



**Trends in Source Impacts at Long-Running PM<sub>2.5</sub> CSN Monitoring Sites in the Pacific Northwest and Intermountain West**

**Robert Kotchenruther  
NW-AIRQUEST Meeting  
June 11-13, 2019**

# Motivation:

- **Some PM2.5 monitors have a long record of chemically speciated data.**
- **These data can be used for source apportionment modeling (e.g., PMF)**
- **We can use source apportionment results to look at changes in source impacts over time.**
- **Some sources have a long history of being targeted for emissions reductions (e.g., residential wood combustion, sulfur in fossil fuels)**
- **??? How successful have we been?**
- **??? Are there any unexpected results?**

# **This Approach:**

## **Data:**

- 1) Review currently active sites that collect chemically speciated PM<sub>2.5</sub> data.**
- 2) Select sites that are up to date in data submissions to EPA's AQS system (data through summer 2018)**
- 3) Select sites that have a data record going back to when EPA switched carbon measurement methods to match the IMPROVE methodology (2007-2009).**

## **Modeling:**

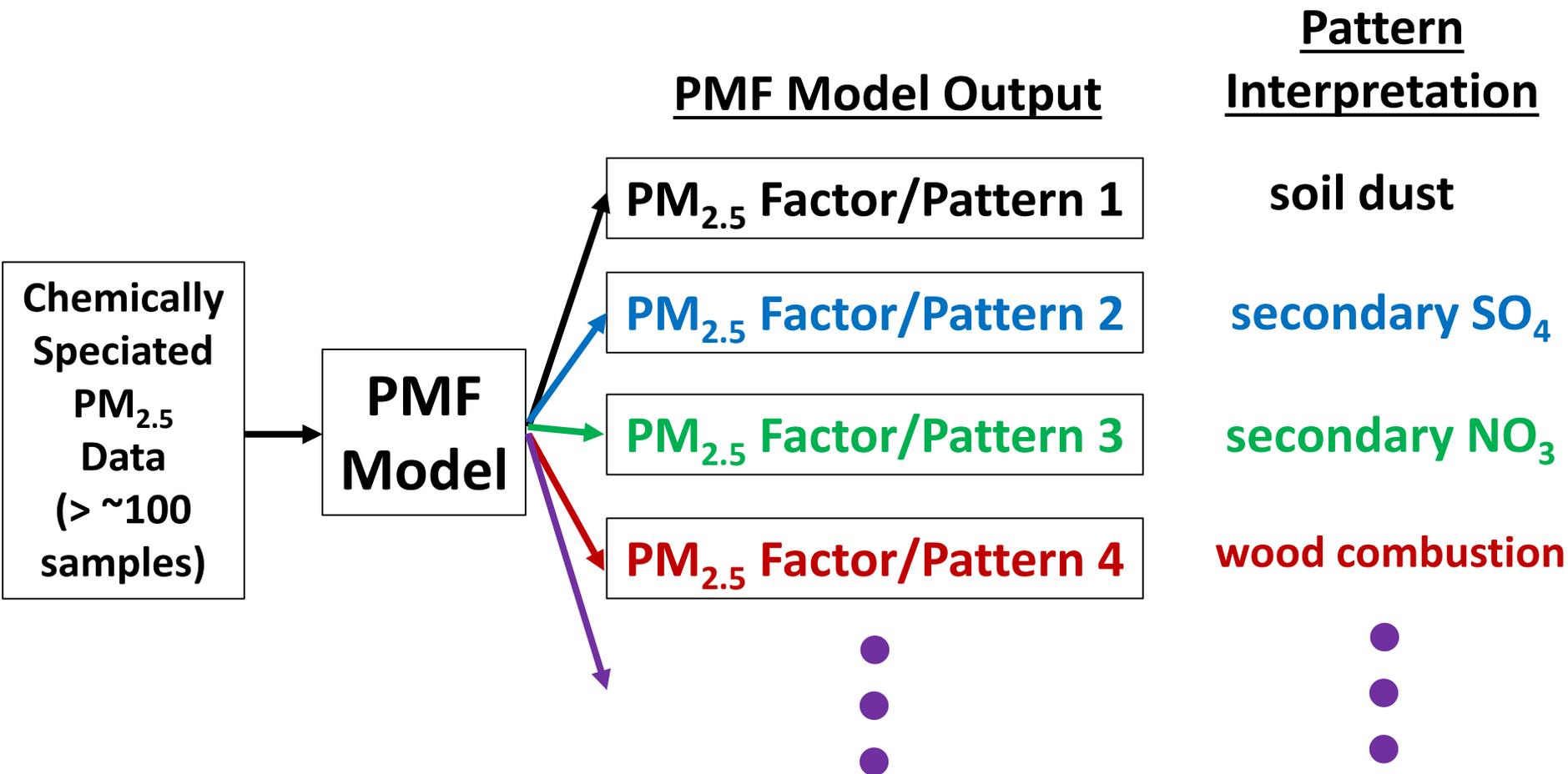
- 1) Run sites' data in PMF and get source apportionment results (each site run independently)**
- 2) Analyze year to year changes in resulting sources.**

## **Note:**

- For this presentation I focus on year to year results for winter months Nov – Feb (but all data was used in modeling)**
- A 'winter year' is Nov – Feb. So, for example, '2015 winter' is Nov-Dec 2015 and Jan-Feb 2016**

# How does the PMF source apportionment model work?

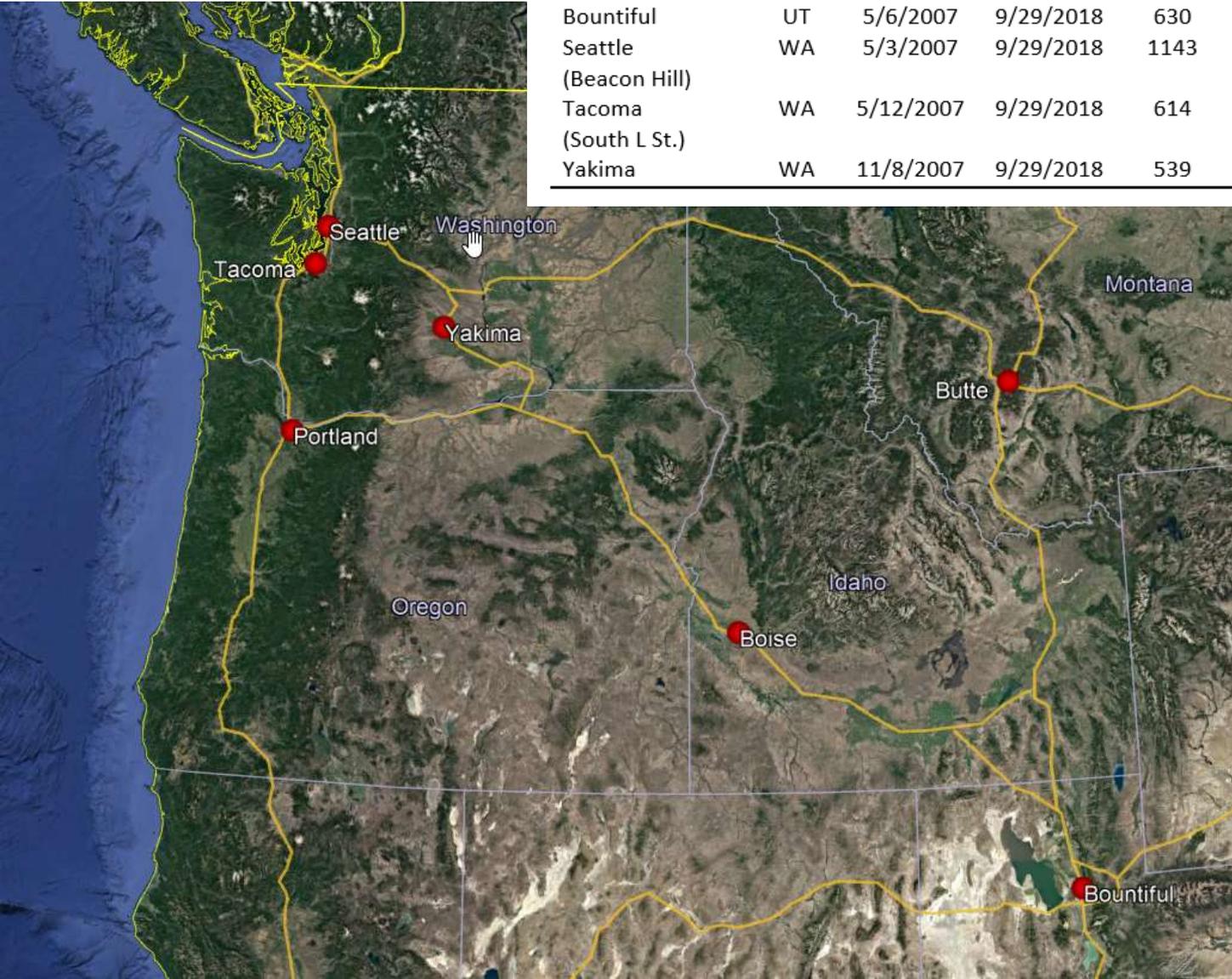
The model looks for systematic patterns in the day-to-day chemical variations and quantifies a smaller set of 'factors' that can explain the overall data variability.



# 7 Sites Analyzed

CSN monitoring sites analyzed in this study.

City	State	Start date	End date	Number of samples	EPA AQS Number	Latitude	Longitude
Boise	ID	5/3/2007	9/29/2018	1306	160010010	43.6003	-116.3479
Butte	MT	10/04/2009	9/29/2018	471	300930005	46.0026	-112.5012
Portland	OR	5/3/2007	9/29/2018	1185	410510080	45.4965	-122.6034
Bountiful	UT	5/6/2007	9/29/2018	630	490110004	40.9030	-111.8845
Seattle (Beacon Hill)	WA	5/3/2007	9/29/2018	1143	530330080	47.5683	-122.3081
Tacoma (South L St.)	WA	5/12/2007	9/29/2018	614	530530029	47.1864	-122.4517
Yakima	WA	11/8/2007	9/29/2018	539	530770009	46.5968	-120.5122



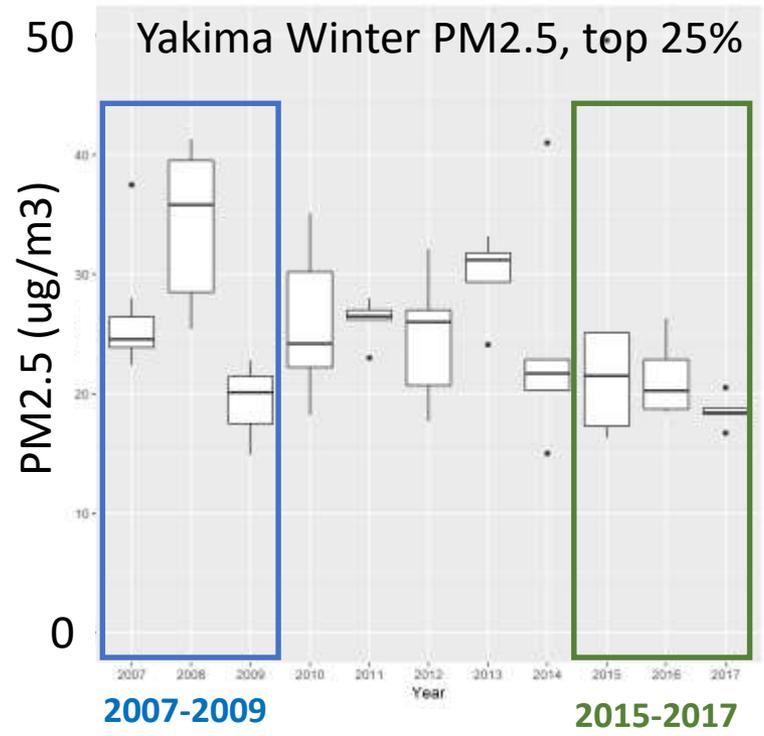
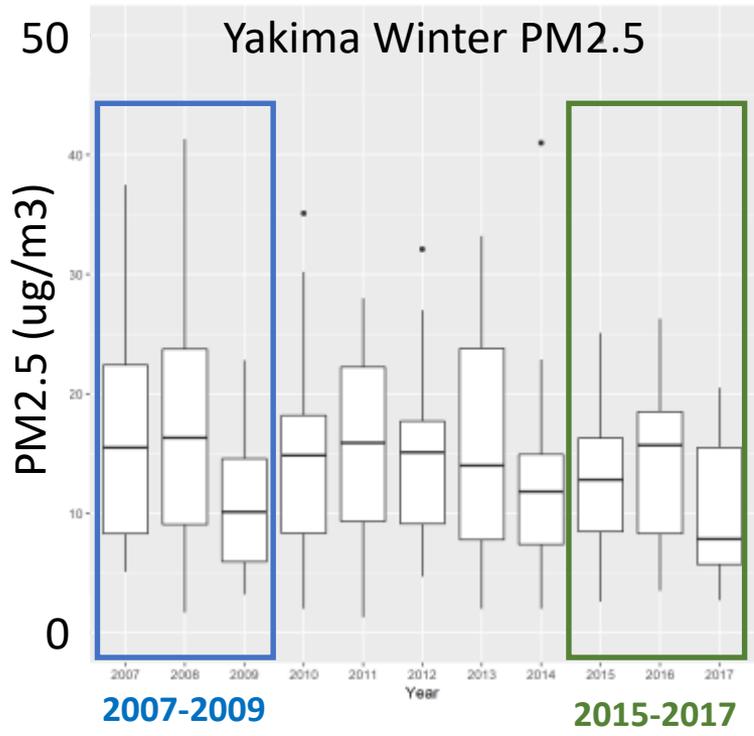
# What were the common types of chemical patterns / factors / sources found from PMF analysis?

Factor / Pattern	Boise, ID	Butte, MT	Portland, OR	Bountiful, UT	Seattle, WA (Beason Hill)	Tacoma, WA (South L St.)	Yakima, WA
Fresh Wood Smoke	✓	✓	✓	✓	✓	✓	✓
Aged Wood Smoke	✓	✓	✓	✓	✓	✓	✓
Soil / Dust	✓	✓	✓	✓	✓		✓
Gas Engines		✓	✓	✓	✓	✓	✓
Ammonium Sulfate	✓	✓	✓	✓			✓
Ammonium Nitrate	✓	✓		✓			✓
Diesel Engines	✓	✓		✓	✓		
Sulfate Dominant			✓		✓	✓	
Sea Salt			✓		✓	✓	
Residual Oil Combustion					✓	✓	
Nitrate Dominant			✓		✓		
Industrial (Sulfate & Metals)					✓		
Mixed			✓			✓	

# Format of results analysis - Example of Yakima WA

## Changes in winter (Nov-Feb) PM<sub>2.5</sub>\* from 2007-2017.

\*only using PM2.5 data coincident with CSN monitoring



		2007-2009			2015-2017			Comparing 2007-2009 with 2015-2017	
		Mean (ug/m3)	Stdev (ug/m3)	Median (ug/m3)	Mean (ug/m3)	Stdev (ug/m3)	Median (ug/m3)	WMW# p-value (Δ significant?)	% Change in Mean
Yakima	Winter PM2.5	16.0	9.8	14.5	12.6	8.1	10.9	0.050	-21.3
Yakima	Winter PM2.5 (top 25%)	28.6	7.6	25.9	22.0	8.5	18.8	0.003	-23.0

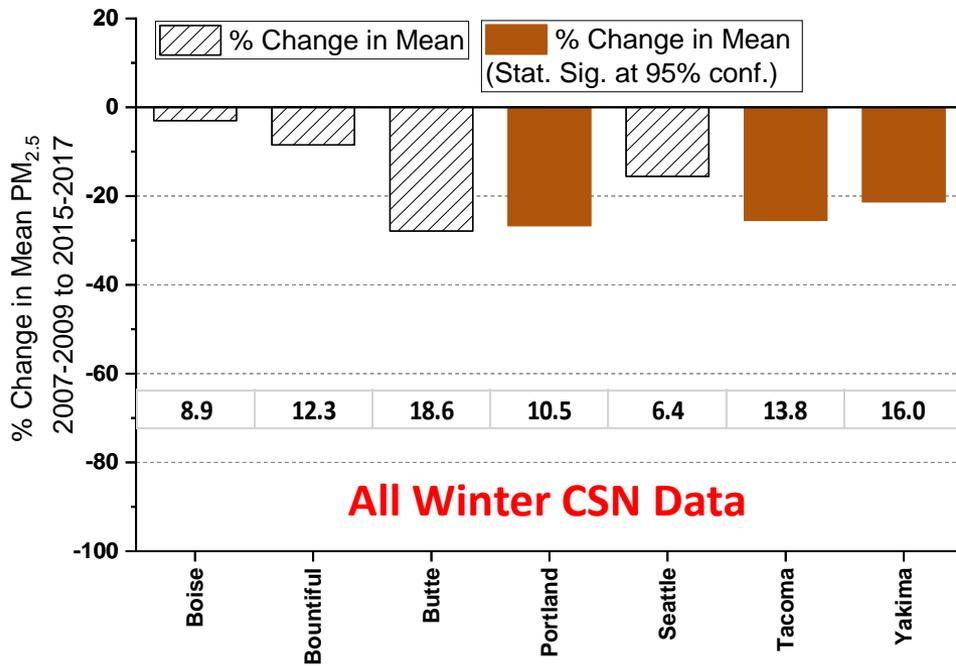
#WMW = Wilcoxon-Mann-Whitney significance test (non-parametric)

**Changes in winter (Nov – Feb) PM<sub>2.5</sub>**

**2007-2009 to 2015 - 2017**

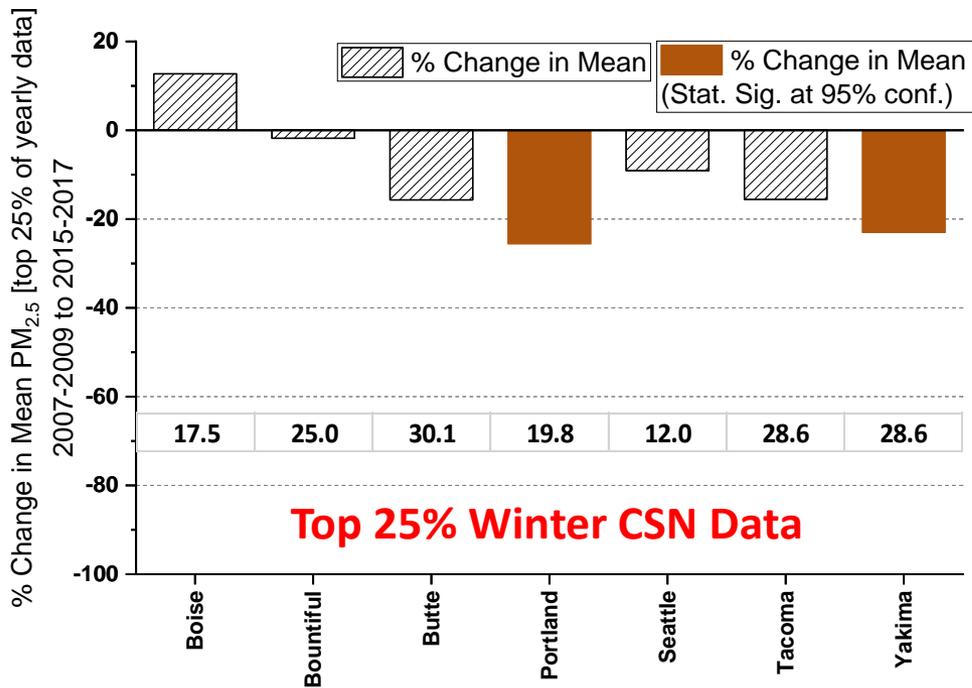
# Change in 3-year average winter $PM_{2.5}$ \* [2007-2009 to 2015-2017]

\*only using  $PM_{2.5}$  data coincident with CSN monitoring



Beginning 2007-2009 average winter  $PM_{2.5}$  mass ( $\mu g/m^3$ )

All Winter CSN Data



# Change in 3-year average winter $PM_{2.5}$ \* [2007-2009 to 2015-2017] for top 25% of yearly data.

\*only using  $PM_{2.5}$  data coincident with CSN monitoring

Beginning 2007-2009 average winter  $PM_{2.5}$  mass ( $\mu g/m^3$ ) for top 25% of yearly data.

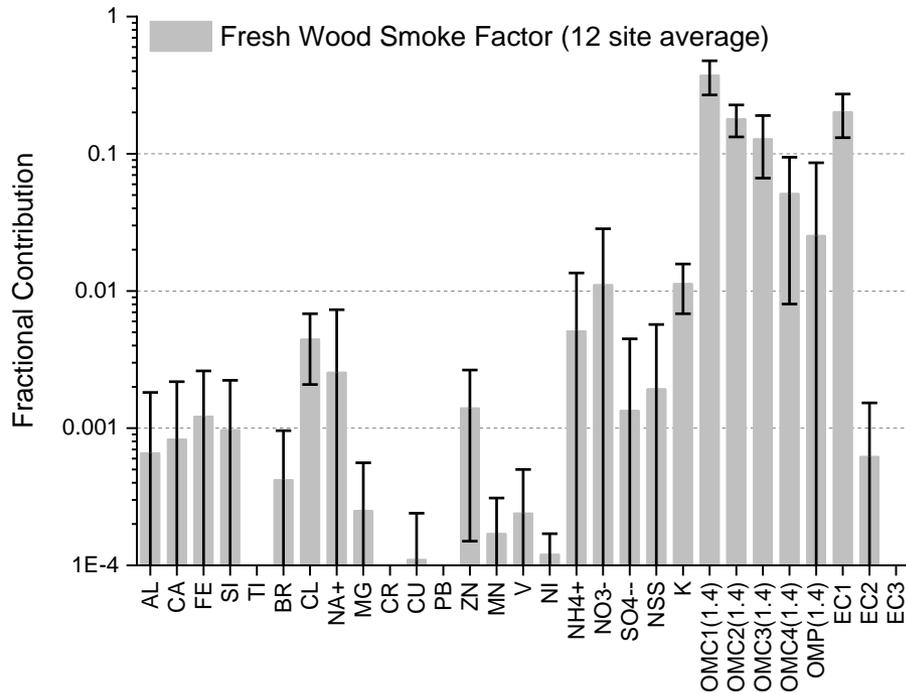
Top 25% Winter CSN Data

# **Results for Winter Wood Smoke PM<sub>2.5</sub>**

**(2007-2009 to 2015 – 2017)**

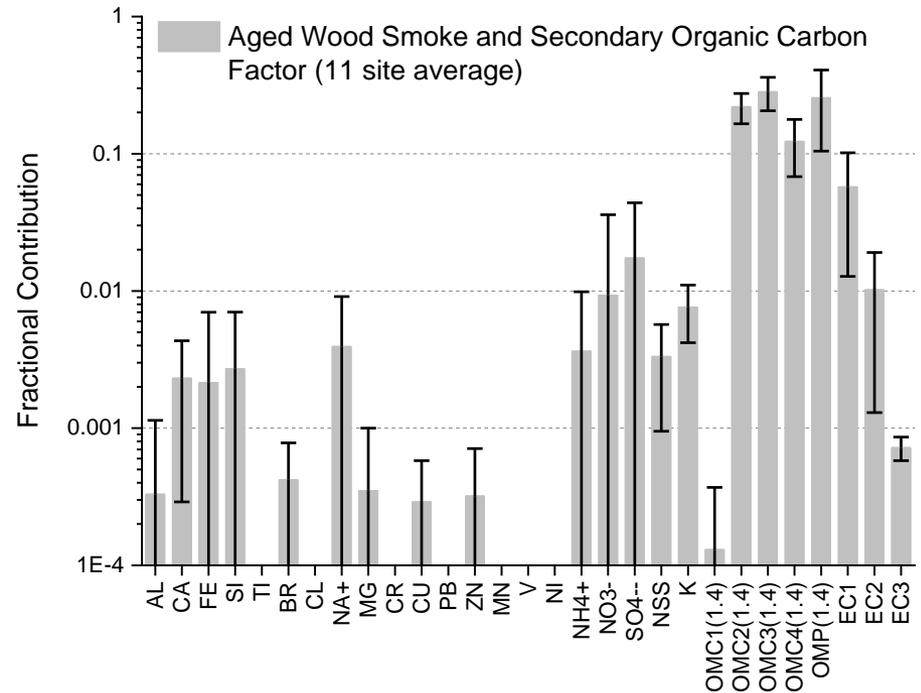
# How was Wood Smoke Identified in the Chemical Data?

(Figures from R.A. Kotchenruther / Atmospheric Environment 142 (2016) 210-219)



## Fresh wood smoke

- OC and EC dominate
- OC components shifted to lower boiling fractions
- K contribution
- Cl contribution



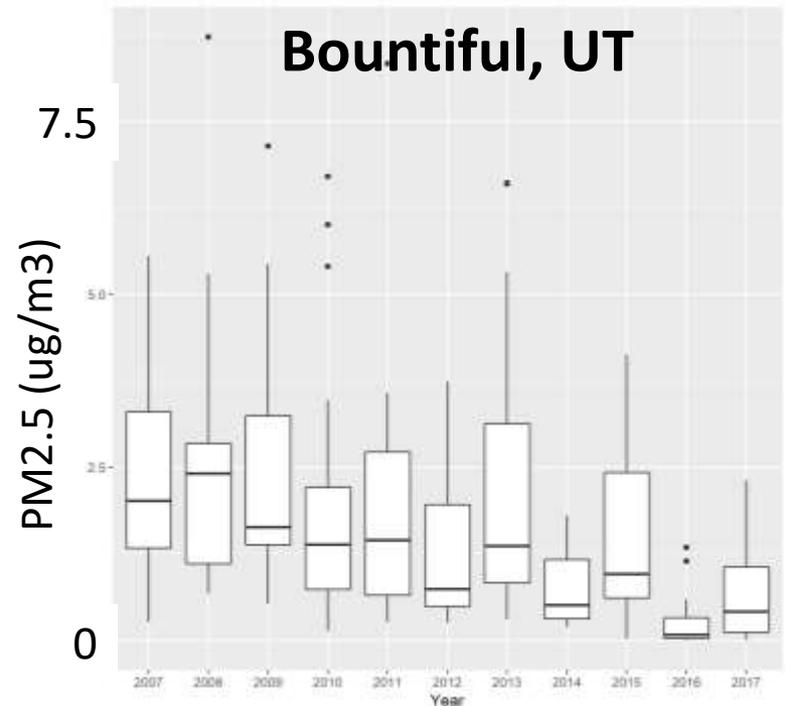
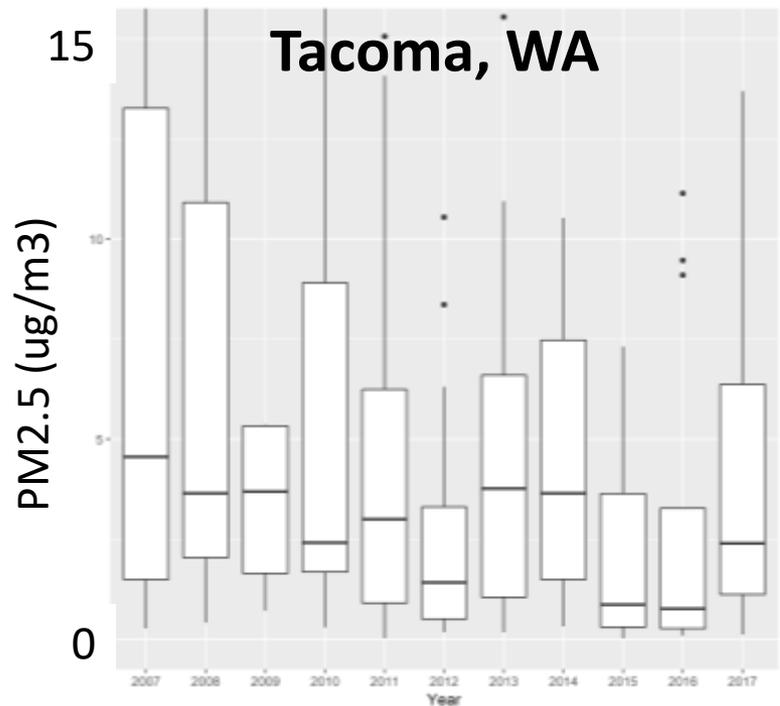
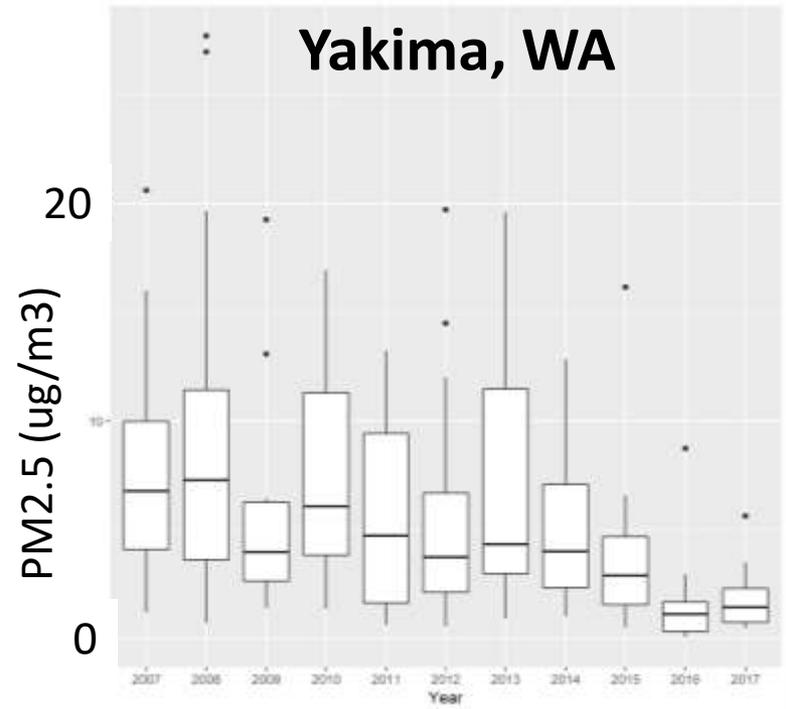
## Aged wood smoke

- OC and EC dominate
- OC components shifted to higher boiling fractions (more oxidative processing)
- Higher OC/EC ratio than fresh smoke
- K contribution
- No Cl contribution

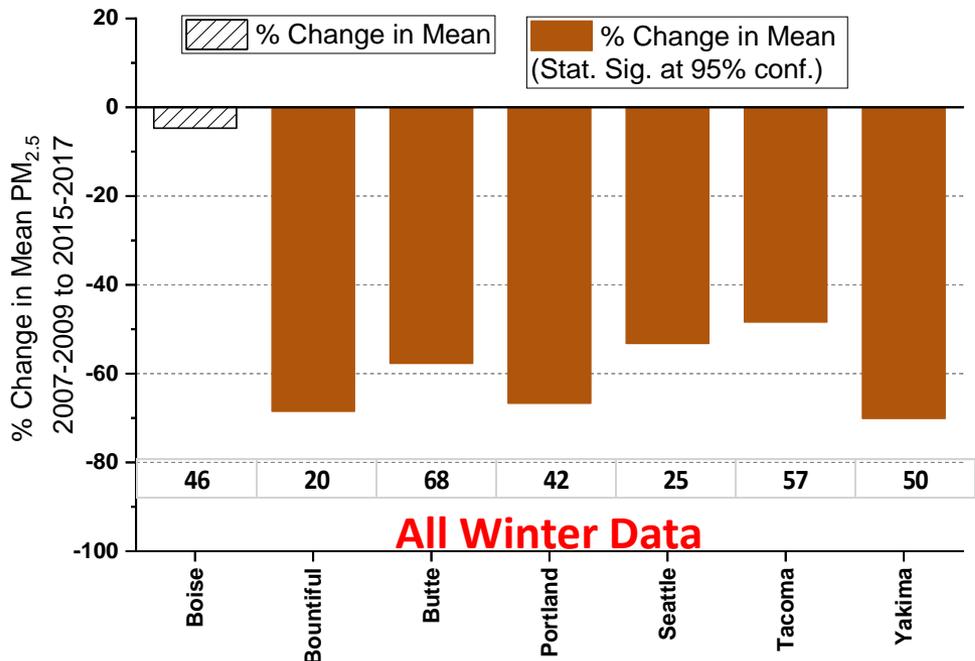
**In winter, fresh + aged = RWC**

**In summer, fresh + aged = wild, Rx, Ag fire & SOA**

# Boxplot examples, winter **wood smoke** PM<sub>2.5</sub> (fresh + aged)

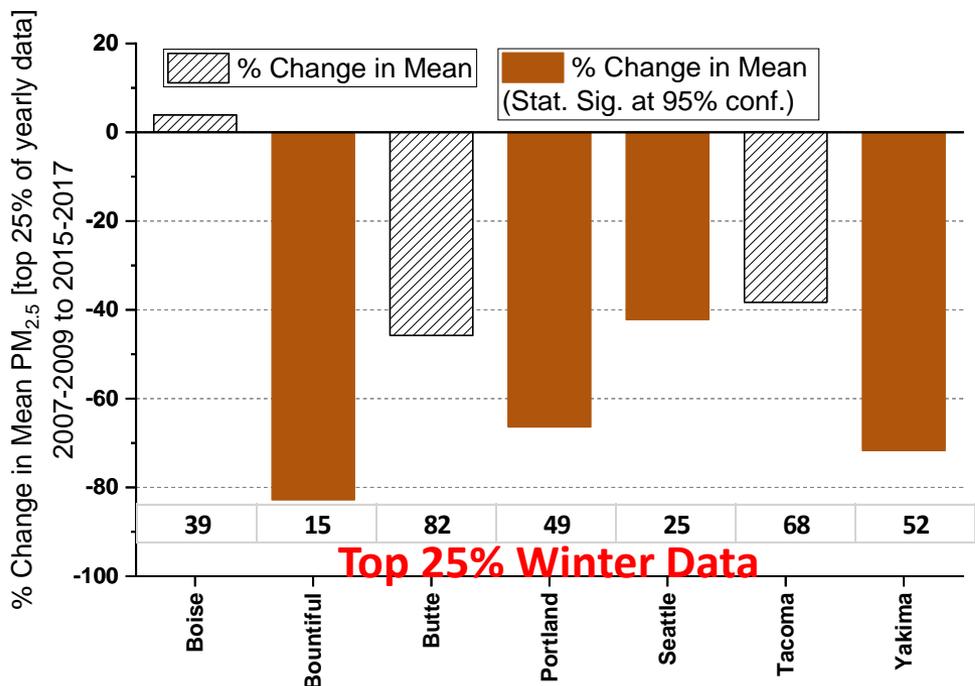


# Change in 3-year average winter $PM_{2.5}$ from wood smoke (fresh + aged) [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass

# Change in 3-year average winter $PM_{2.5}$ from wood smoke (fresh + aged) [2007-2009 to 2015-2017] for top 25% of yearly data

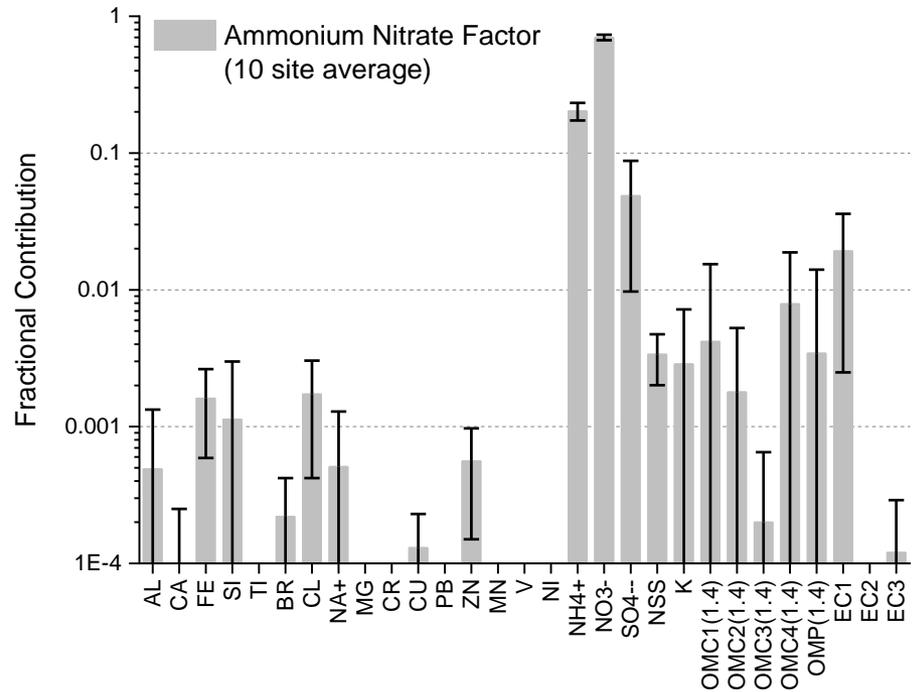


Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass (top 25% of yearly data)

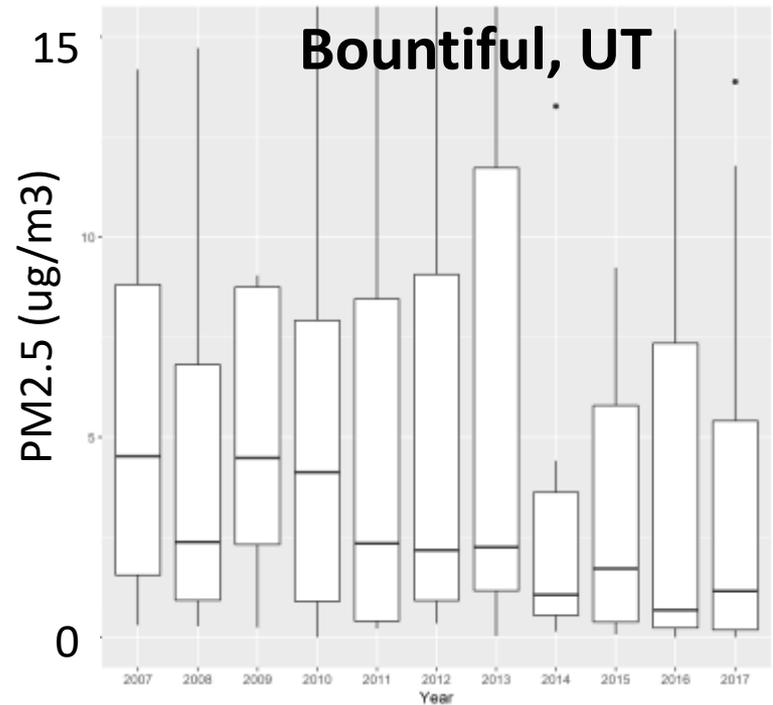
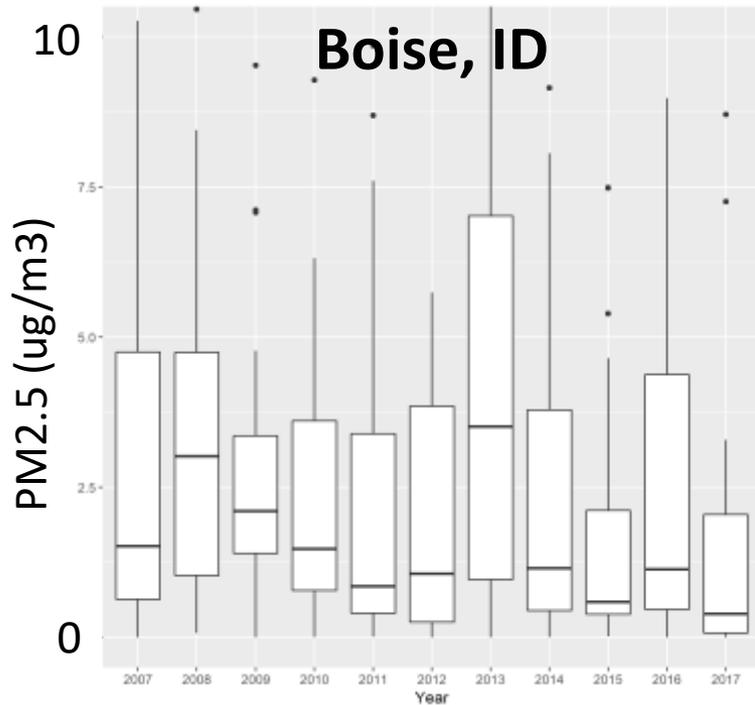
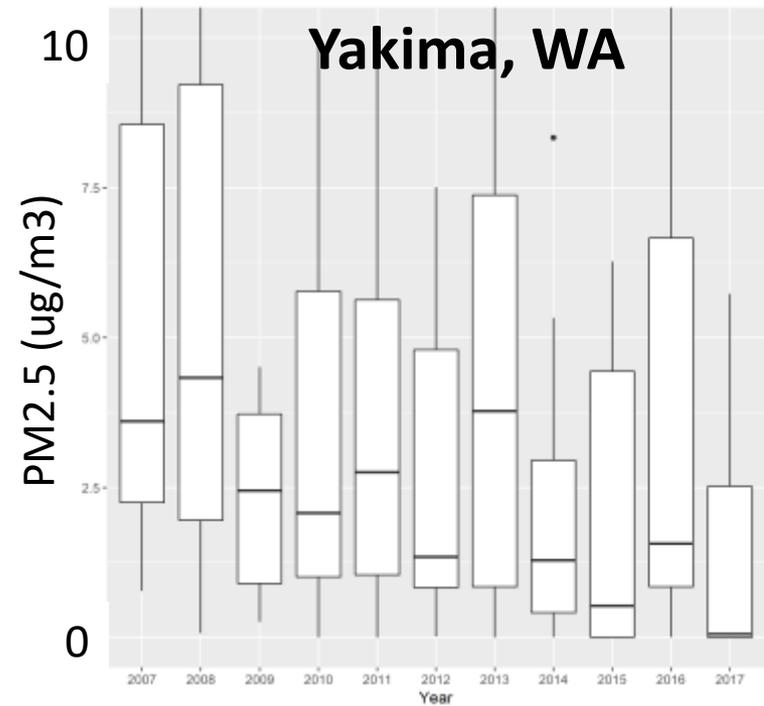
**Results for Winter  
Ammonium Nitrate PM<sub>2.5</sub>  
(2007-2009 to 2015 – 2017)**

# How was Ammonium Nitrate Identified in the Chemical Data?

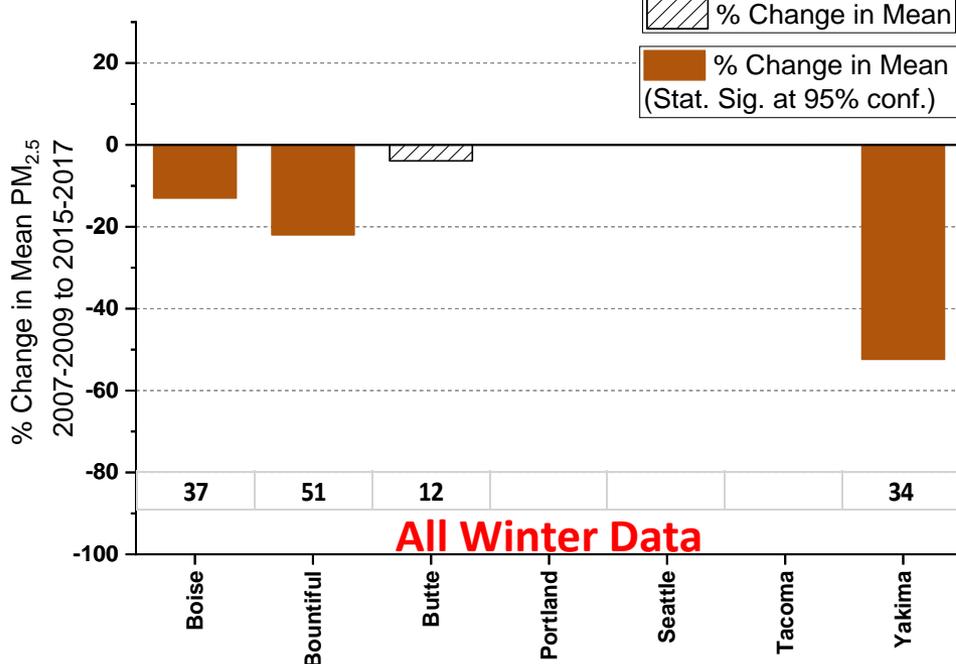
(Figure from R.A. Kotchenruther / Atmospheric Environment 142 (2016) 210-219)



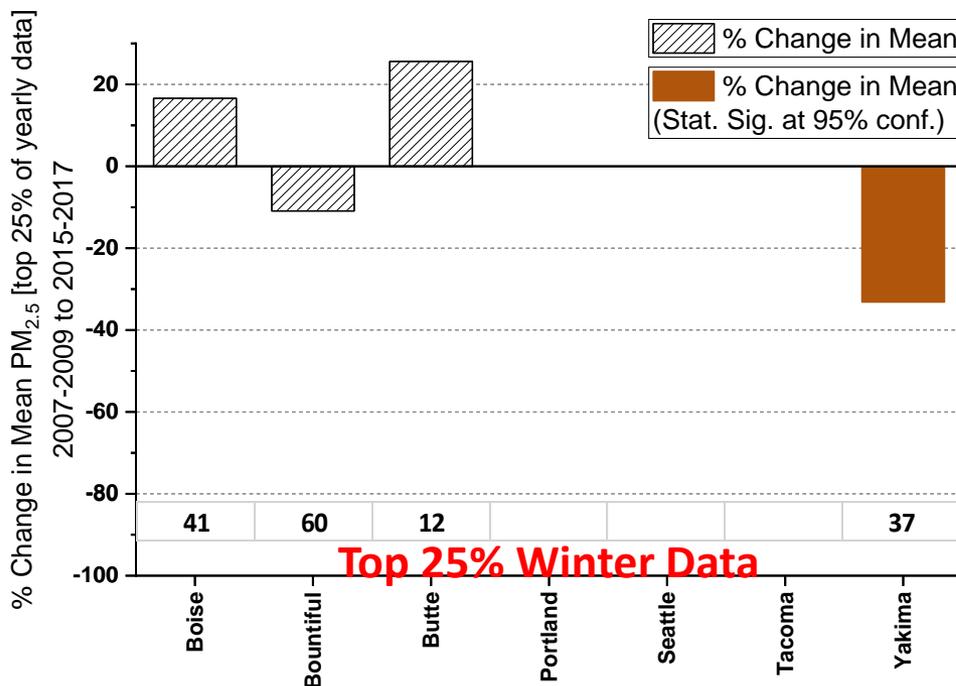
# Boxplot examples, winter ammonium nitrate PM2.5



# Change in 3-year average winter $PM_{2.5}$ from ammonium nitrate [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass



# Change in 3-year average winter $PM_{2.5}$ from ammonium nitrate [2007-2009 to 2015-2017] for top 25% of yearly data

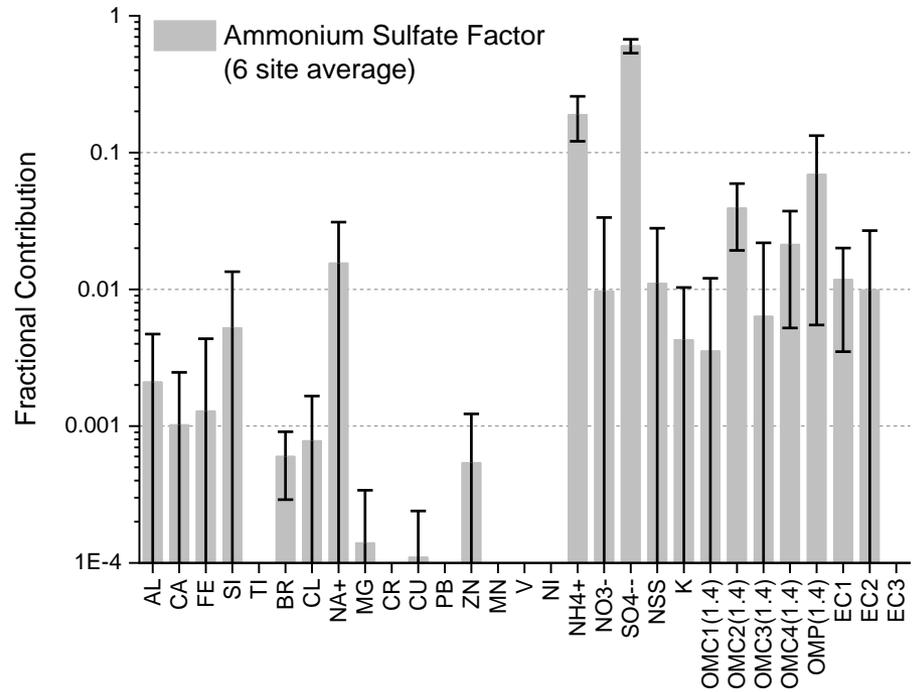
Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass (top 25% of yearly data)



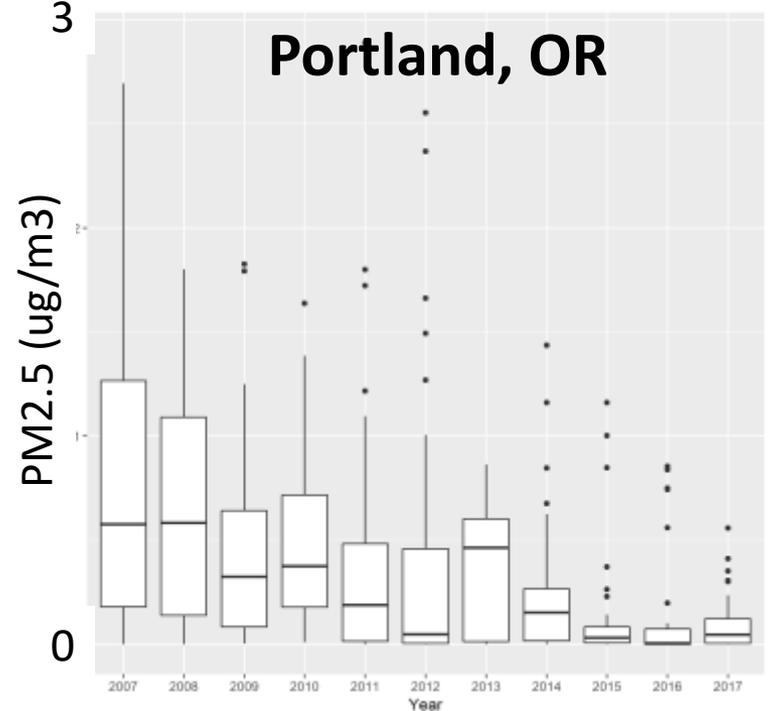
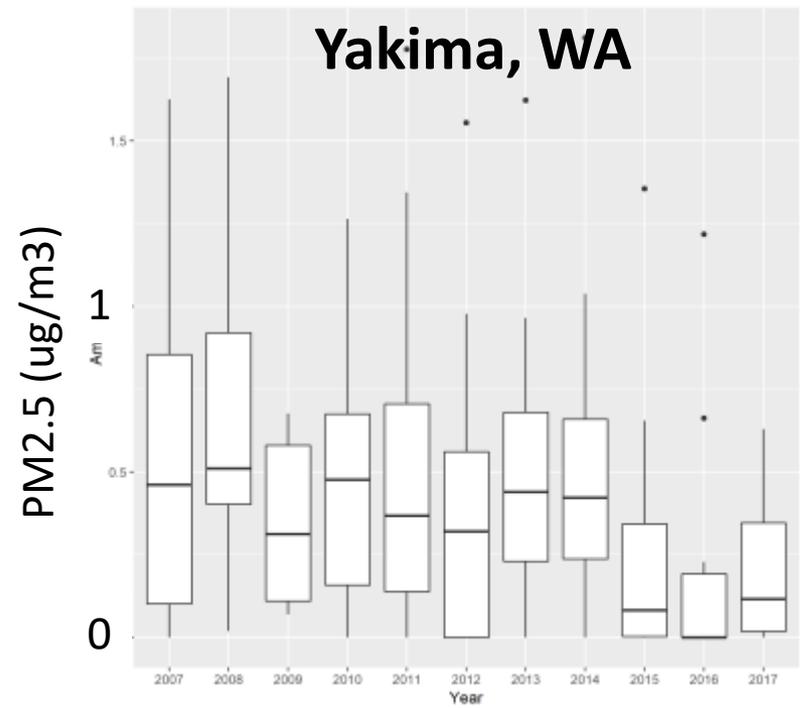
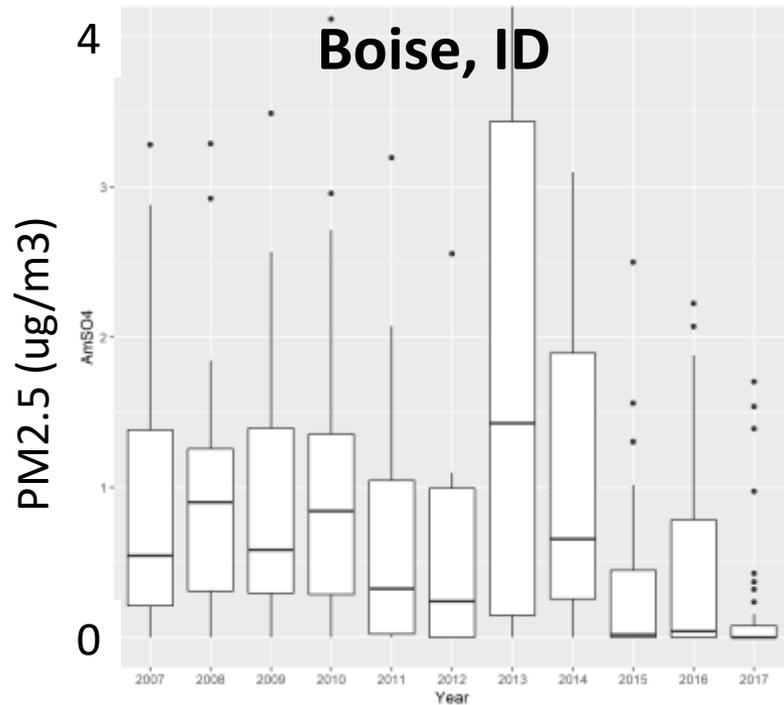
**Results for Winter  
Ammonium Sulfate PM<sub>2.5</sub>  
(2007-2009 to 2015 – 2017)**

# How was Ammonium Sulfate Identified in the Chemical Data?

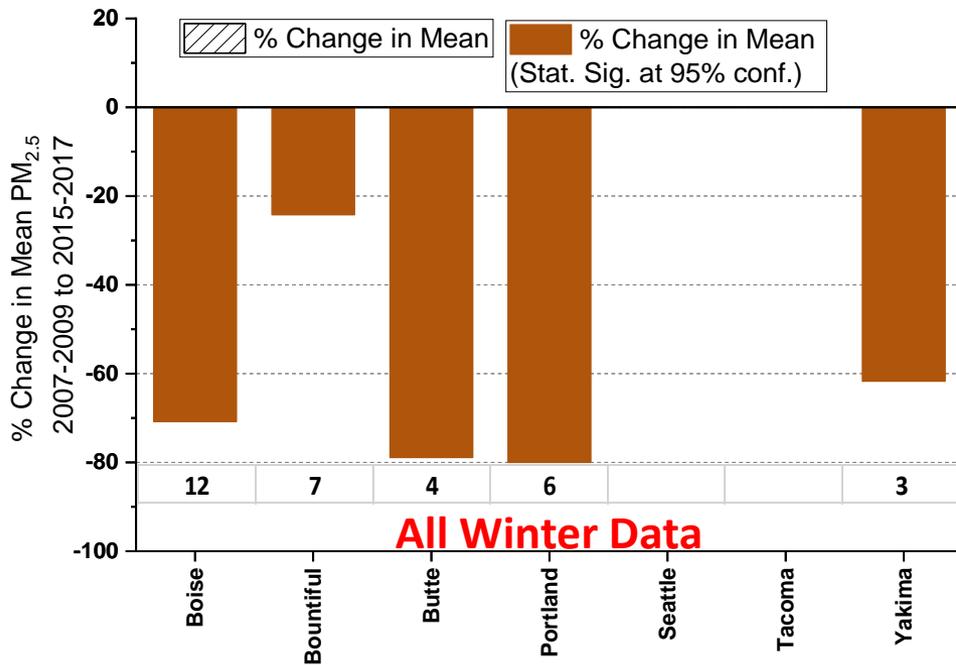
(Figure from R.A. Kotchenruther / Atmospheric Environment 142 (2016) 210-219)



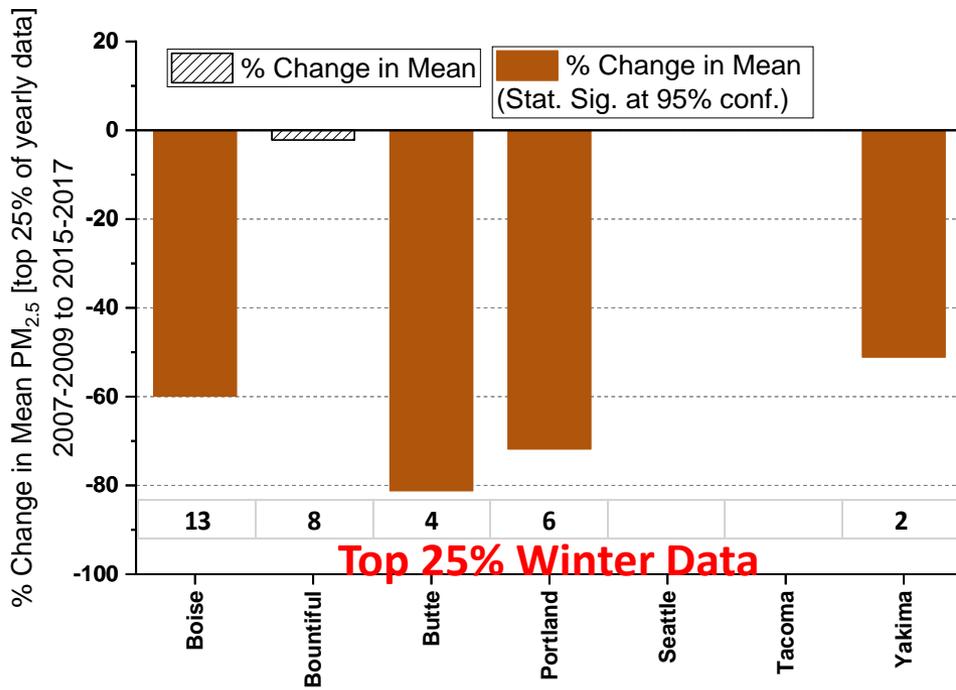
# Boxplot examples, winter ammonium sulfate PM2.5



# Change in 3-year average winter $PM_{2.5}$ from ammonium sulfate [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass

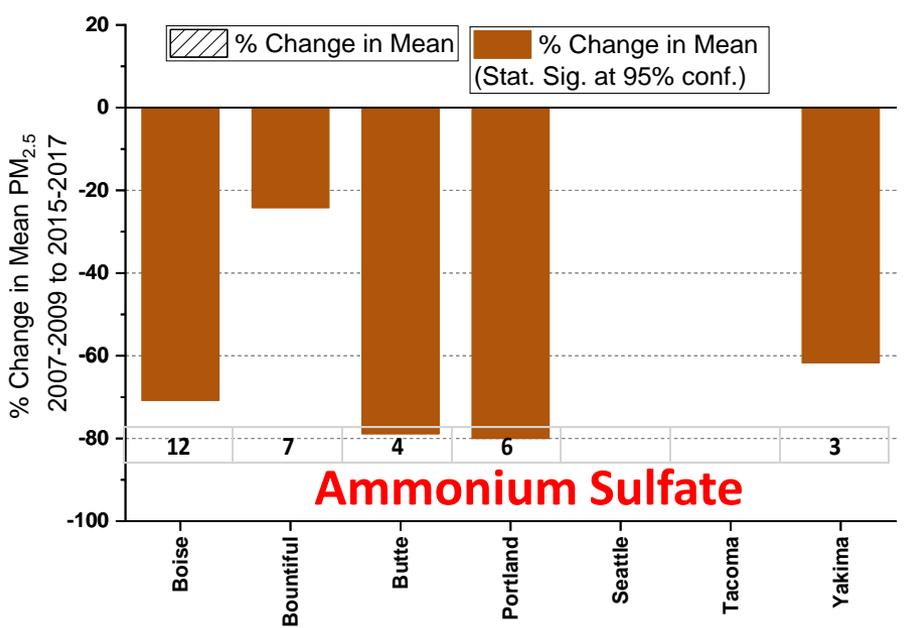
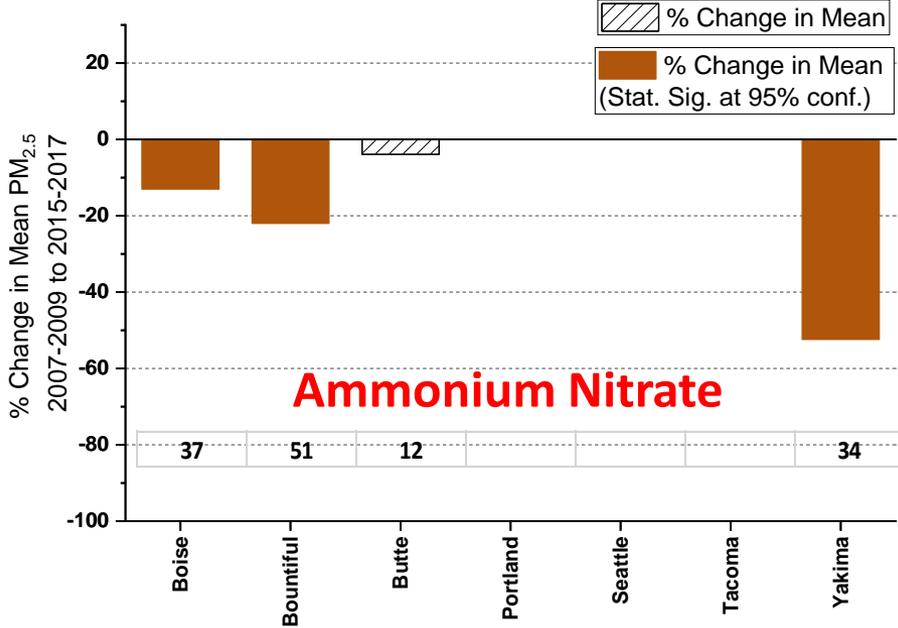
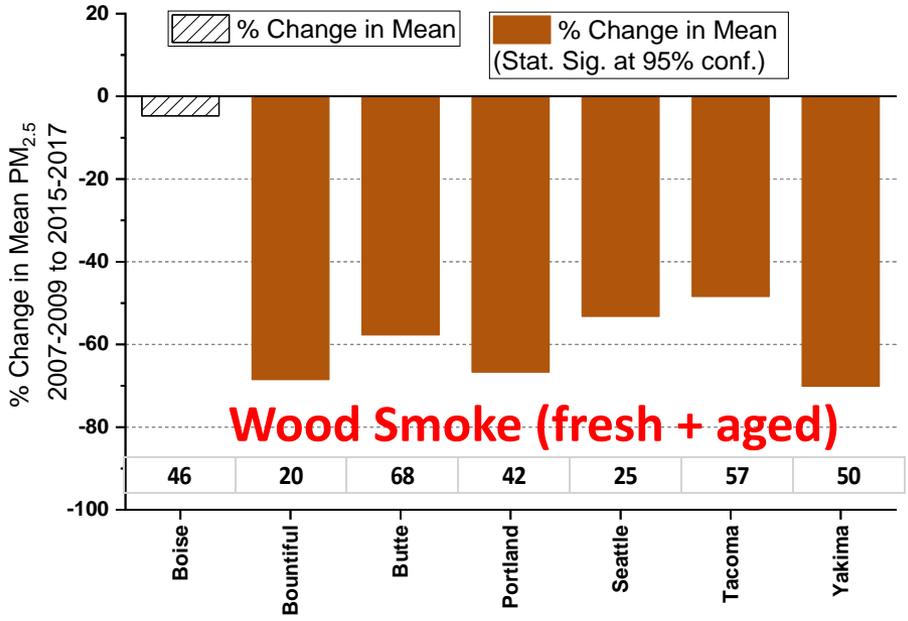
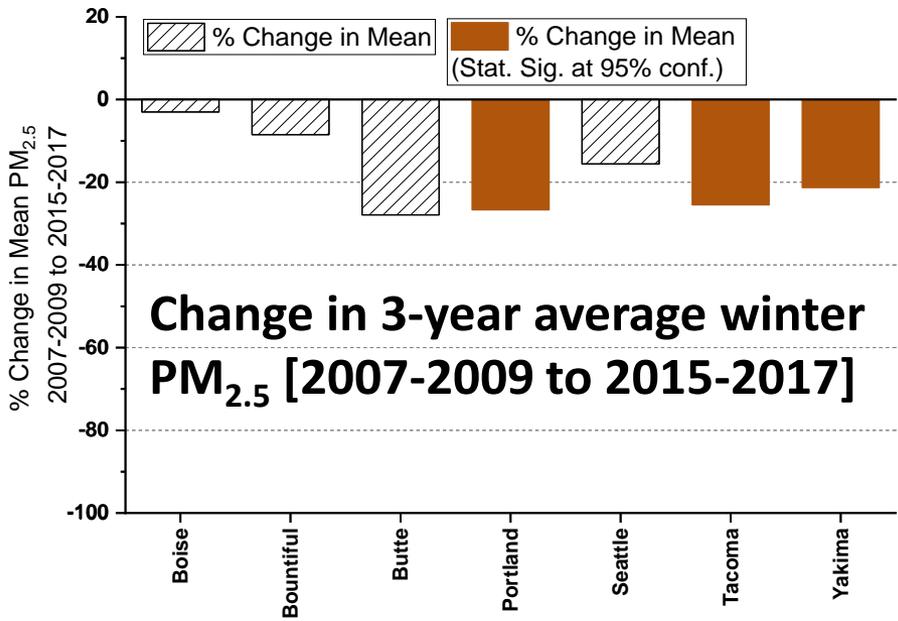


# Change in 3-year average winter $PM_{2.5}$ from ammonium sulfate [2007-2009 to 2015-2017] for top 25% of yearly data

Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass (top 25% of yearly data)

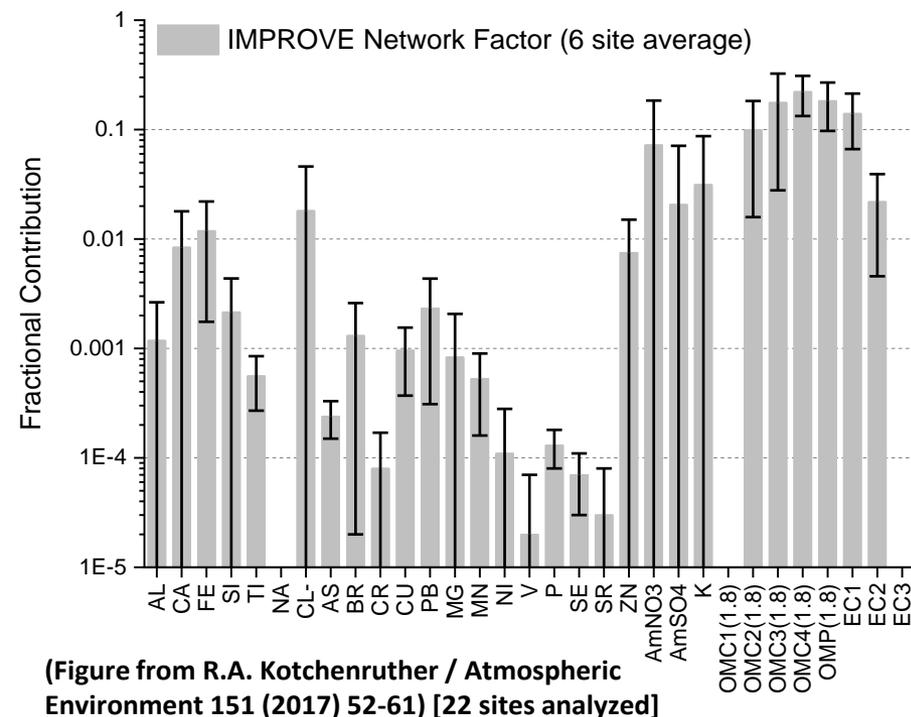
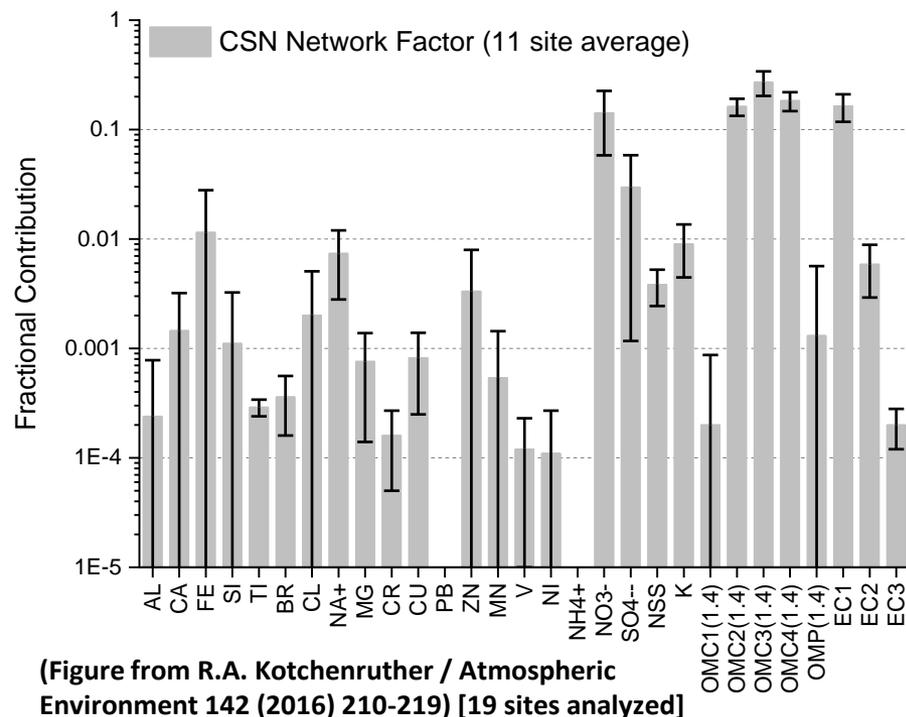


# Many important contributors to PM<sub>2.5</sub> going down, why not total PM<sub>2.5</sub> so much?



# One chemical pattern in the PM<sub>2.5</sub> data has been increasing.

## What is it?



## What do we know?

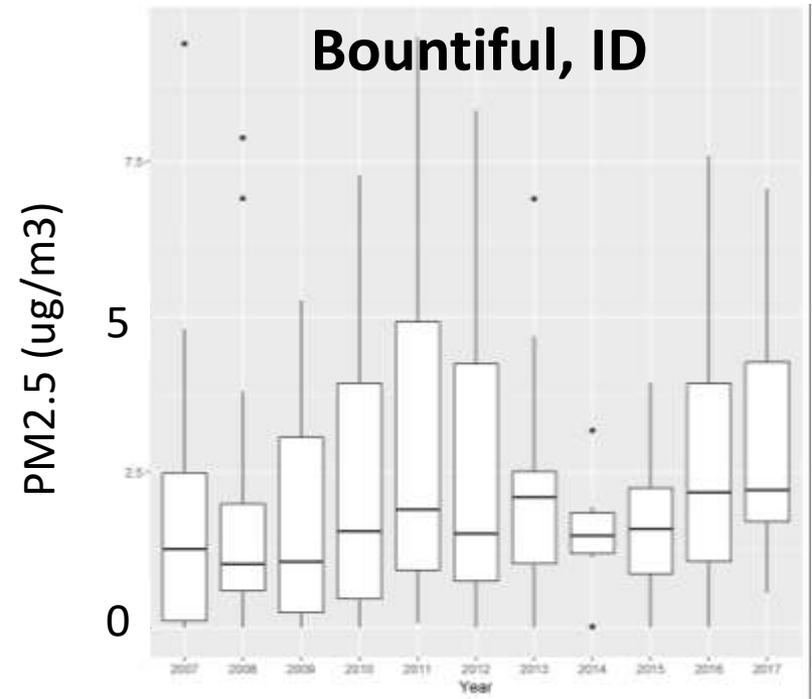
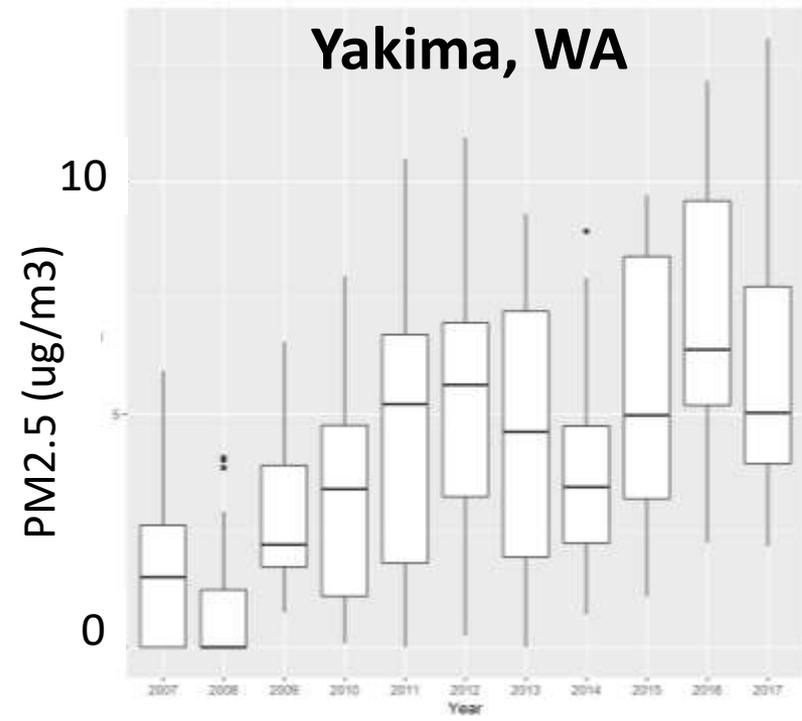
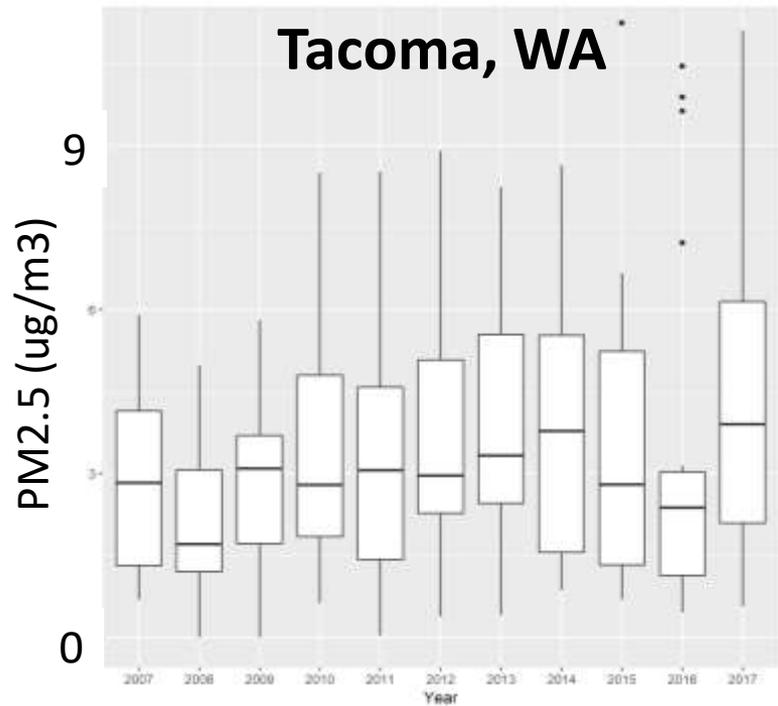
- **Ubiquitous**, appears in PMF analysis at every CSN and IMPROVE site (either on own or mixed with other patterns/sources)
- **OC & EC dominate**, -> some kind of fuel combustion.
- **Not associated with wood smoke factors.**
- **Trace metals**, Fe, Ti, Cu, Zn.

- **IMPROVE factor**, OC shifted to higher thermal evolution components (OC4 & OP) -> Likely more atmospheric oxidative processing (more aged from source)
- **IMPROVE factor**, fewer sites where factor clearly resolved -> further from source
- **My take on what source fits this pattern ...**

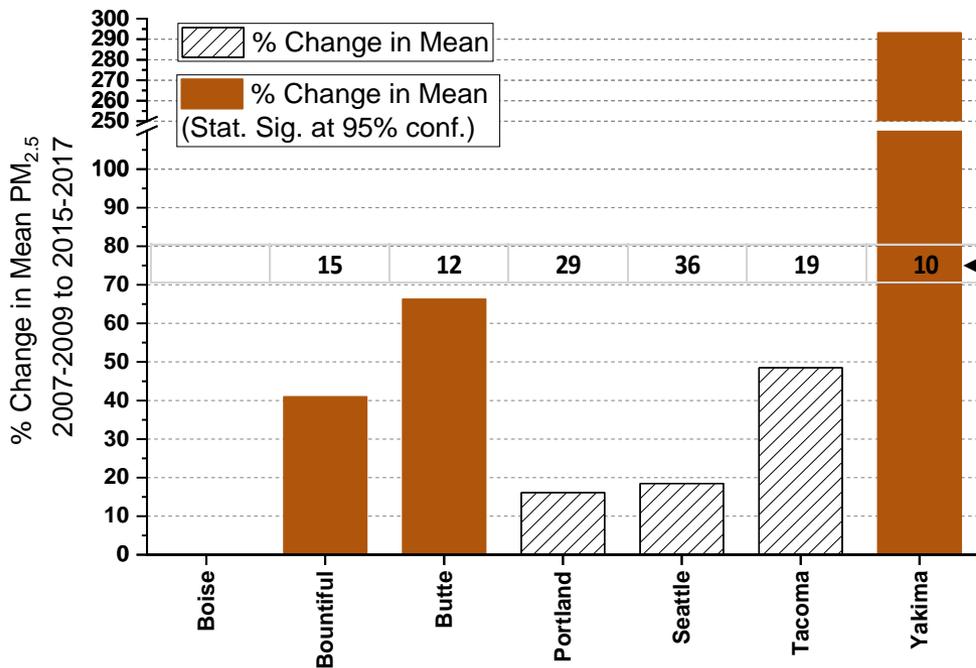
# Gas Vehicles



# Boxplot examples, winter gas vehicles PM2.5

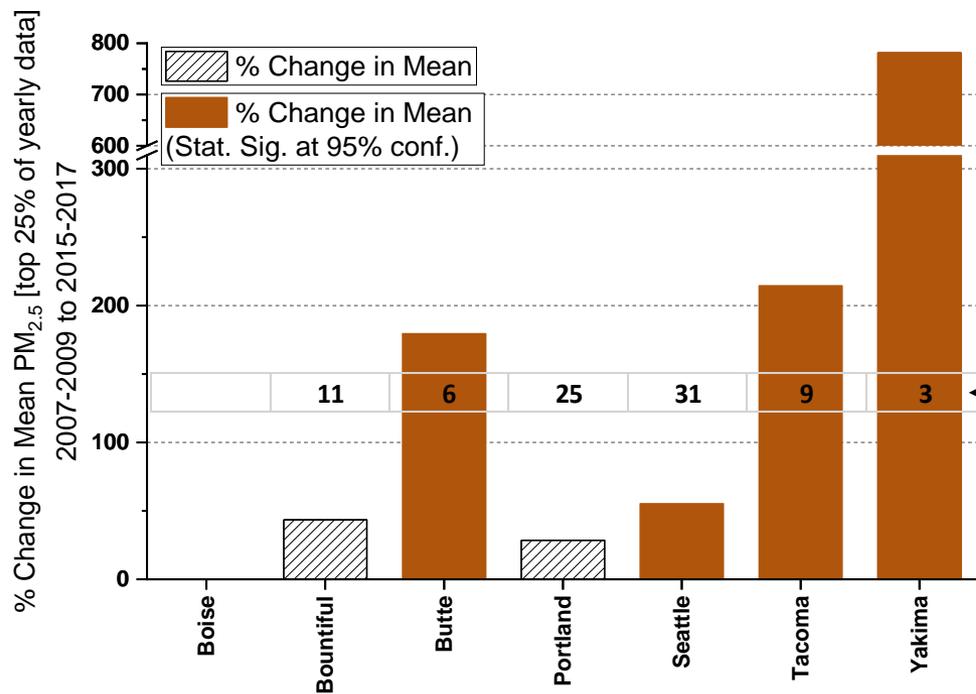


## Change in 3-year average winter PM<sub>2.5</sub> from gas vehicles [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter PM<sub>2.5</sub> mass

## Change in 3-year average winter PM<sub>2.5</sub> from gas vehicles [2007-2009 to 2015-2017] for top 25% of yearly data



Percent contribution of beginning 2007-2009 winter PM<sub>2.5</sub> mass (top 25% of yearly data)

# What have other source apportionment efforts found?

## Multi-site PMF analysis of New York State sites from 2005 – 2016

Squizzato et al., **A long-term source apportionment of PM2.5 in New York State during 2005–2016** Atmospheric Environment 192 (2018) 35–47  
 Masiol et al., **Long-term trends (2005–2016) of source apportioned PM2.5 across New York State** Atmospheric Environment 201 (2019) 110–120

## Similar story

Masiol et al., 2019 [from abstract]

“Spark-ignition vehicles were the only source type experiencing upward annual trends at all urban sites with slopes ranging from 0.02  $\mu\text{g}/\text{m}^3/\text{y}$  to  $\sim 0.2 \mu\text{g}/\text{m}^3/\text{y}$  ...”

Same factor / pattern as identified in this work

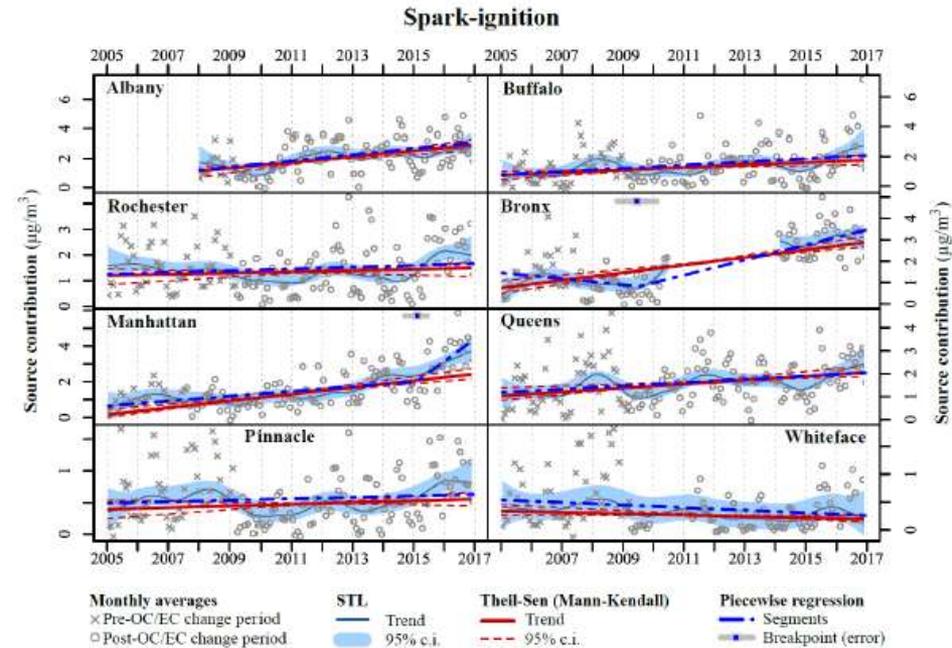
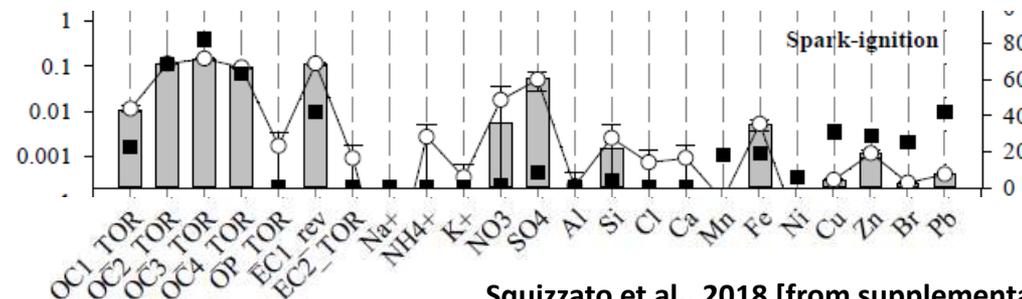


Figure S15. Results of trend analyses for the spark-ignition source computed over all the year (STL in light blue; Theil-Sen nonparametric estimator of slope in red; piecewise linear regression model with breakpoints estimation in dark blue). The confidence intervals (c.i. at 0.05 level) for STL and Theil-Sen slopes are computed by bootstrap estimation. Masiol et al., 2019 [from supplemental]

## PMF chemical pattern / factor for ‘Spark-ignition’



Squizzato et al., 2018 [from supplemental]

## Why is this chemical pattern / source increasing?

Masiol et al., 2019 attribute increases in this factor to:

- a similar pattern in increases in registered vehicles
- gas vehicle emissions are a significant source of secondary organic aerosol precursors

## Some questions about the gas vehicle pattern ...

- Why such a large increase in Yakima?
- Can it really all be attributed to increasing vehicle population?
- Why is ammonium nitrate going down in Yakima (52% reduction in mean from 2007-2009 to 2015-2017), if this pattern is going up? (i.e., if most of NO<sub>x</sub> is from vehicles)  
(note: 2007-2009 to 2015-2017 mean monitored NO<sub>3</sub> down only 17%, mean monitored NH<sub>4</sub> down 58%, mean SO<sub>4</sub> down 47%)
- Maybe there is a shift in winter nitrate chemistry, away from ammonium nitrate production, and towards organic nitrate production?

Your thoughts?

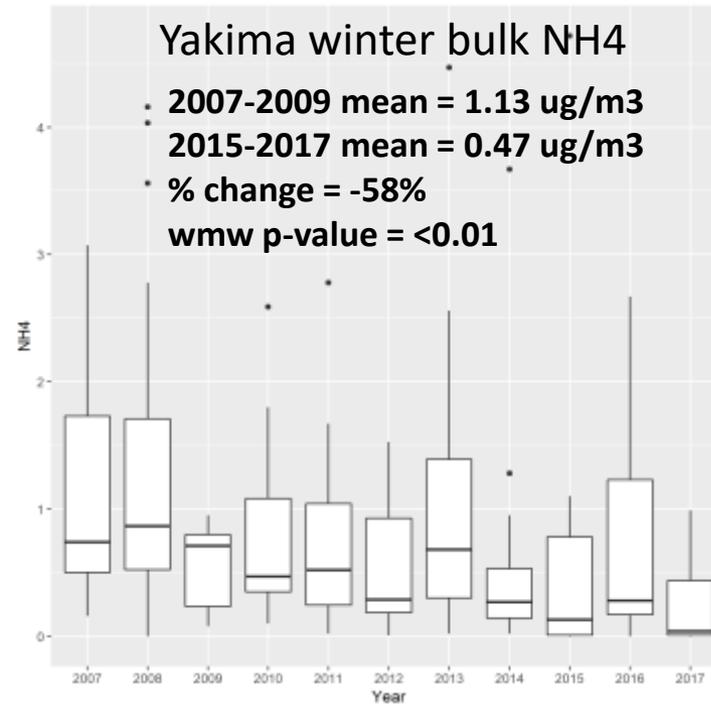
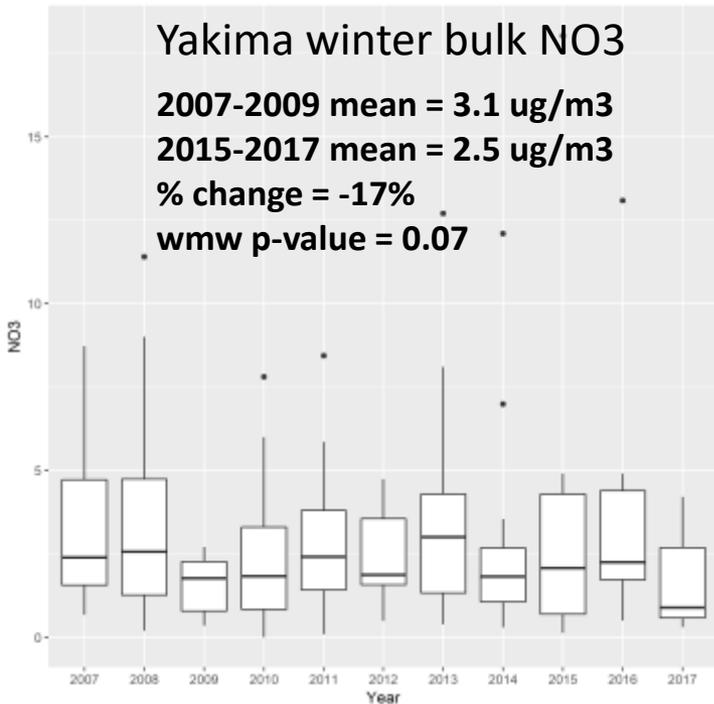
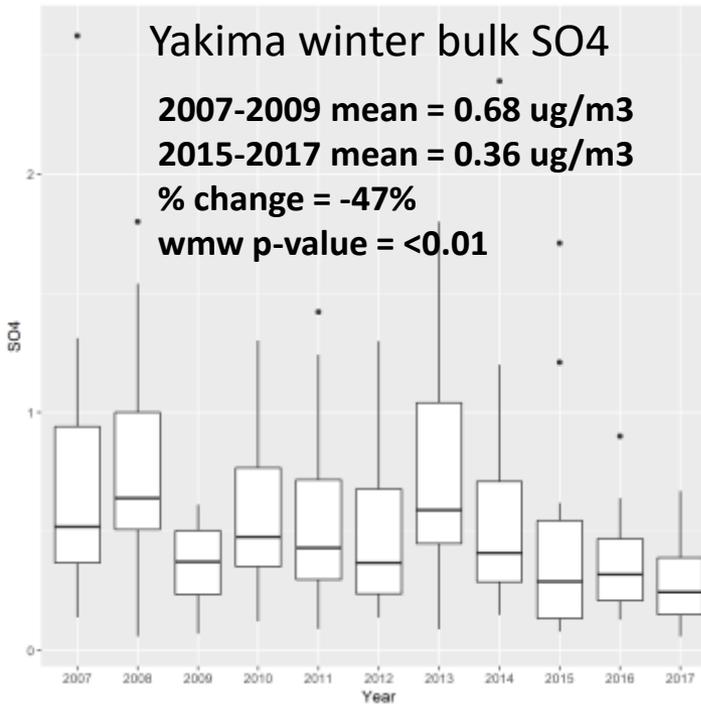
A scenic view of a mountain landscape. In the foreground, a stone chimney is visible, with a plume of white smoke rising from it. The chimney is partially obscured by the branches of bare trees. The background shows a valley with more trees and a clear blue sky. The overall scene is peaceful and serene.

**Thank You!**

**Questions?**

# **Supplementary Slides**

# Change in Yakima winter monitored NO3, NH4, and SO4

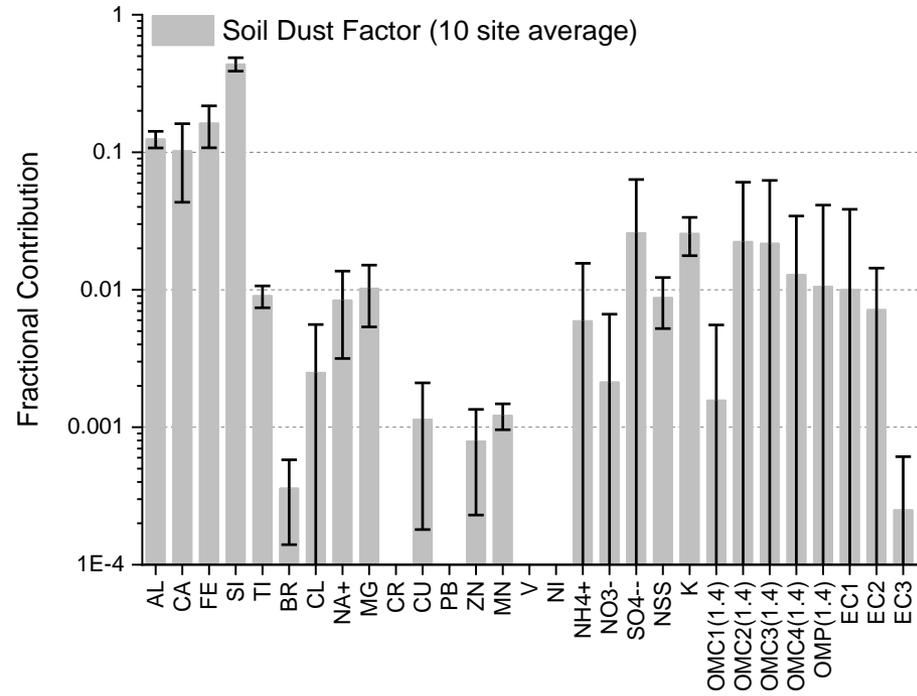


**Results for Winter  
Soil Dust PM<sub>2.5</sub>**

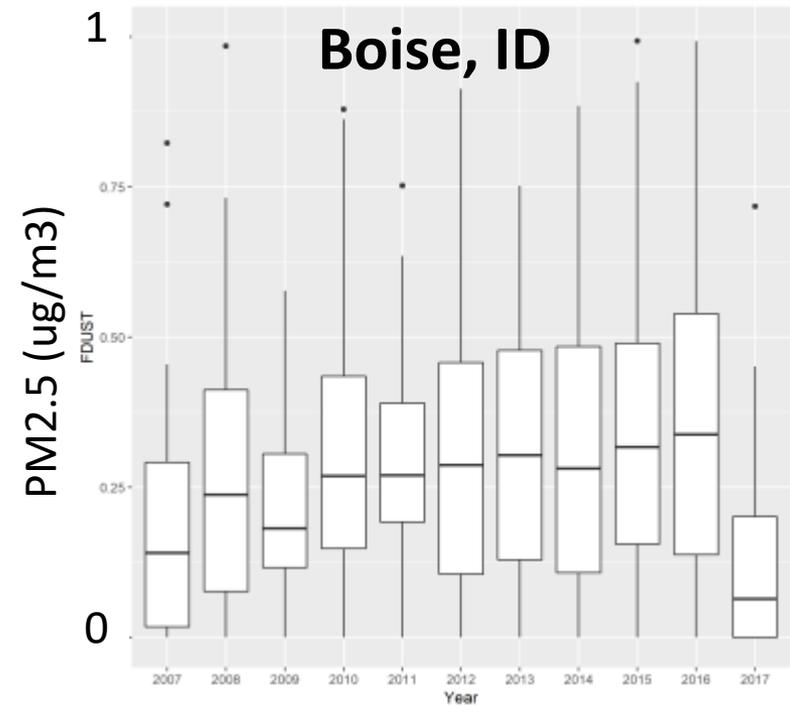
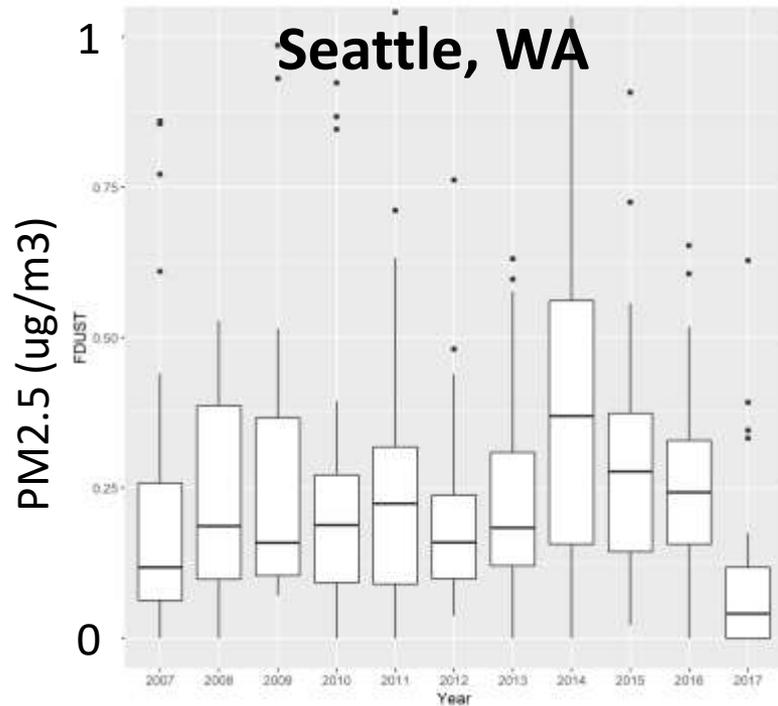
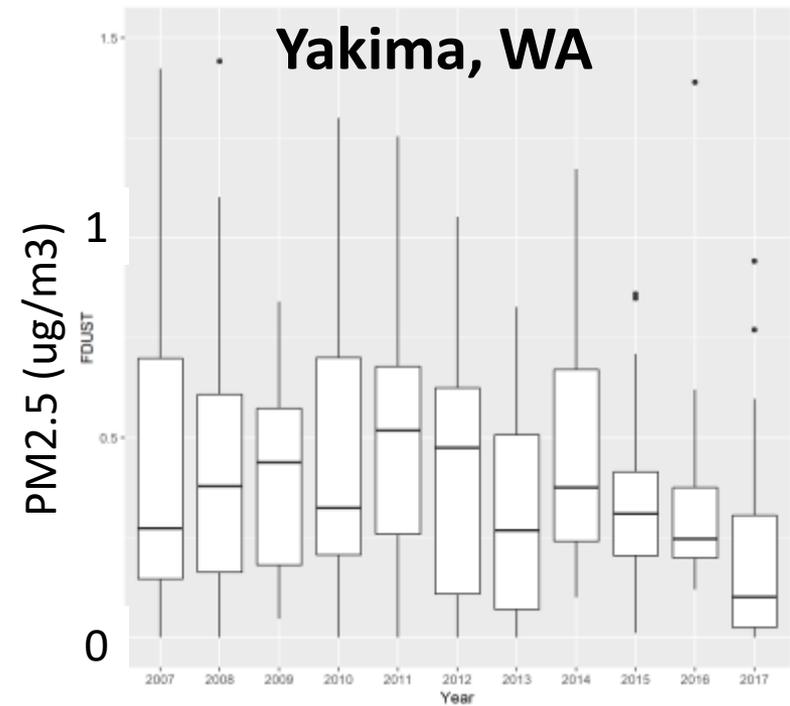
**(2007-2009 to 2015 – 2017)**

# How was Soil Dust Identified in the Chemical Data?

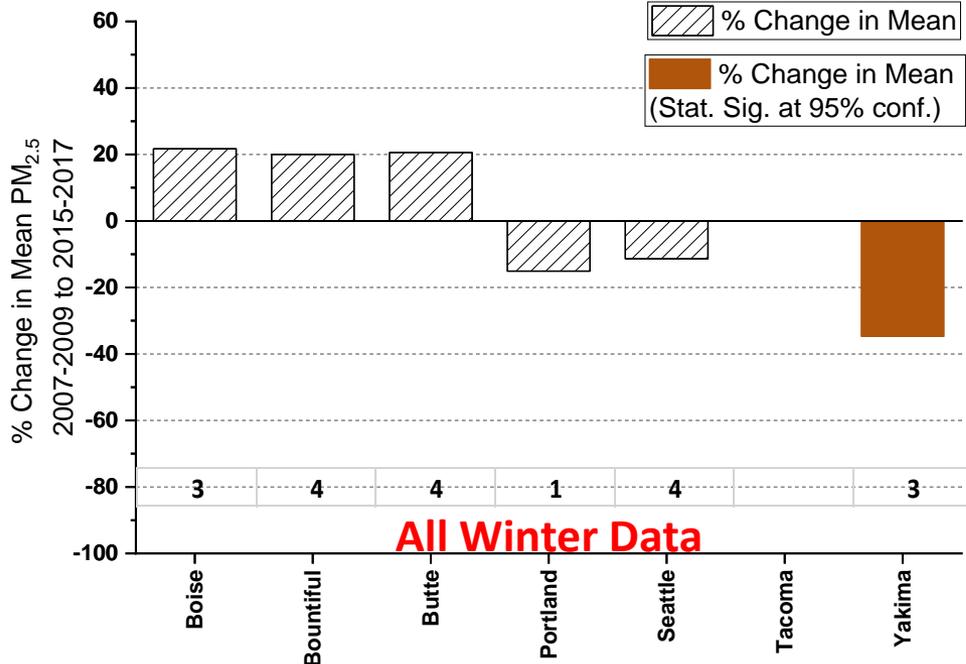
(Figure from R.A. Kotchenruther / Atmospheric Environment 142 (2016) 210-219)



# Boxplot examples, winter soil dust PM2.5

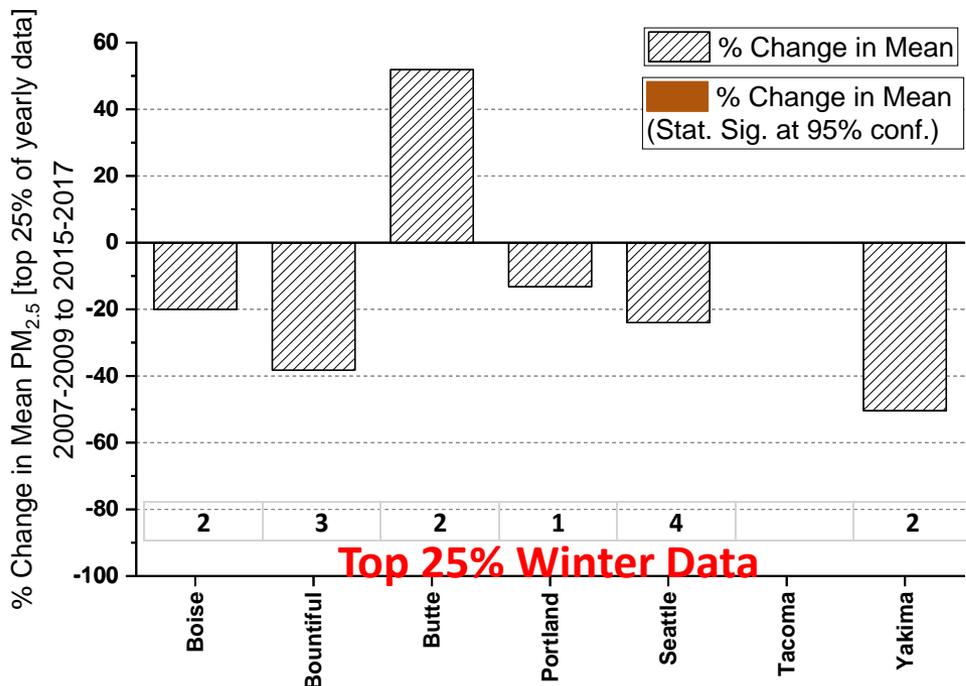


# Change in 3-year average winter $PM_{2.5}$ from soil dust [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass

# Change in 3-year average winter $PM_{2.5}$ from soil dust for top 25% of yearly data [2007-2009 to 2015-2017]



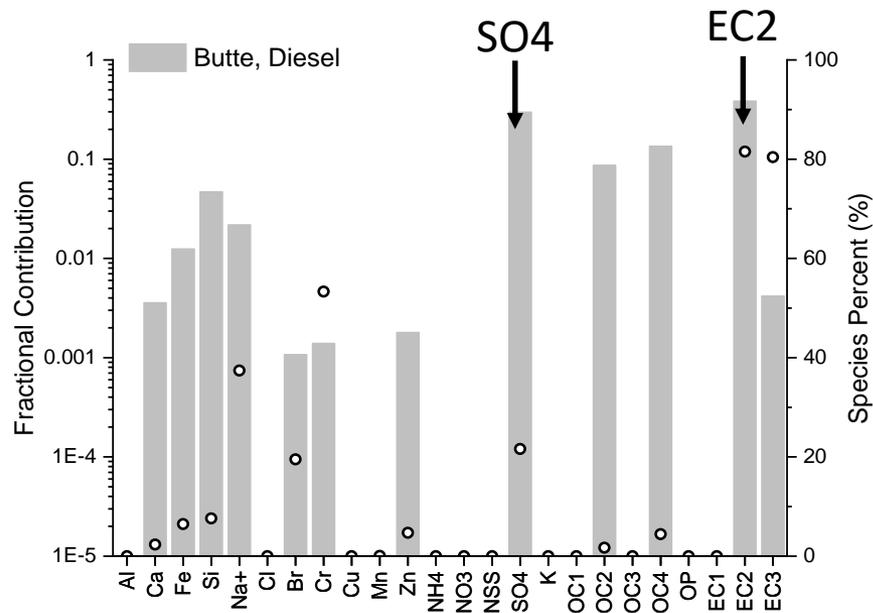
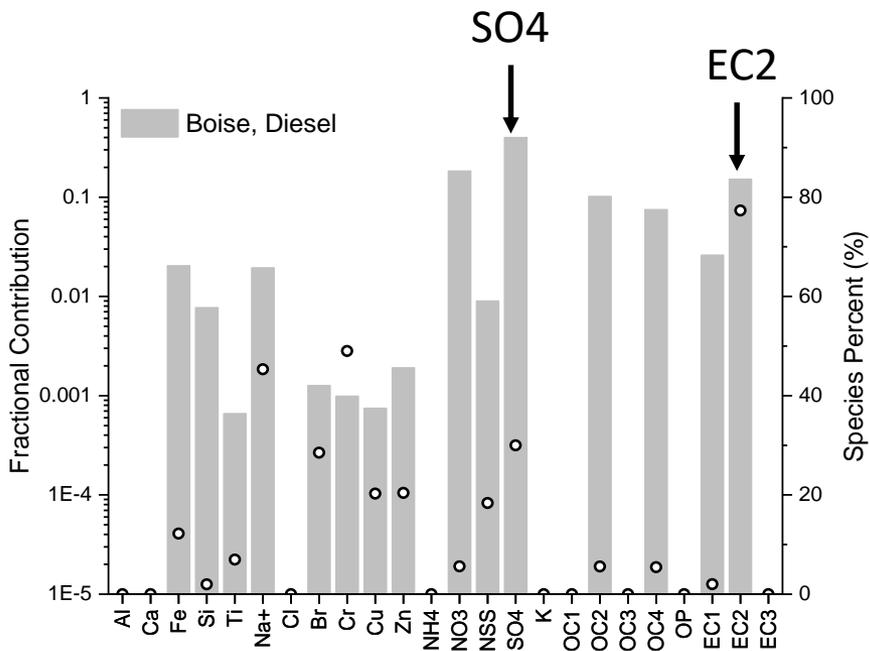
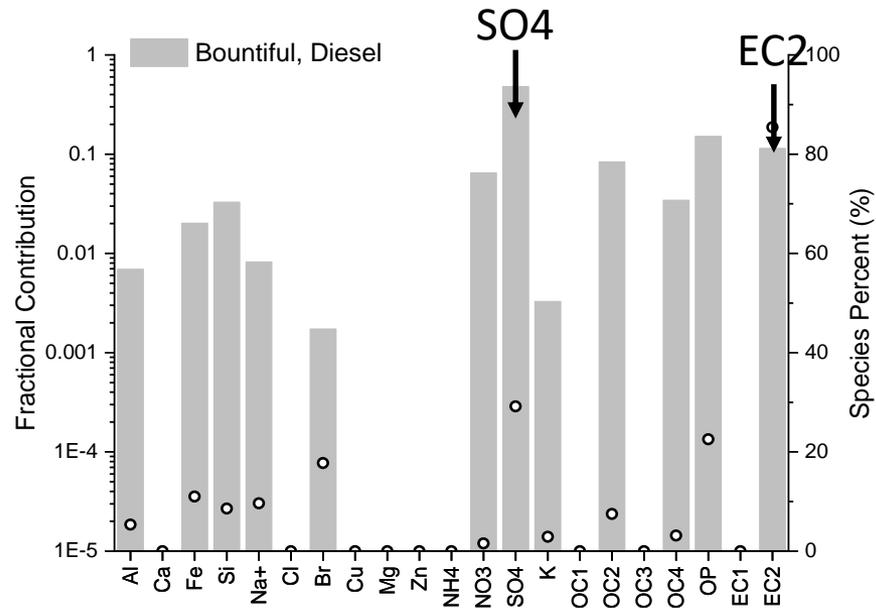
Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass (top 25% of yearly data)

**Results for Winter  
Diesel Engine PM<sub>2.5</sub>**

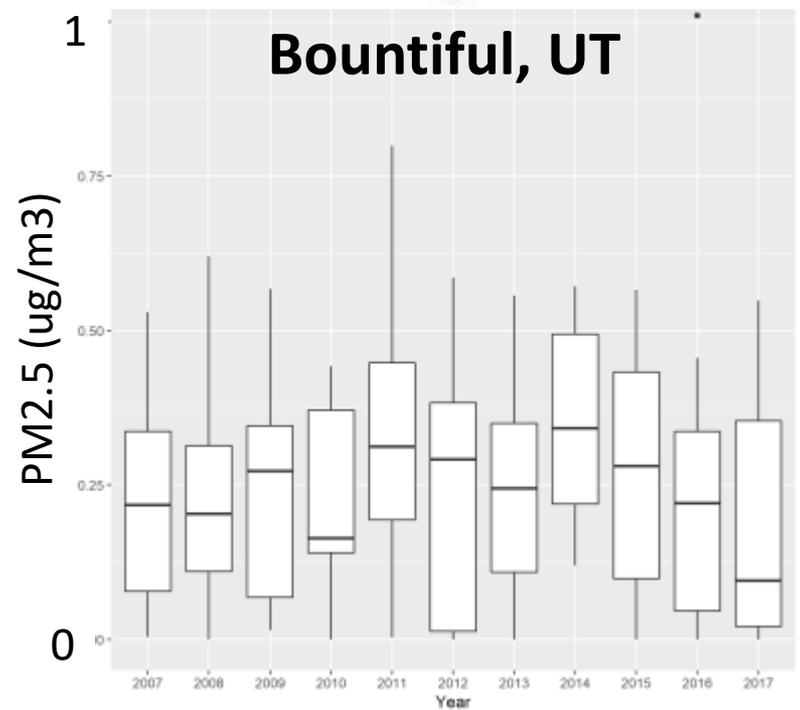
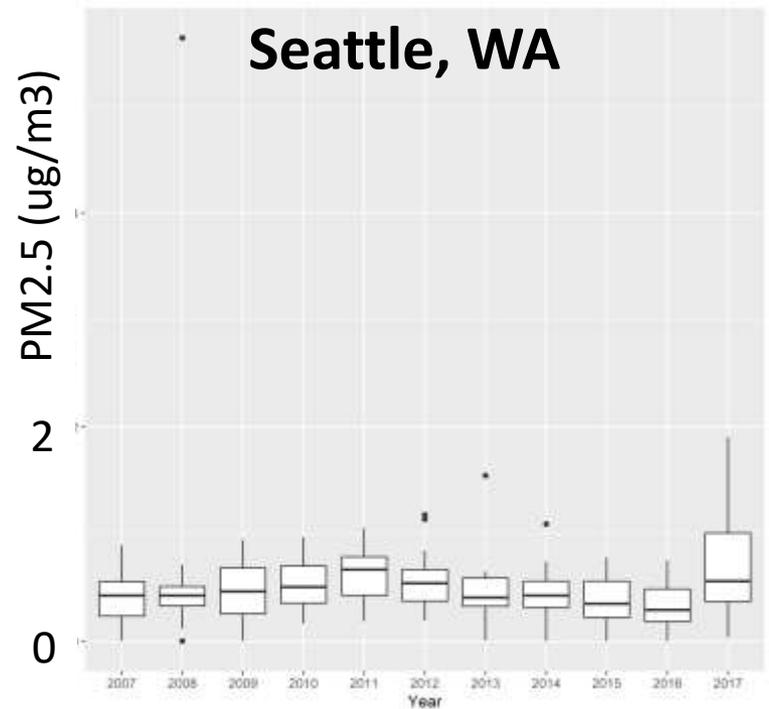
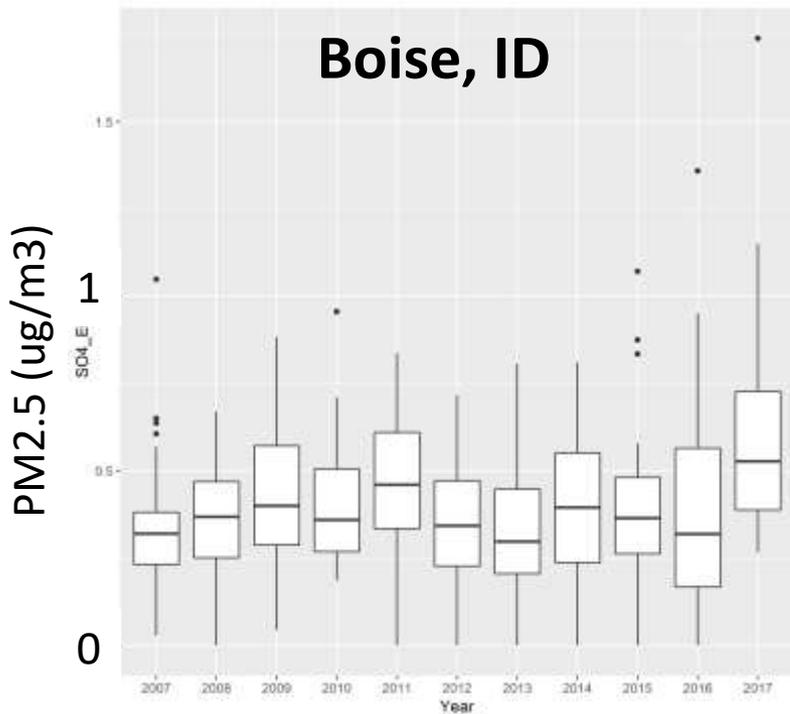
**(2007-2009 to 2015 – 2017)**

# How were Diesel Engines Identified in the Chemical Data?

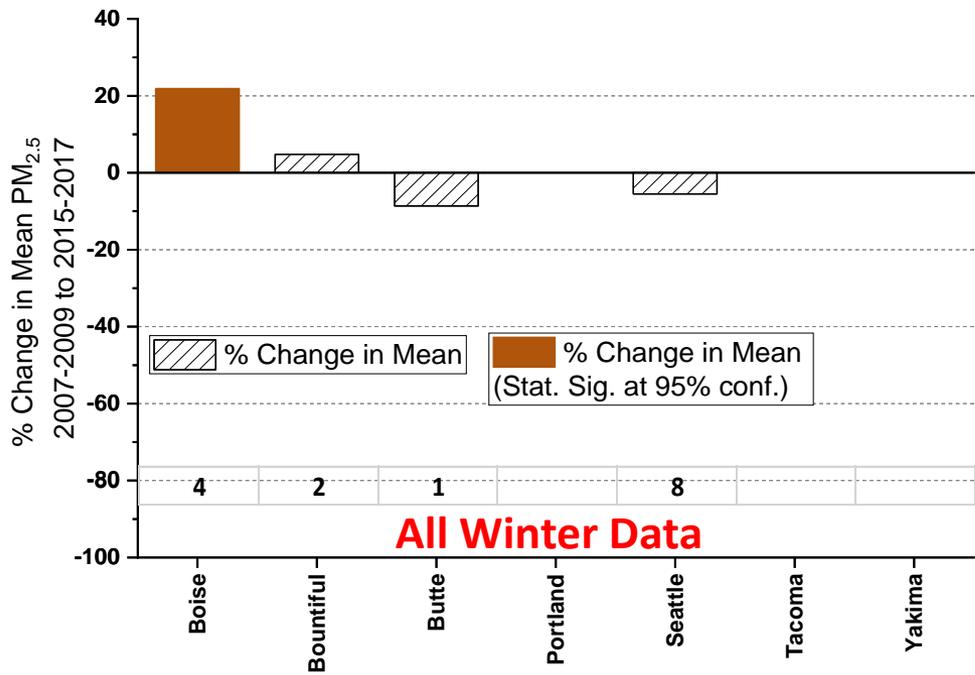
## SO<sub>4</sub> + EC<sub>2</sub>



# Boxplot examples, winter diesel engine PM2.5

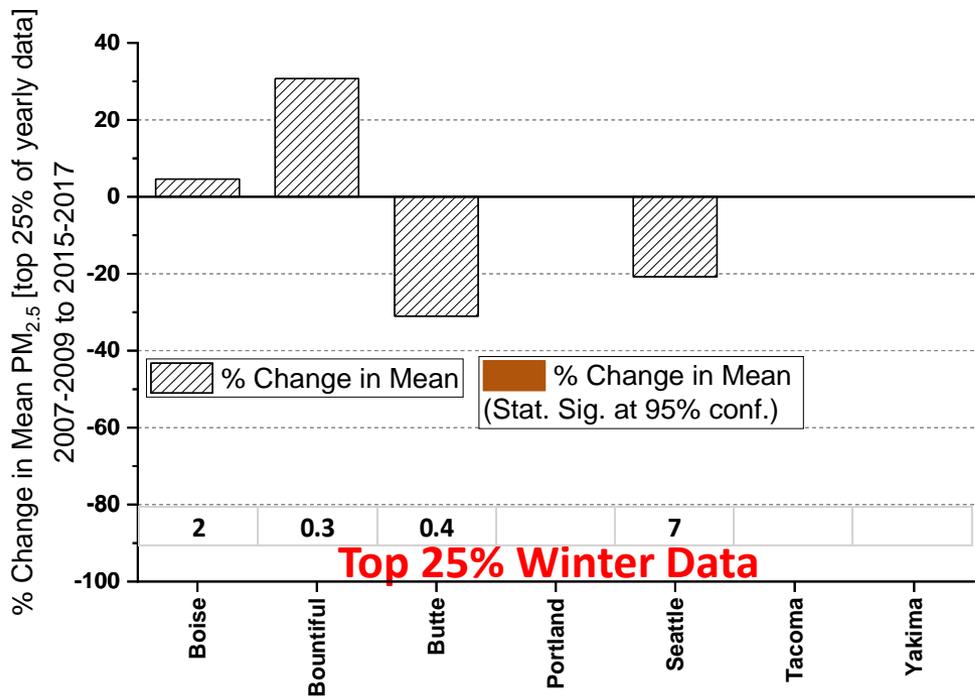


# Change in 3-year average winter $PM_{2.5}$ from diesel engines [2007-2009 to 2015-2017]



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass

# Change in 3-year average winter $PM_{2.5}$ from diesel engines [2007-2009 to 2015-2017] for top 25% of yearly data



Percent contribution of beginning 2007-2009 winter  $PM_{2.5}$  mass (top 25% of yearly data)