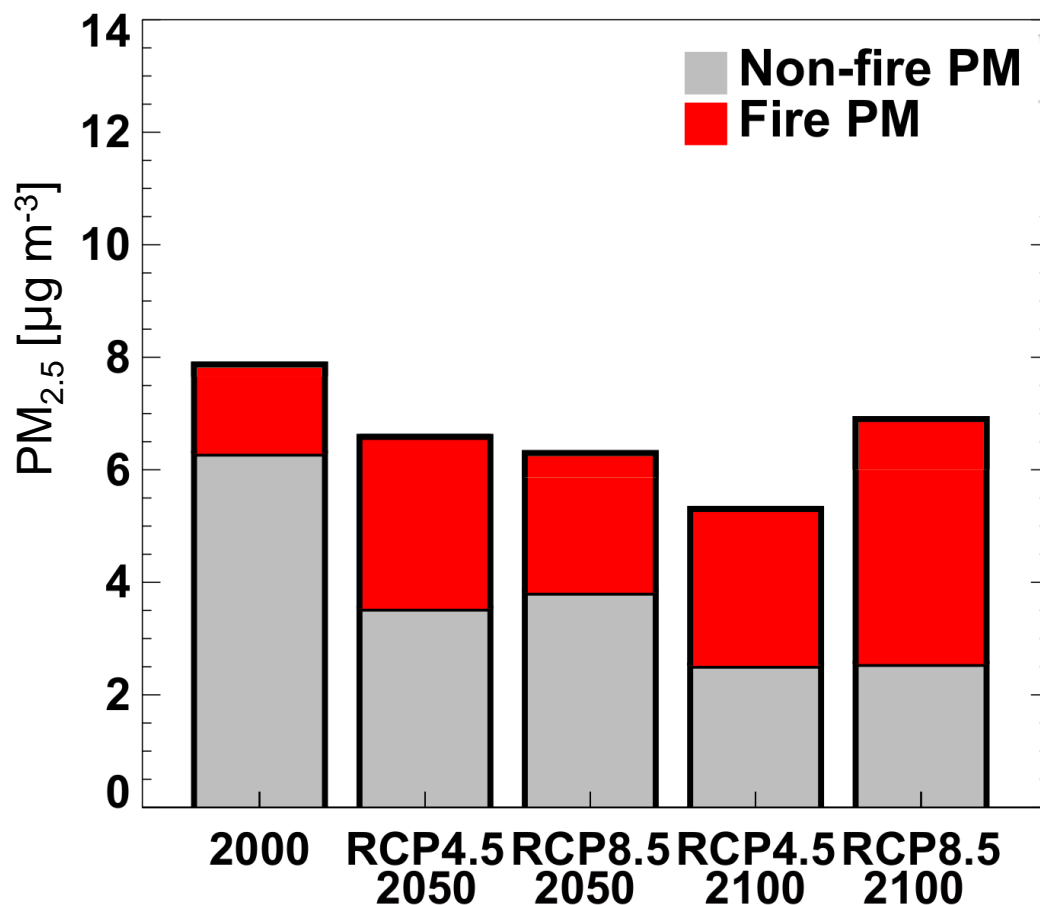
Split using Hazard Mapping System smoke product with information from NASA and NOAA satellites.

Using satellites, we can split this trend into smoke and non-smoke trends (2006-2016)



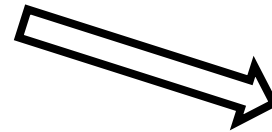
(O'Dell et al., 2018)

Using an Earth System Model, we predict smoke to continue to offset improvements in anthropogenic emissions



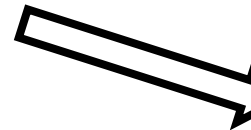
What risk does this wildfire smoke exposure pose to the population?

The answer to this question will help public health agencies better inform the public



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But means that we need to know:

where, when, who, and what?

Project Overview

Health Risk Analysis (Objective 1)

FINN Fire Emissions

Model-based

Satellite-based

Predicted PM

Model Evaluation

Improved Predicted PM

Health Effects Model

Demographic Specific Health Risks

Risks

Residual hospitalizations

Demographic Risk Categories

Forecast Development and Evaluation (Objective 2)

WRF-Chem

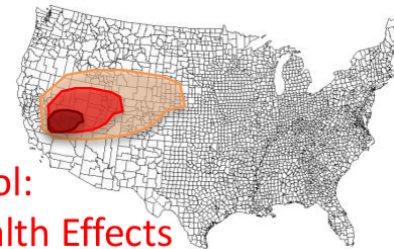
versus

Blue Sky

Predicted PM

Model Evaluation

Predictive Tool:
Expected Health Effects

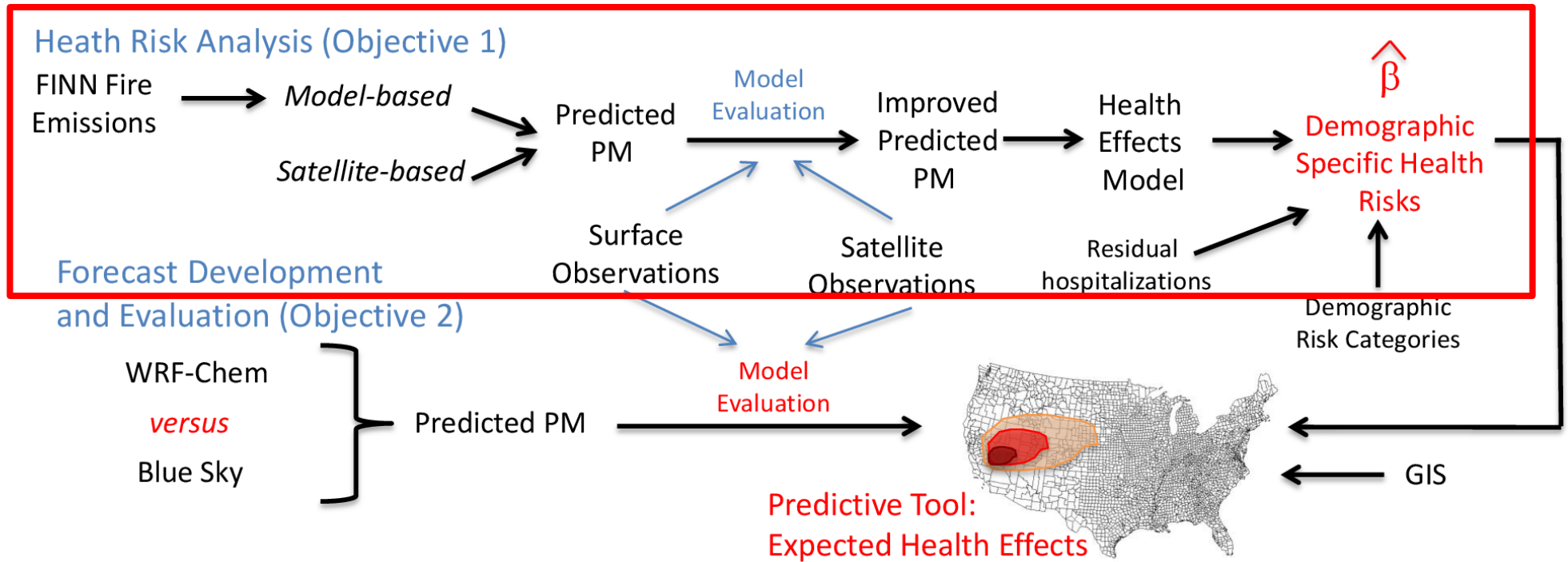


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Demographic Risk Categories

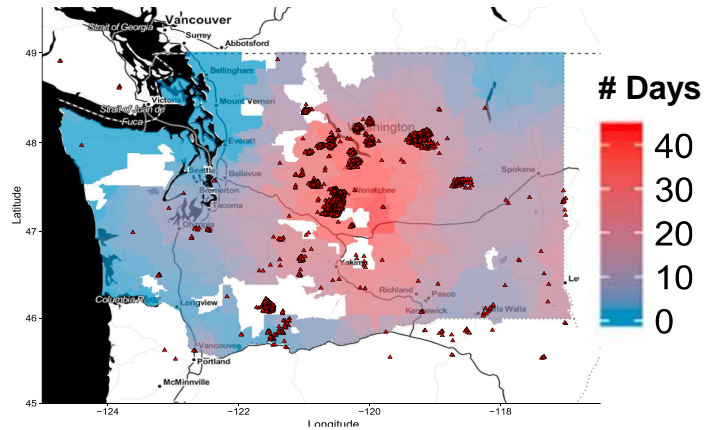
GIS

Objective 1: Health risks



Fire seasons and locations

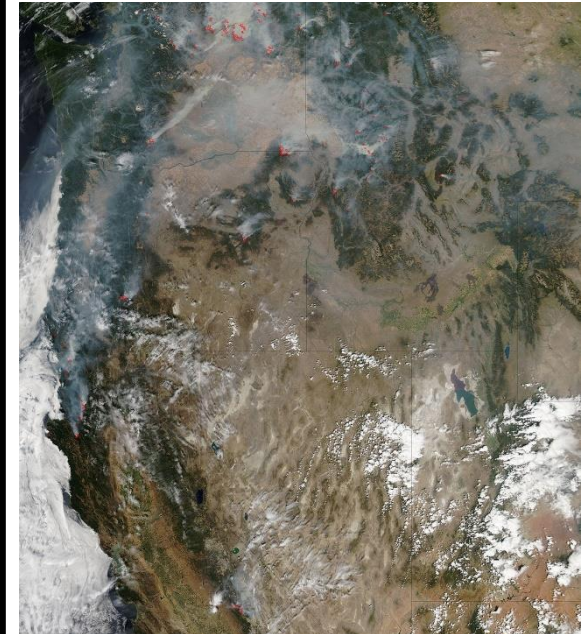
Washington 2012:



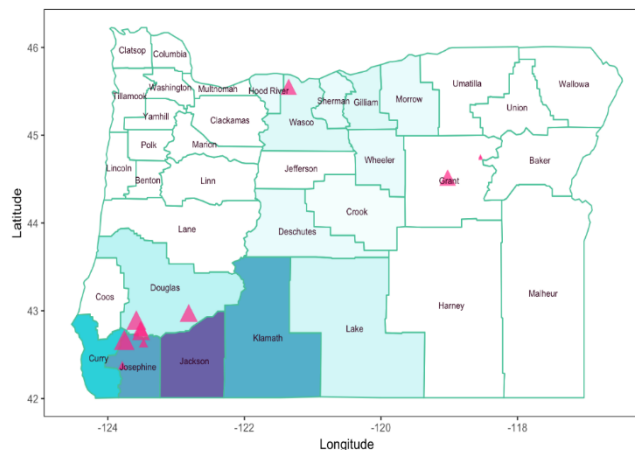
NASA image courtesy LANCE/EOSDIS MODIS Rapid Response Team, GSFC

▲ Fire Locations

Western US 2015:



Oregon 2013:

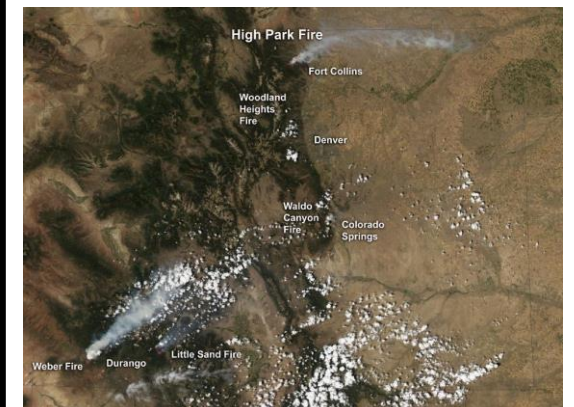


smoke days

0 5 10 15 20 25

NASA image courtesy LANCE/EOSDIS MODIS Rapid Response Team, GSFC

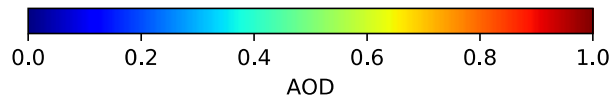
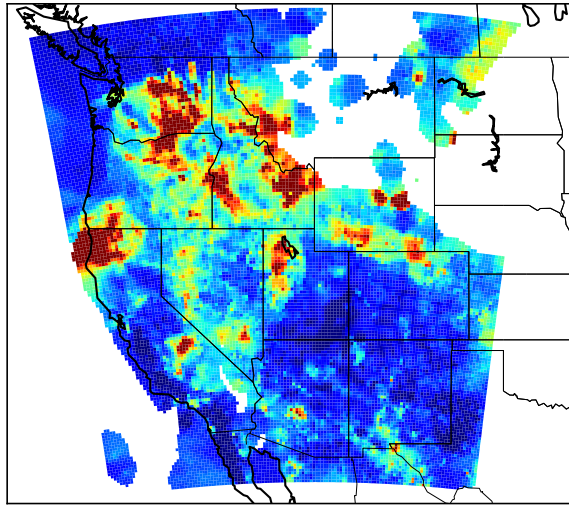
Colorado 2012:



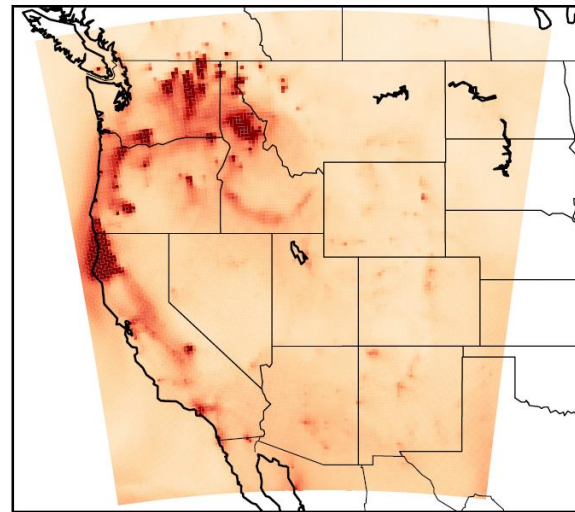
NASA images courtesy LANCE/EOSDIS

We model wildfire smoke $PM_{2.5}$ using geographically weighted regression

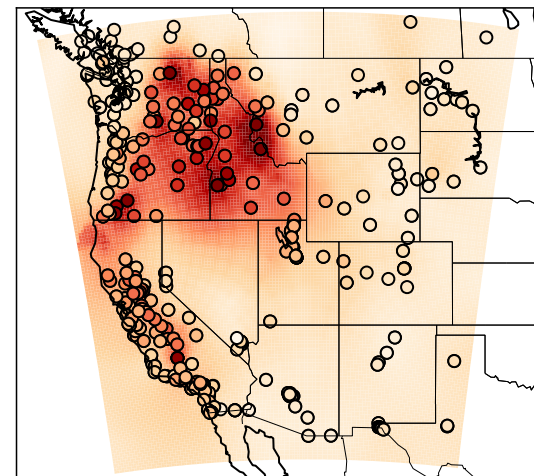
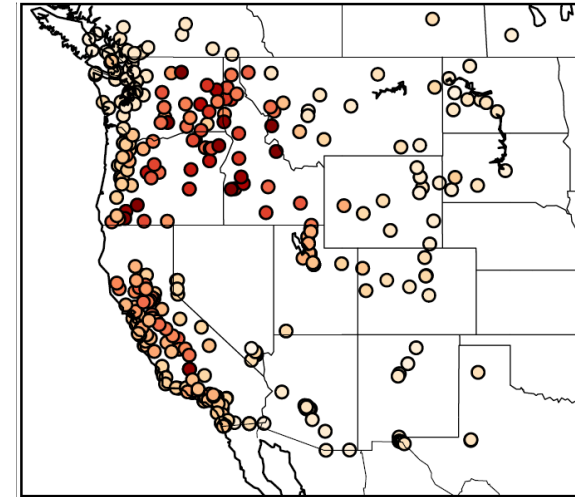
MODIS AOD



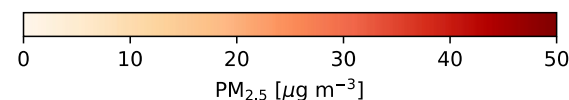
WRF-Chem $PM_{2.5}$



Surface Monitors

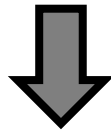


GWR $PM_{2.5}$

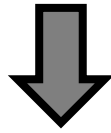


Method to Assess Relationship Between Wildfire Smoke and Health Outcome

Blended wildfire smoke $PM_{2.5}$ concentrations



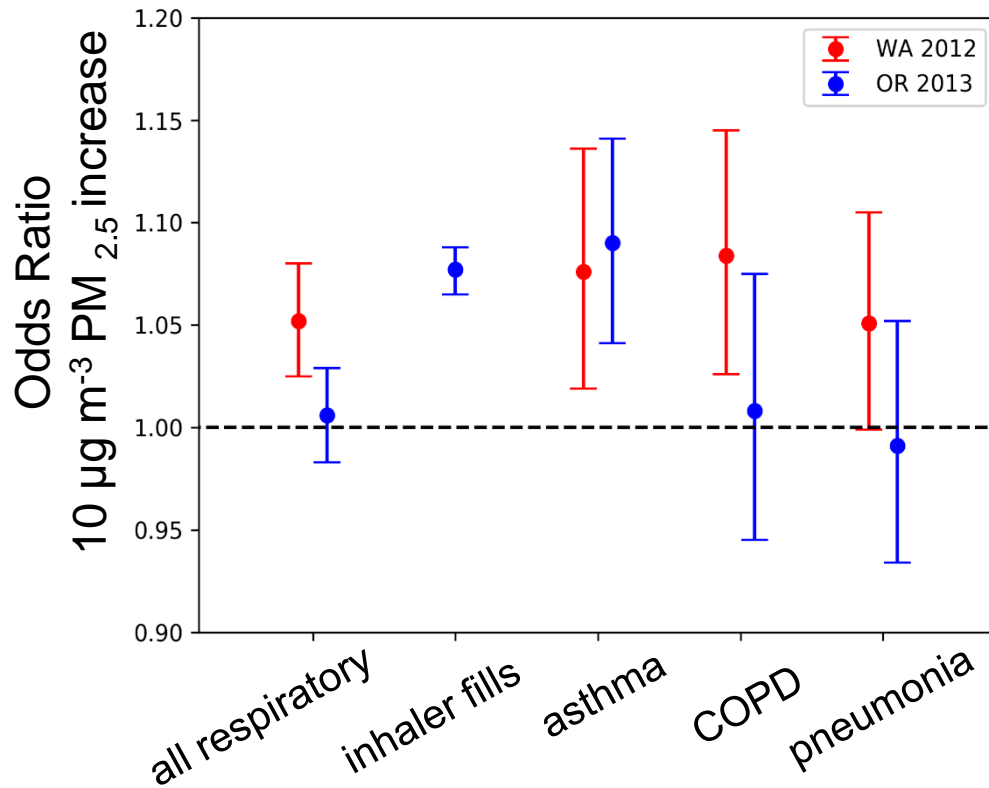
Join smoke estimates to health data



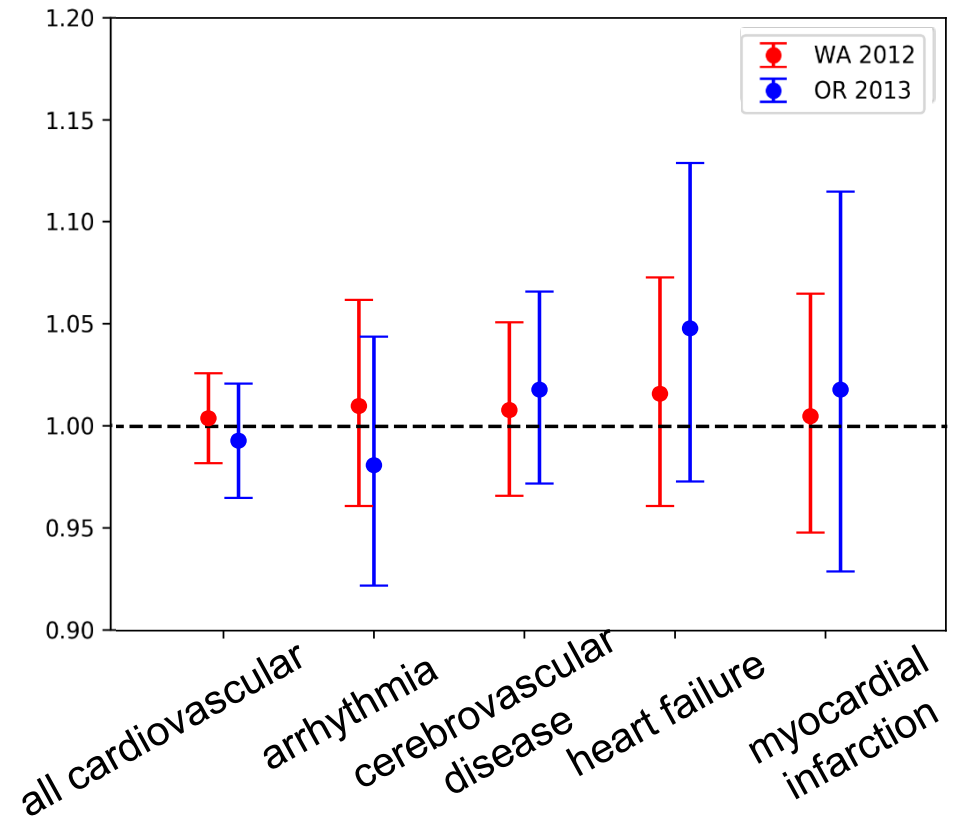
Assess relationship using case-crossover study design

Consistent relationship between smoke and asthma, but no observed association with cardiovascular outcomes

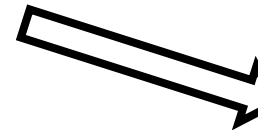
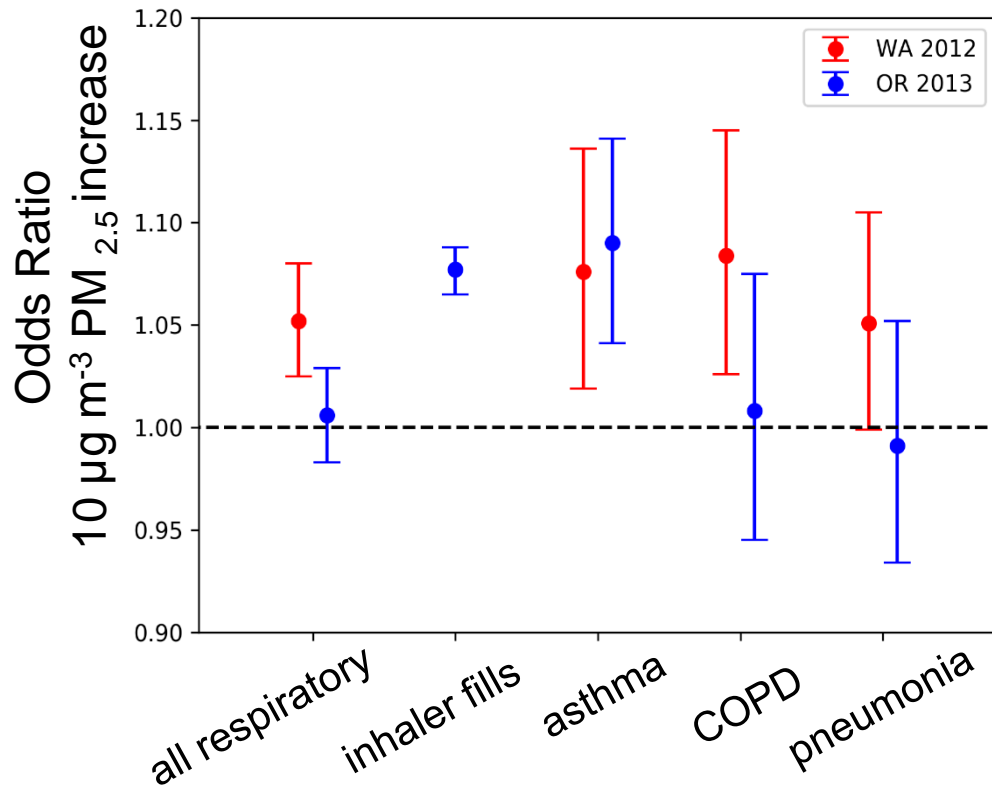
Respiratory Outcomes



Cardiovascular Outcomes

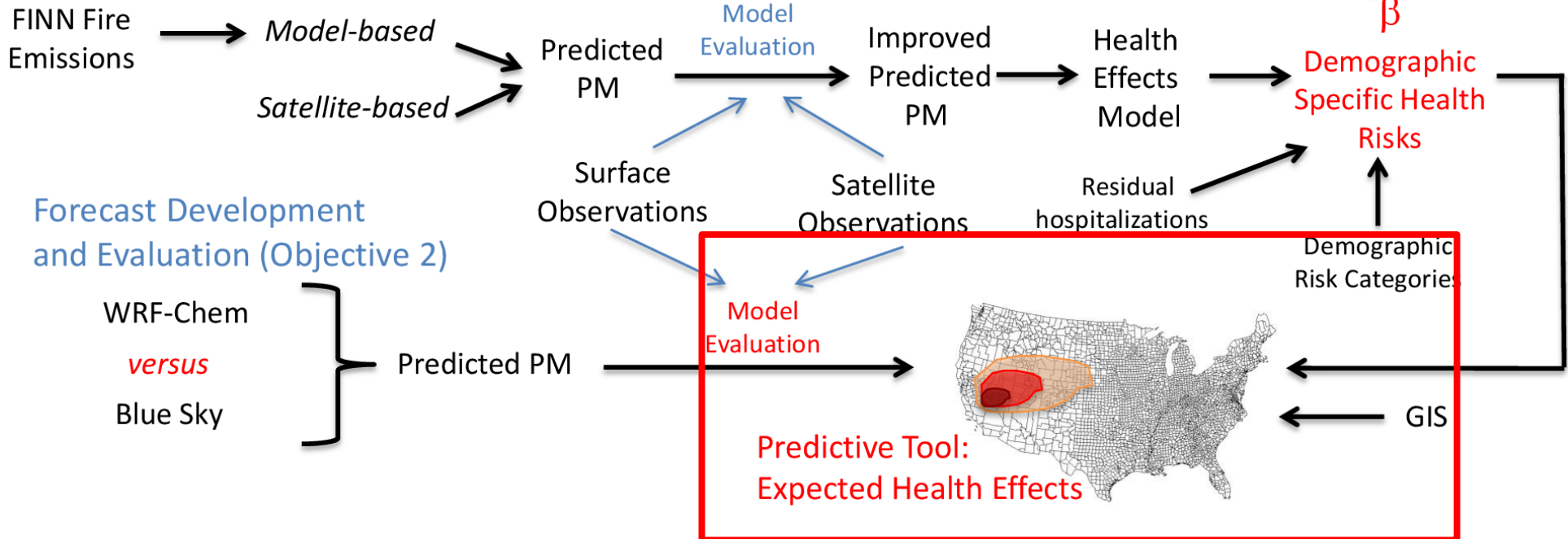


How do we translate this risk?

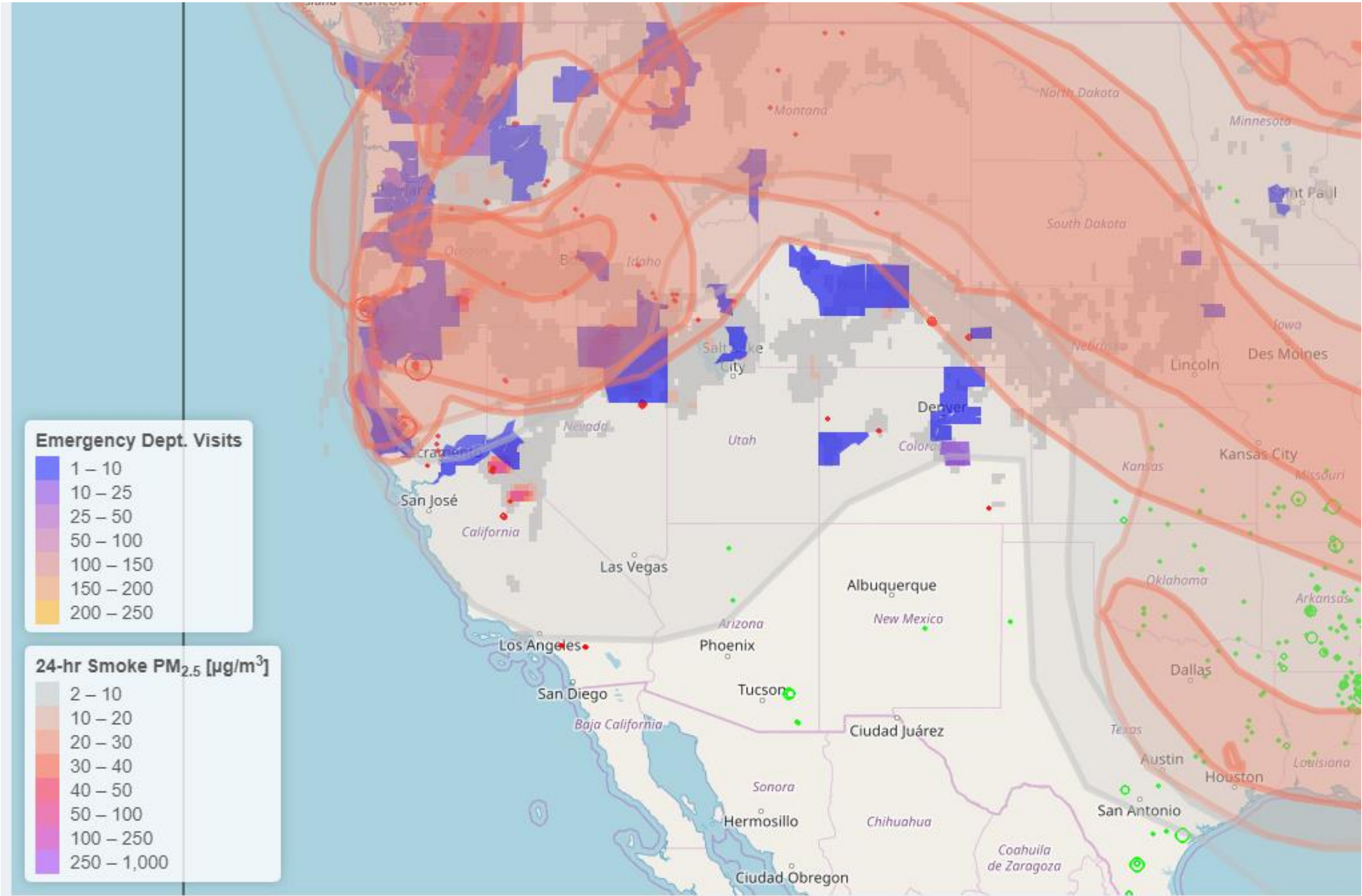


Objective 2: Forecast tool

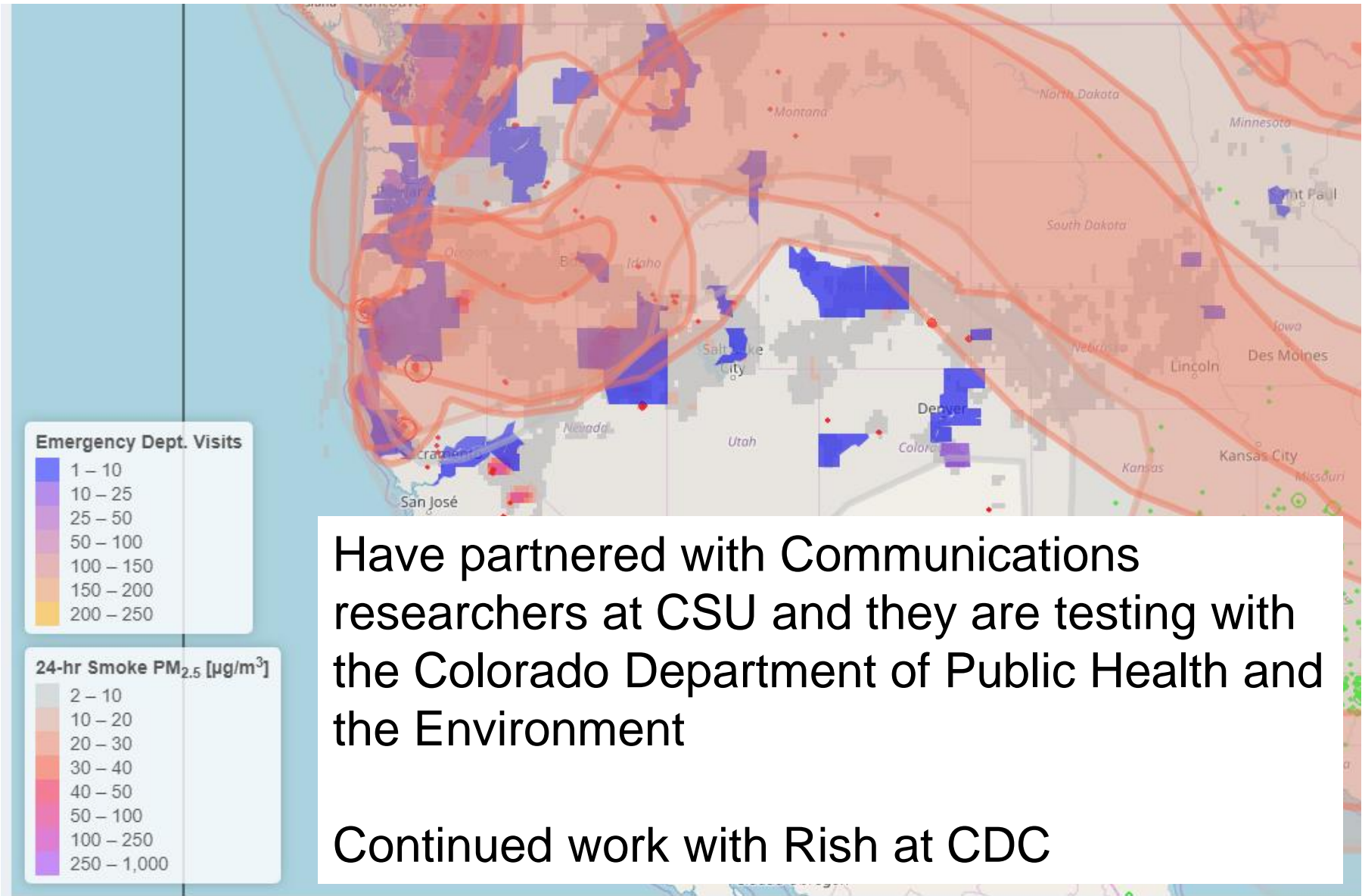
Health Risk Analysis (Objective 1)



Health Forecast Tool



Health Forecast Tool



Goals for remainder of grant

- Test/implement app with CDPHE and continue work with CDC
- Finish Colorado 2012 and 2015 analysis
 - Comparing concentration-response functions assigned using address, ZIP-code, and county (estimating smoke exposure at different grid resolutions).
- A multi-state and year investigation of wildfire smoke on morbidity and mortality (with CDC)
 - Using distributed lag models
 - Exposure estimates for western US and individual states

Papers

- Gan, R. W., B. Ford, W. Lassman, G. Pfister, A. Vaidyanathan, E. Fischer, J. Volckens, J. R. Pierce, S. Magzamen (2017): Comparison of wildfire smoke estimation methods and associations with cardiopulmonary-related hospital admissions, *GeoHealth*, 1, doi:10.1002/2017GH000073.
- Lassman, W., B. Ford , R. W. Gan, G. Pfister, S. Magzamen, E. V. Fischer, and J. R. Pierce (2017): Spatial and Temporal Estimates of Population Exposure to Wildfire Smoke during the Washington State 2012 Wildfire Season Using Blended Model, Satellite, and In-Situ Data, *GeoHealth*, 1, doi: 10.1002/2017GH000049.
- Ford, B., M. Burke, W. Lassman, G. Pfister, and J. R. Pierce: Status Update: Is smoke on your mind? Using social media to assess smoke exposure, *Atmos. Chem. Phys.*, doi:10.5194/acp-17-7451-2017, 17, 7541-7554, 2017.
- Ford, B., M. Val Martin, S. E. Zelasky, E. V. Fischer, S. C. Anenberg, C. L. Heald, J. R. Pierce: Future Fire Impacts on Smoke Concentrations, Visibility, and Health in the Contiguous United States, *GeoHealth*, <https://doi.org/10.1029/2018GH000144>, 2018
- Pratt, J. R., R. W. Gan, B. Ford, S. Brey, J. R. Pierce, E. V. Fischer, S. Magzamen: A National Burden Assessment of Estimated Pediatric Asthma Emergency Department Visits that May be Attributed to Elevated Ozone Levels Associated with the Presence of Smoke, *Env. Mon. Assess.*, in press, 2018.
- O'Dell, K., B. Ford, E.V. Fischer, J.R. Pierce: Wildfires and Summer PM_{2.5} Trends in the United States, *submitted to Env. Sci. Tech.*, 2018.
- Gan, R.W., J. Liu, B. Ford, K. O'Dell, A. Vaidyanathan, A. Wilson, J. Volckens, G. Pfister, E. V. Fischer, J.R. Pierce, S. Magzamen: The association between wildfire smoke exposure and asthma-specific medical care utilization following the 2013 Douglas Complex fire in Oregon, *submit within several weeks to Env. Health Perspectives*, 2018

ARL Review

Starting ARL: **2**

Current ARL: **8 (Objective 1), 7 (Objective 2)**

Projected Ending: **8**

ARL 7 –Application Prototype in Partner’s Decision Making

Extra slides

Health Outcomes

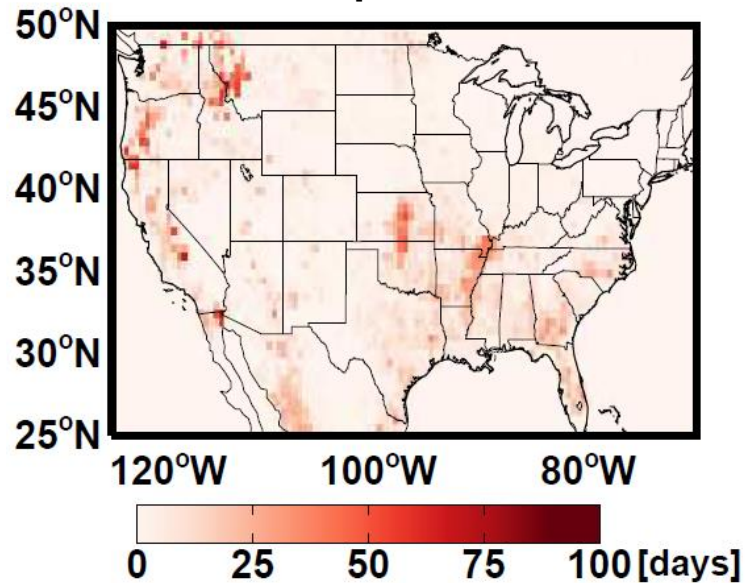
Hospital claims data from the **Washington State Comprehensive Hospital Abstract Reporting System (CHARS)** for the year of 2012; hospital claims only

All payers all claims (APAC) data from the **Oregon Health Authority (OHA)** for the year of 2013; any filed claim (including hospital claims) and pharmacy claims

Hospital claims data from the **Colorado Hospital Association (CHA)** for the years 2011 to 2015; hospital claims only

Exposure to wildfire smoke can be difficult to assess

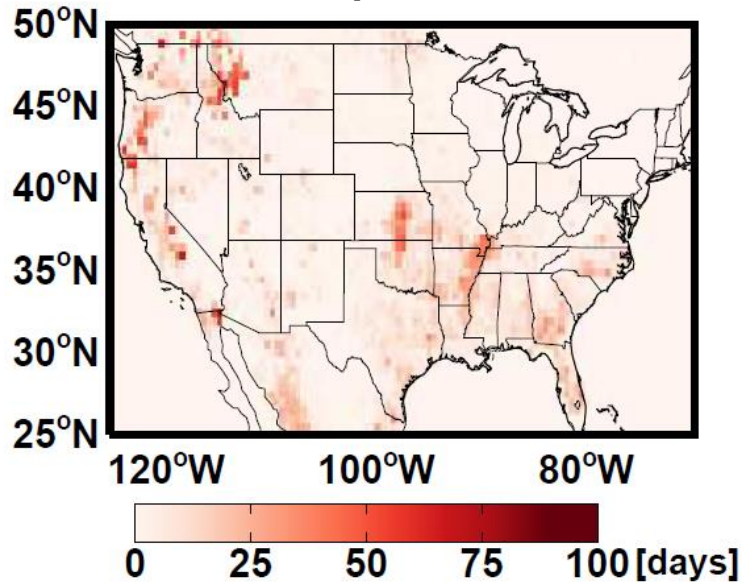
Days with a Fire Reported*
June – September 2017



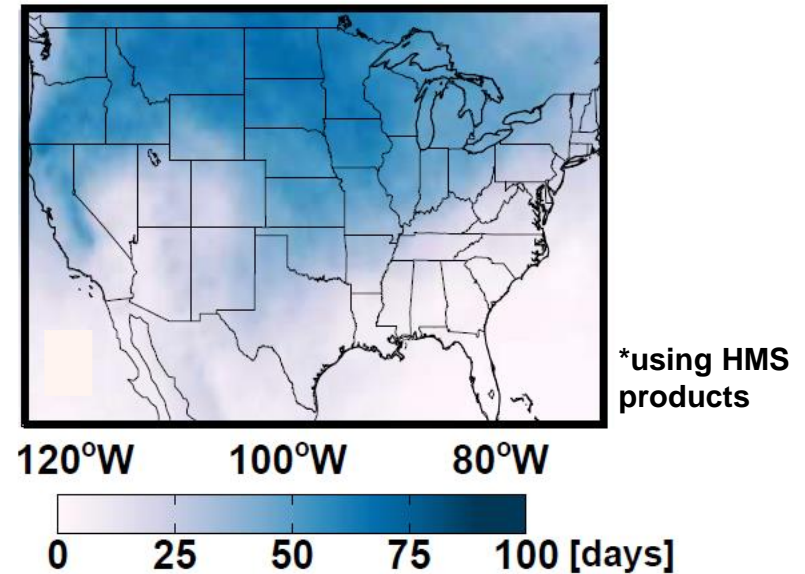
*using HMS products

Exposure to wildfire smoke can be difficult to assess

Days with a Fire Reported*
June – September 2017

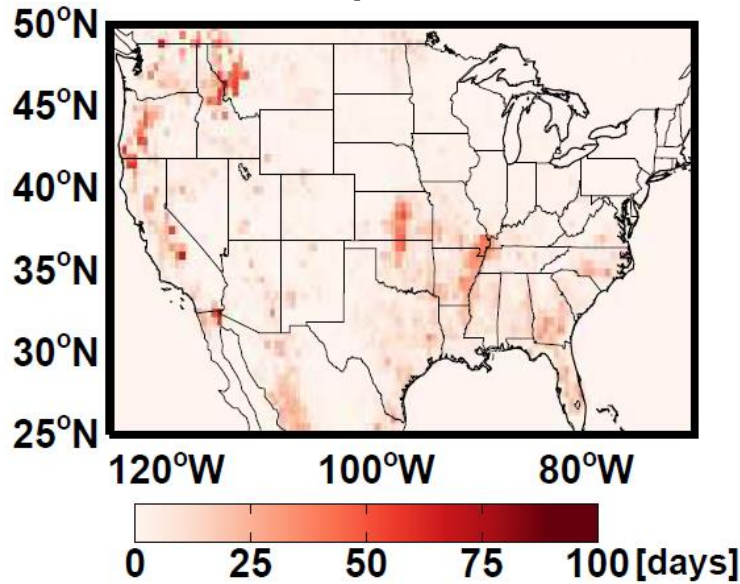


Days with Smoke*
June – September 2017

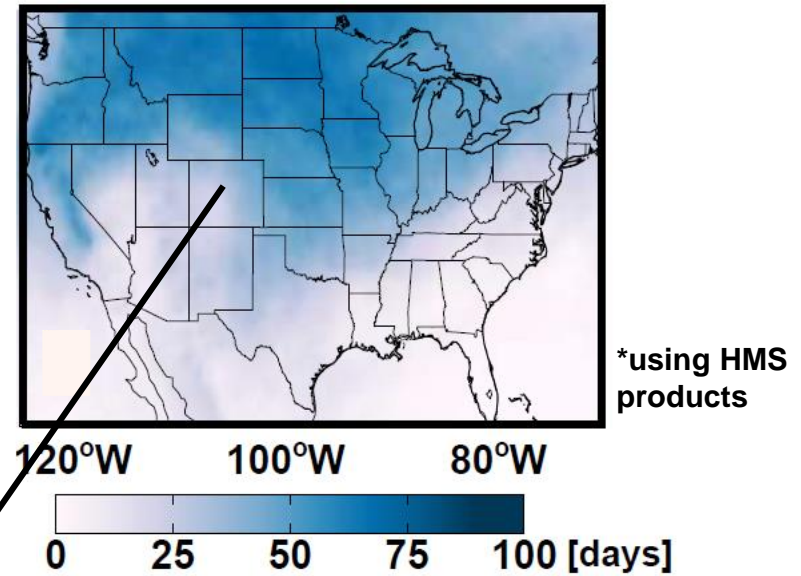


Exposure to wildfire smoke can be difficult to assess

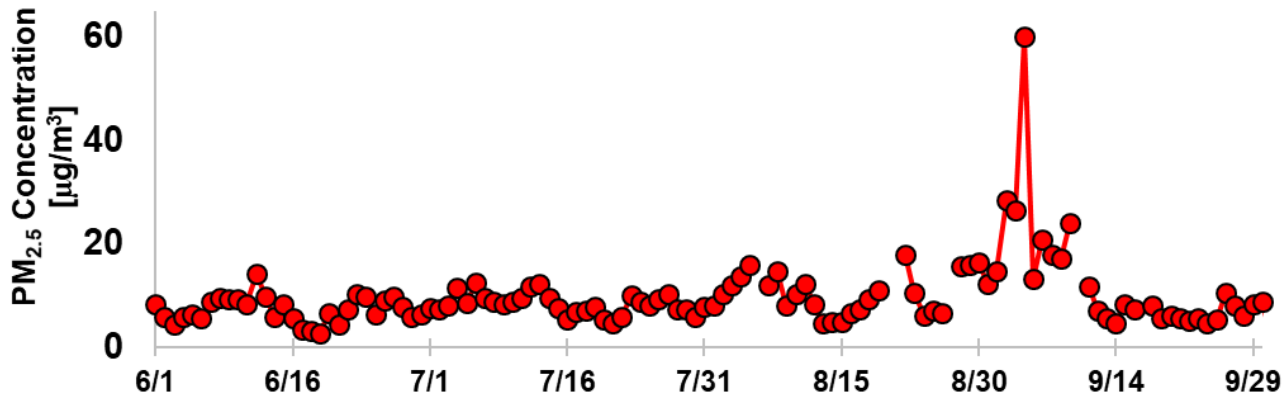
Days with a Fire Reported*
June – September 2017



Days with Smoke*
June – September 2017



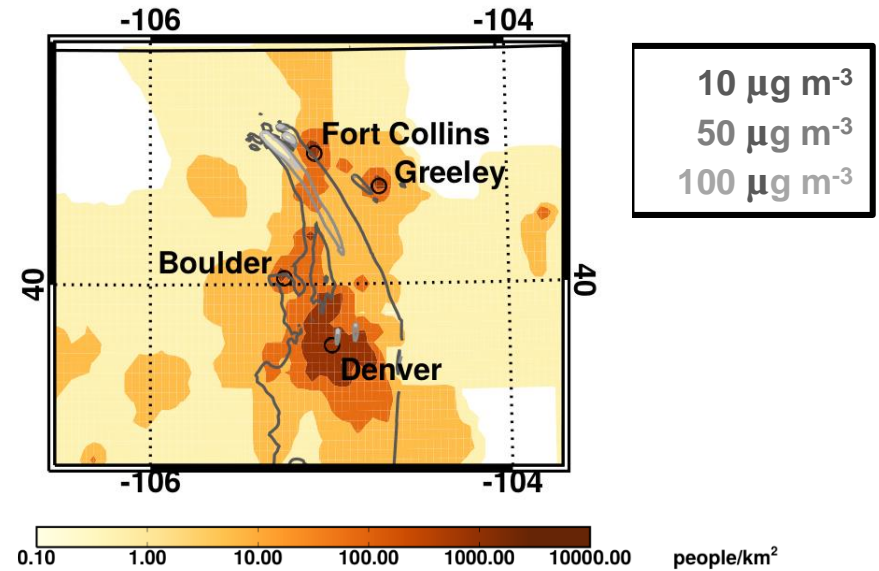
Fort Collins PM_{2.5} June-September 2017



Smoke events are episodic, maybe of short duration, have varying magnitude and may impact a small population

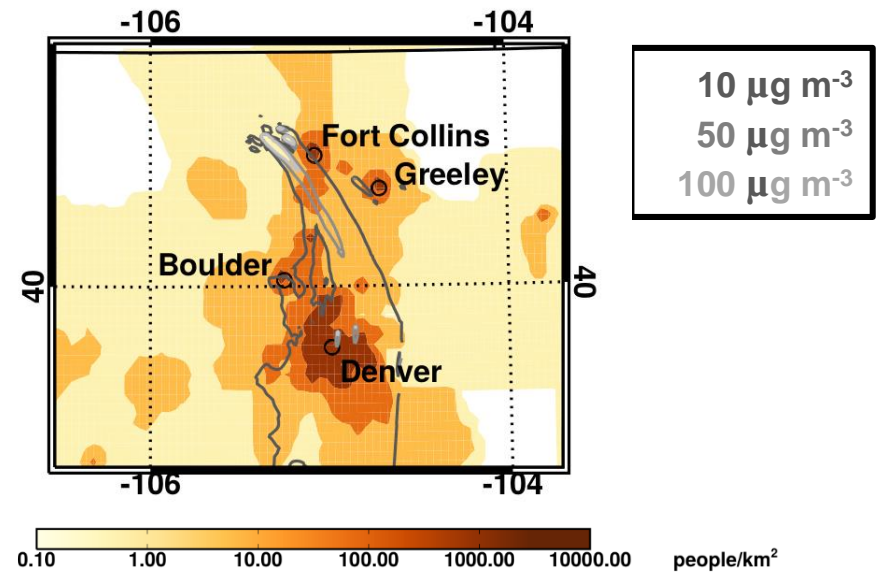
Team Goals:

1. Produce accurate smoke exposure data for several different wildfires
2. Determine health effects specific to (short-term) smoke exposure



Team Goals:

1. Produce accurate smoke exposure data for several different wildfires
2. Determine health effects specific to (short-term) smoke exposure



Methods:

Estimate wildfire smoke PM_{2.5} concentrations



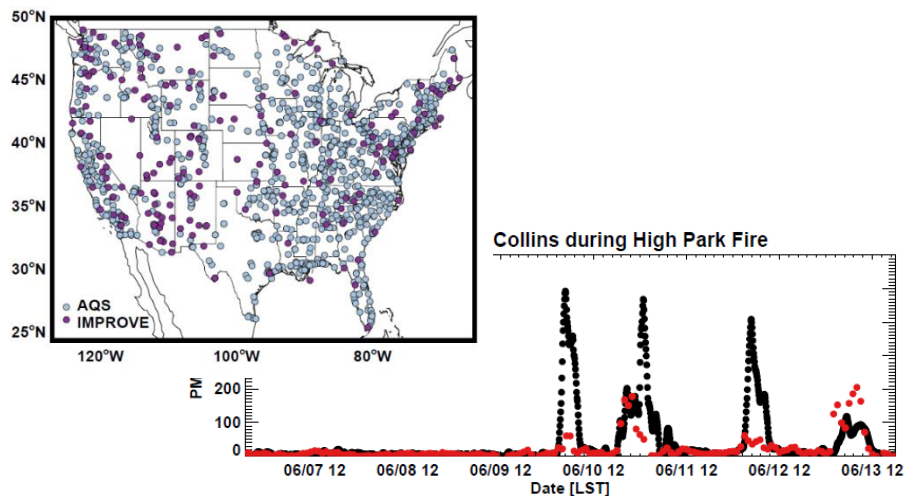
Use smoke estimates with hospital/health claims data



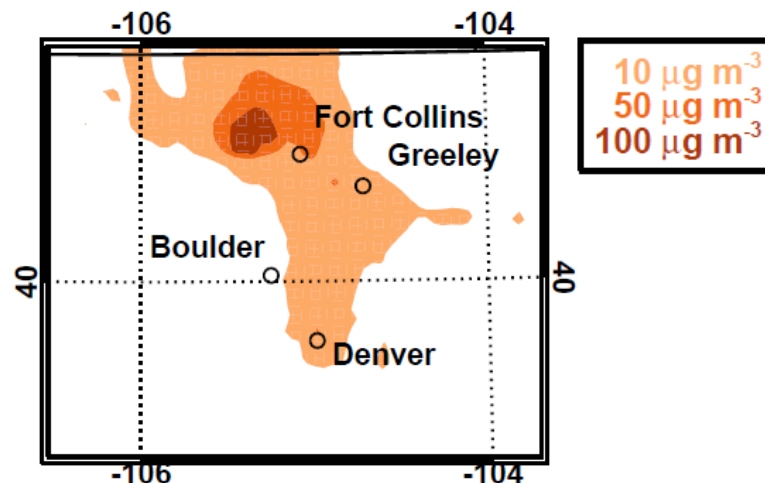
Assess relationship using case-crossover study design

We combine information from different tools to determine smoke concentrations

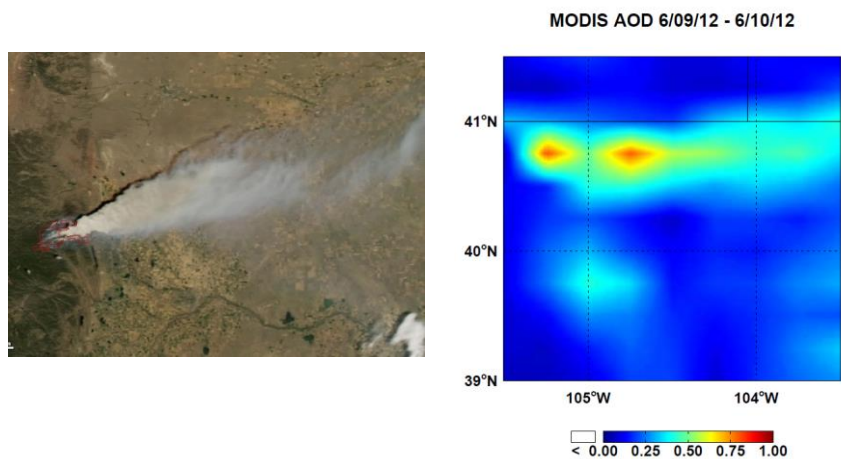
In-situ monitors



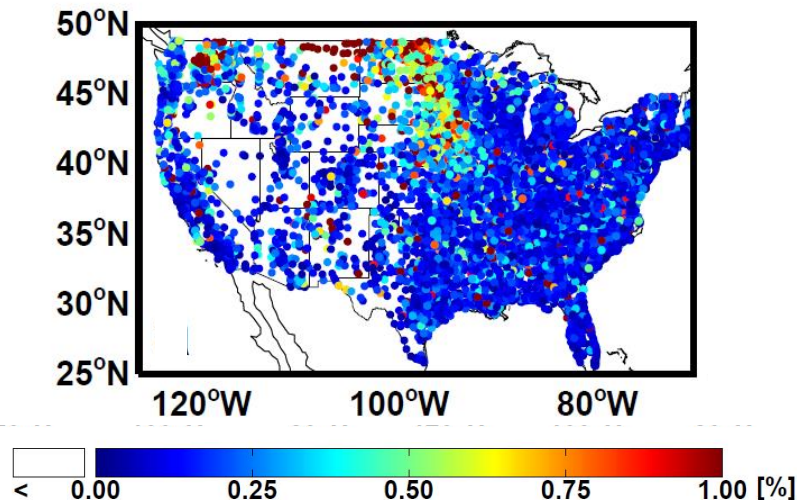
Chemical Transport Model



Satellite observations



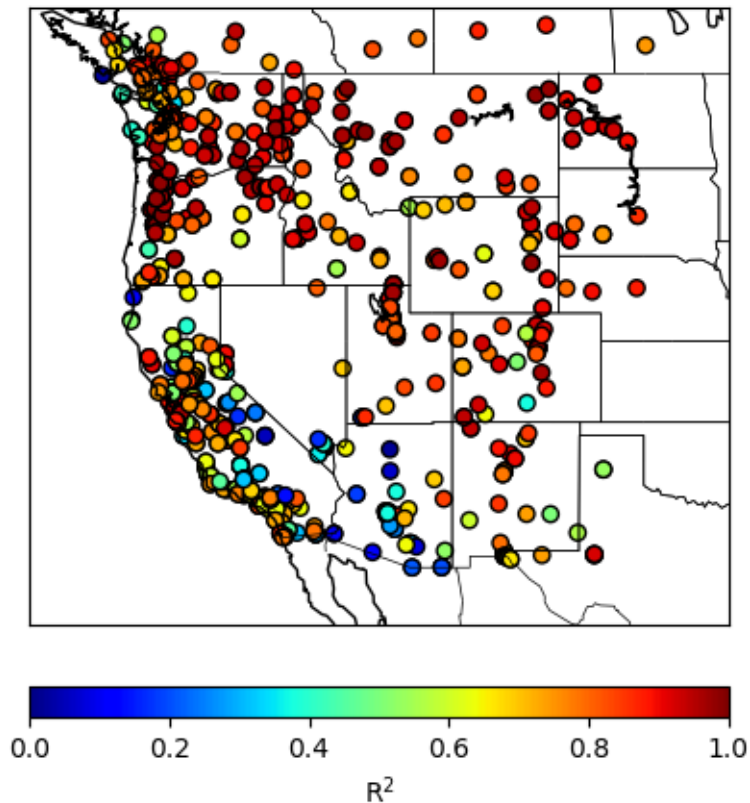
% of Facebook posts (only for 2015/2016)



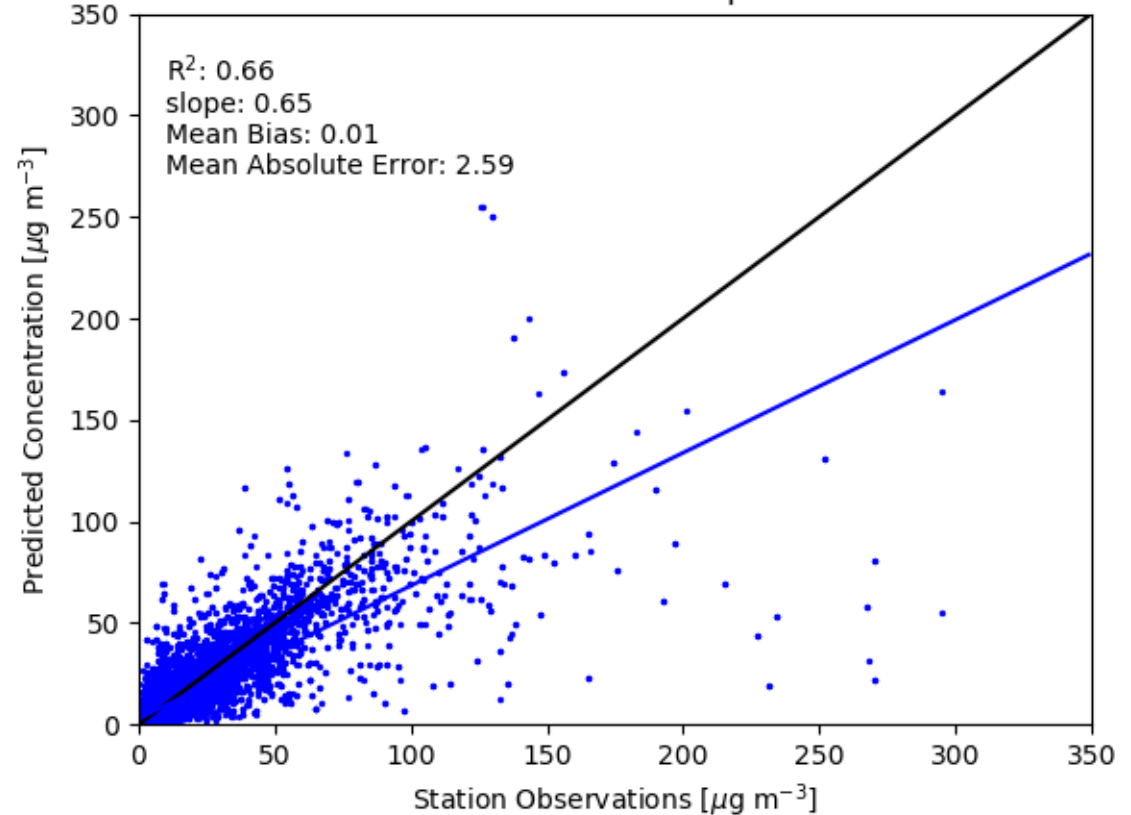
We combine information using Geographically Weighted Regression

$$PM_{est} = A + B * PM_{krige} + C * PM_{wrf} + D * AOD_{MODIS}$$

GWR-Observation Comparison Correlation Map

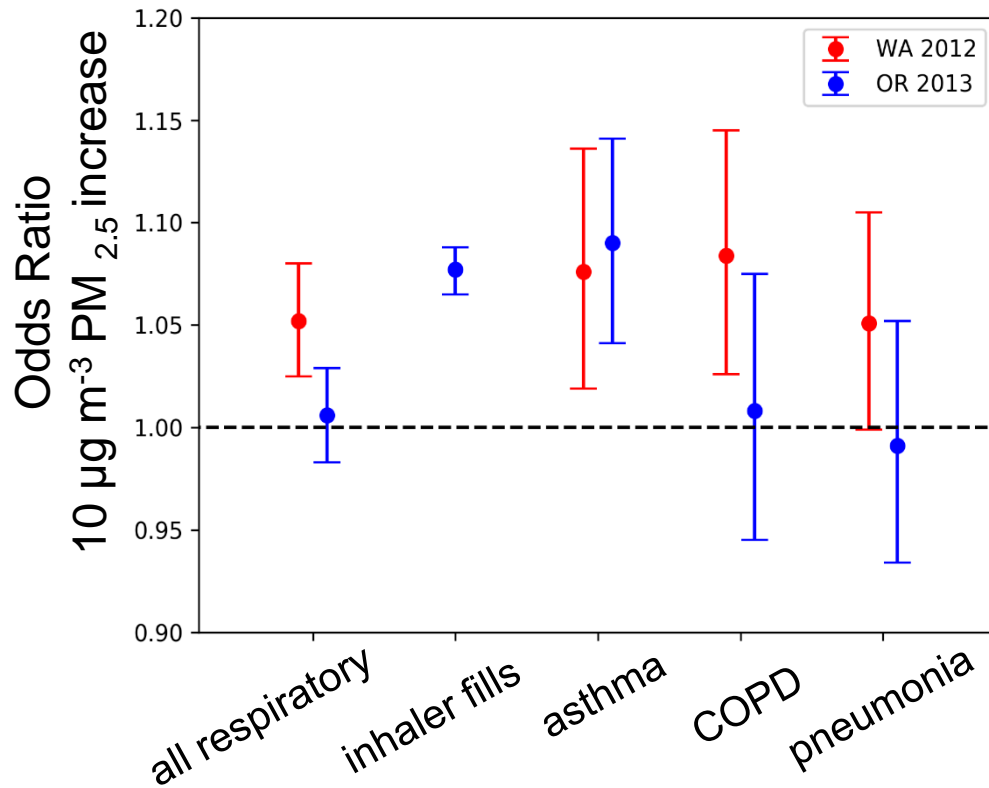


GWR-Observation Comparisons

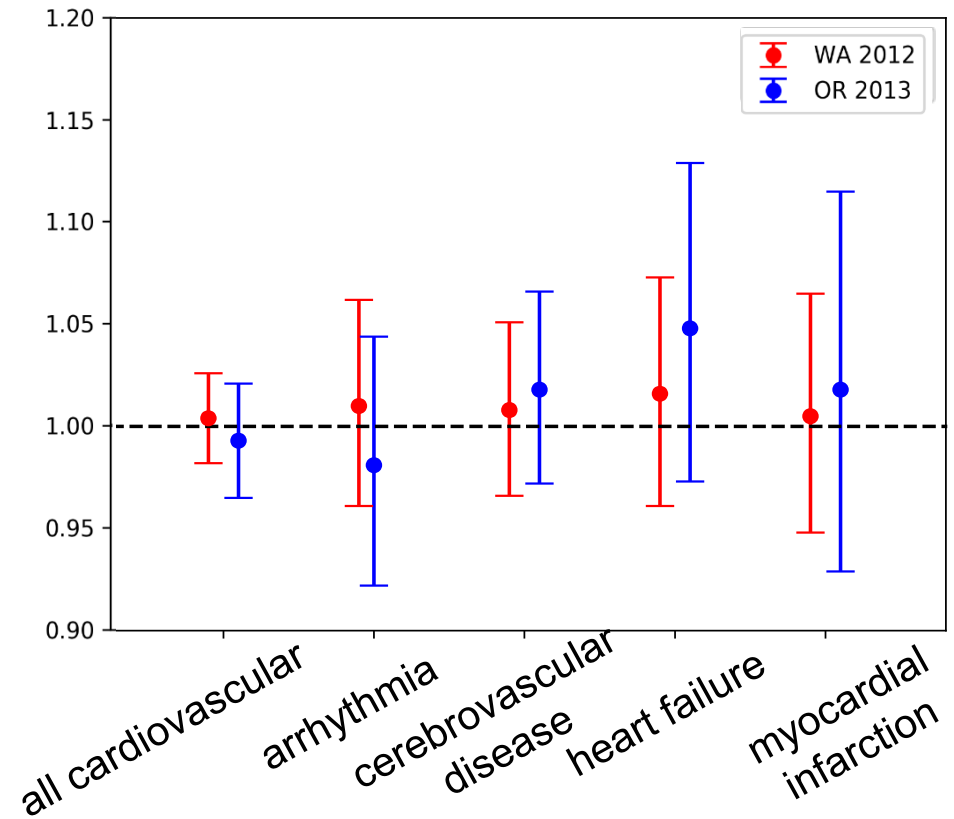


Consistent relationship between smoke and asthma, but no observed association with cardiovascular outcomes

Respiratory Outcomes



Cardiovascular Outcomes



Results for Washington 2012 and Oregon 2013

Health Outcome	Washington 2012 10 $\mu\text{g m}^{-3}$ increase		Oregon 2013 10 $\mu\text{g m}^{-3}$ increase	
	Odds Ratio	95% CI	Odds Ratio	95% CI
All Respiratory	1.05	1.03-1.08	1.01	0.98-1.03
Asthma	1.08	1.02-1.14	1.09	1.04-1.14
Cardiovascular Disease	1.00	0.98-1.03	0.99	0.97-1.02
Heart Failure	1.02	0.96 – 1.07	1.05	0.97-1.13
Respiratory Rescue Medication	--	--	1.08	1.07-1.09