



*Presentation to the International Society of Exposure Science 24<sup>th</sup> Annual Meeting,  
October 12-16, 2014*

# **High resolution pollutant measurements in complex urban environments using mobile monitoring**

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## Goal of this talk

- Talk about EPA's Office of Research and Development experiences – positives and negatives – with using mobile monitoring for near-source air pollution studies.
- Discuss mobile monitoring study design and data processing challenges, as well as tools to support future research.



# Mobile monitoring in the spectrum of air measurement technologies

Higher cost systems

Desirable direction



Lower cost systems



Lower spatial resolution

Desirable direction

Higher spatial resolution

- **Driving around with instruments is not the easiest way to measure air pollution**
  - Tough on instruments: vibration, unstable environmental conditions
  - Limited space and power
  - Labor-intensive
  - Few instruments able to resolve trends at a very fast sampling rate (seconds)
  - Complex monitoring and data analysis: monitoring limited to roadway access, potential confounding sources including self-contamination



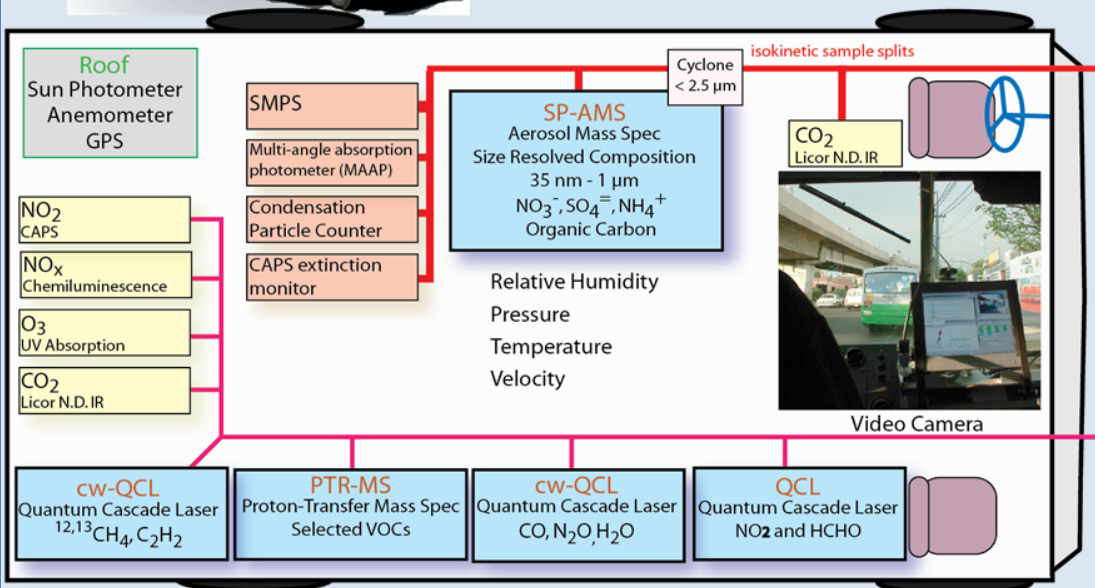


# Mobile monitoring

- Despite the challenges – this measurement approach provides unique and rare data collection opportunities
- Some example mobile monitoring vehicles applied to EPA studies in recent years:



Aerodyne mobile van:  
Comprehensive approach:  
three operators, extensive and  
advanced instrumentation



EPA electric car:  
Nimble approach: single operator,  
fewer instruments



CO – quantum cascade laser  
NO<sub>2</sub> – CAPS  
Particle counts (ultrafine): EEPS  
Particle counts (fine to coarse): APS  
BC – Aethalometer (model 42)  
CO<sub>2</sub> - Licor

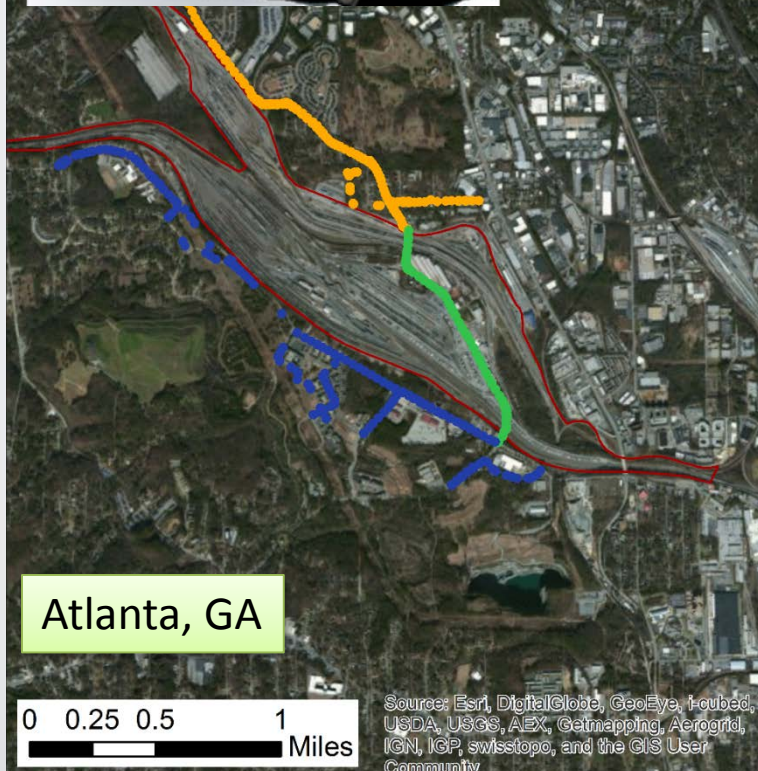


# Mobile monitoring

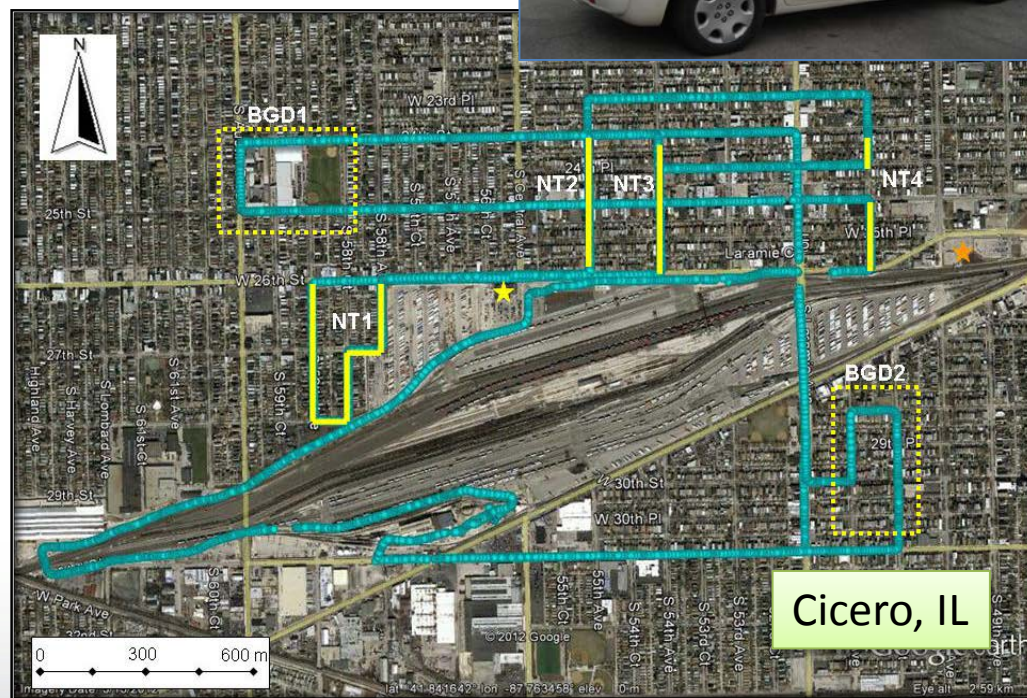
- A key tool in our research to understand spatial variation of air pollution



- Rail yard Boundary
- Eastern Side
- Within Railyard
- Western Side



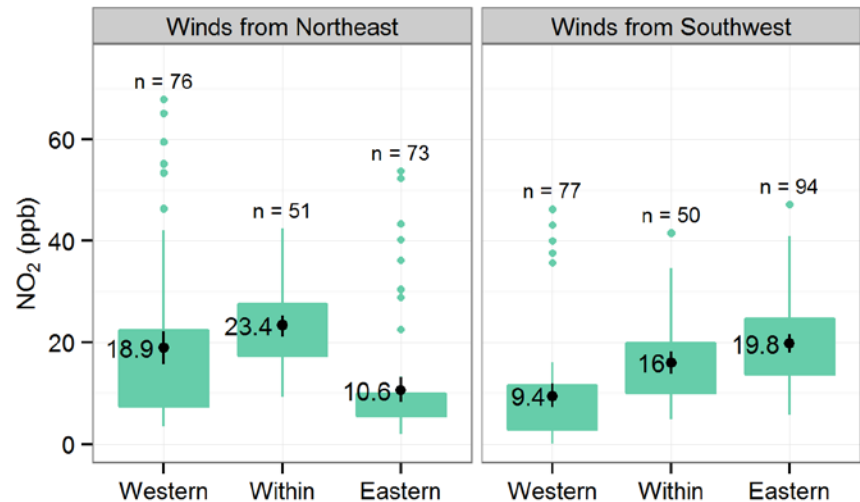
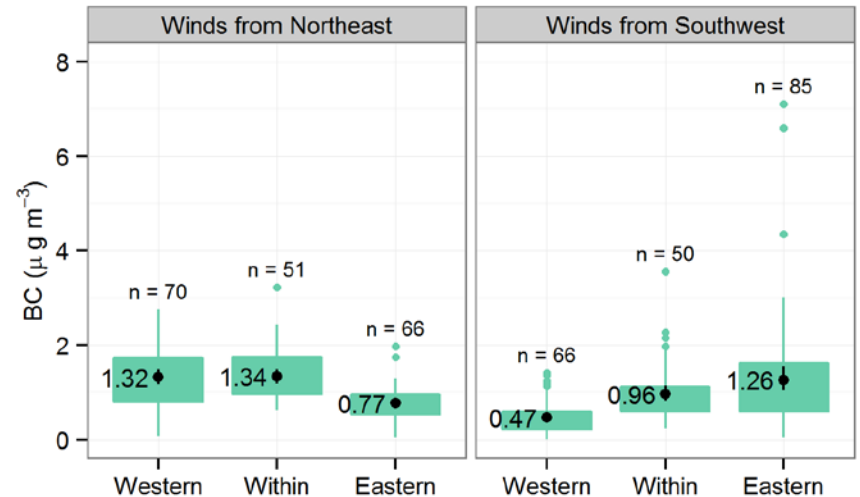
Measuring local air quality trends around large complex sources





# Mobile monitoring

- A key tool in our research to understand spatial variation of air pollution



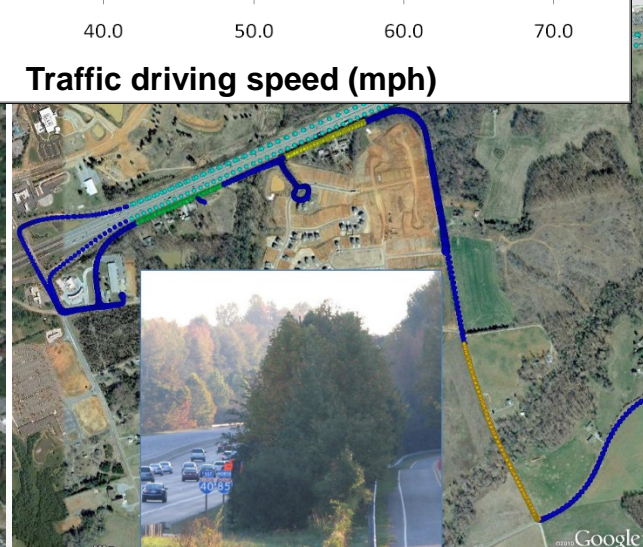
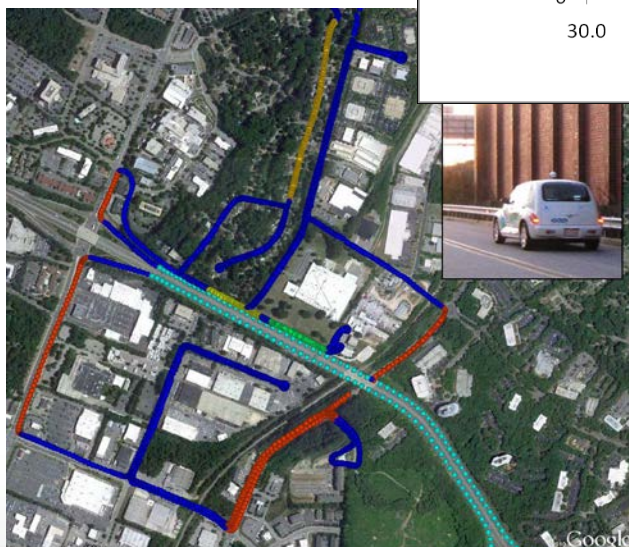
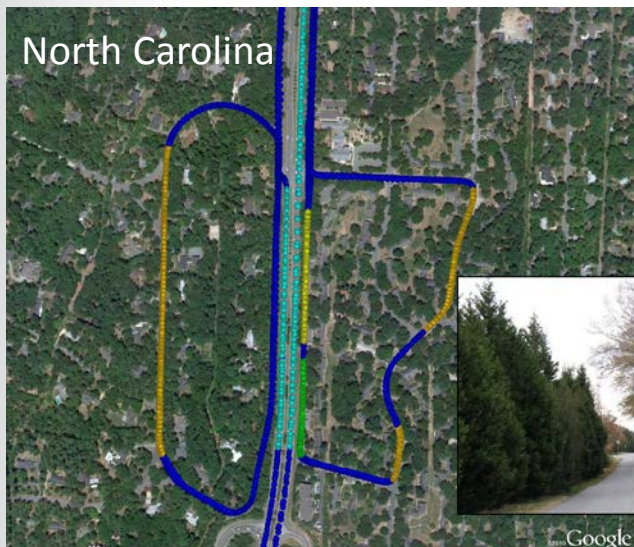
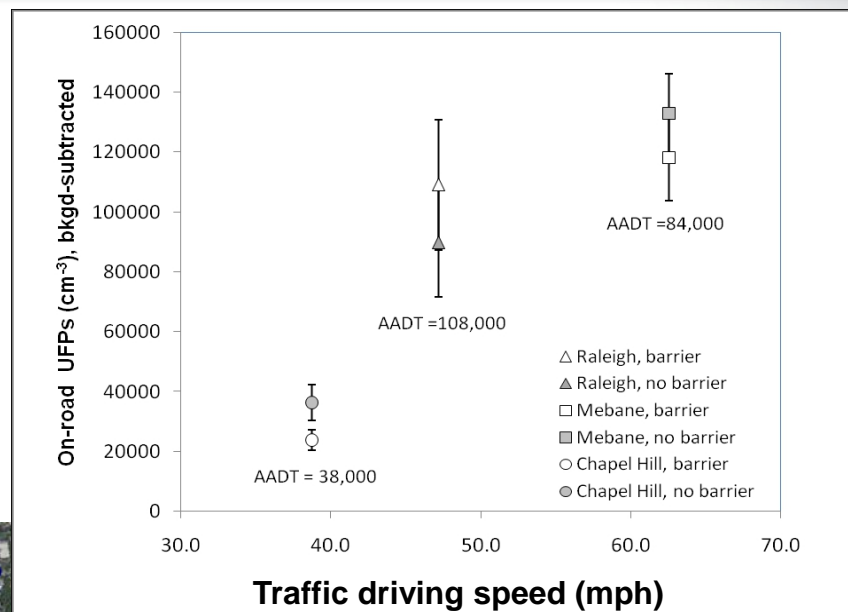


# Mobile monitoring

- Also, extremely useful in near-road studies

e.g., Does the presence of trees or a noise barrier increase on-road ultrafine particle concentrations?

e.g., Are near-road UFPs higher or lower in near-road areas with and without a tree stand or structural wall?



Hagler et al., (2012). Field investigation of roadside vegetative and structural barrier impact on near-road ultrafine particle concentrations under a variety of wind conditions. *Science of the Total Environment*, 419: 7-15.

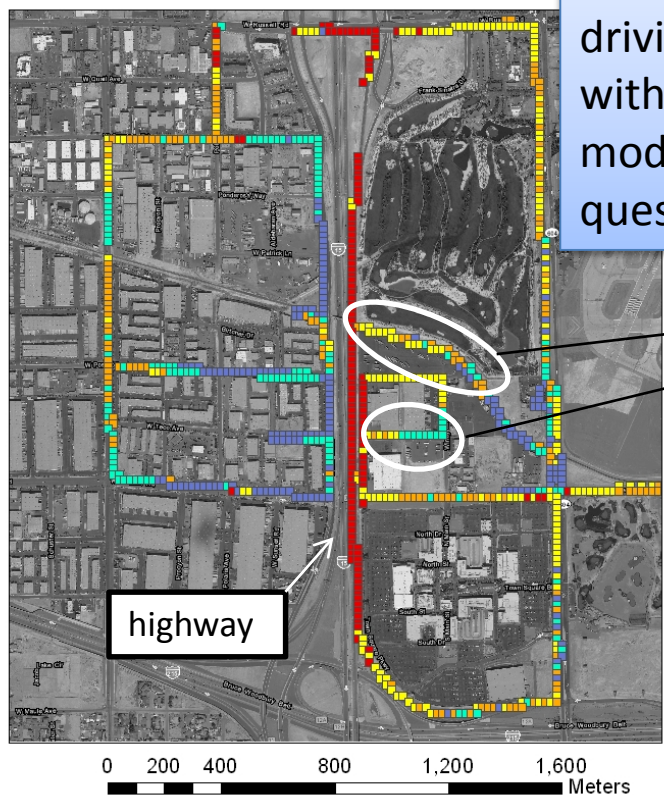


# Mobile monitoring

- Also, extremely useful in near-road studies

Las Vegas, Nevada

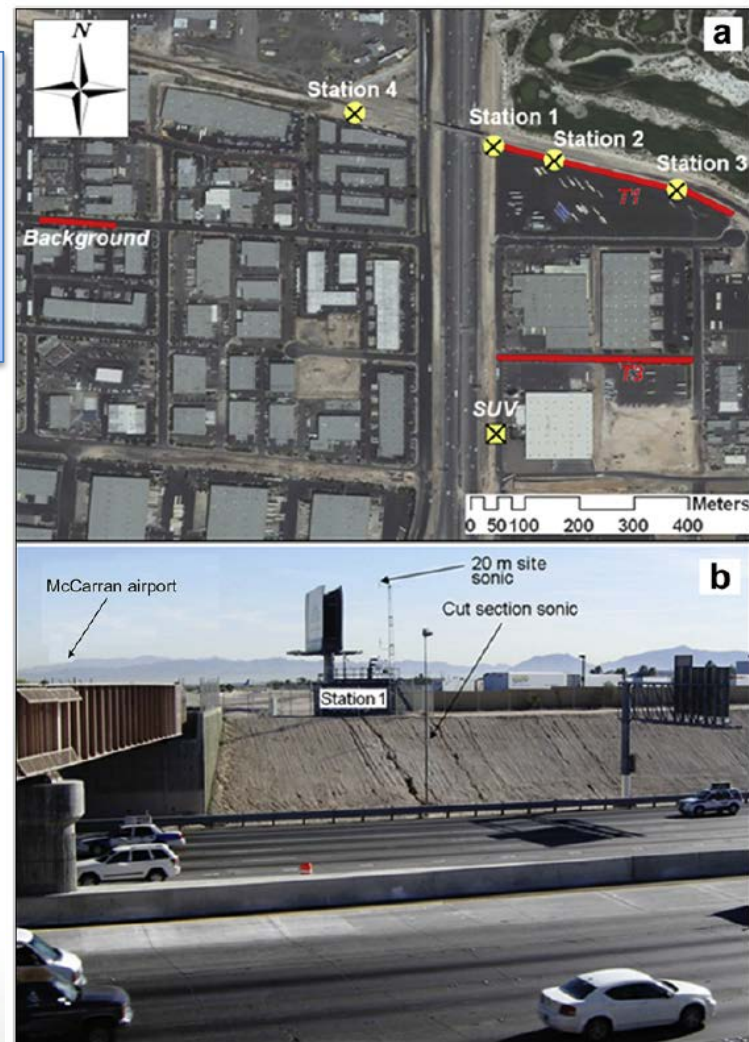
Isolation of part of driving route to compare with stationary data, models, and answer key questions



**Black Carbon ( $\text{ng}/\text{m}^3$ )**

20m average

- 0 - 430
- 431 - 560
- 561 - 860
- 861 - 2030
- 2031 - 44541



Baldauf et al., (2013). Air quality variability near a highway in a complex urban environment. *Atmospheric Environment*. 64: 169-178.

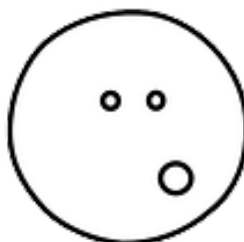
# Dealing with data

- What happens behind the scenes

“We have this pretty cool air monitoring vehicle and a great study plan...”



“... we realized we need to do a lot of pre-testing to make sure we understand our data...”



“Finally executed our study plan and the instruments worked well!”



“Hey bright programming minds, cool project(s) over here!”



“Need to develop custom algorithms to handle this complex data...before we even get to answering research questions...”



## Dealing with data

- What happens behind the scenes



*"We have this pretty cool air monitoring vehicle and a great study plan..."*

Elements to think about in designing a near-source mobile monitoring study:

- Desired geographic area coverage
- Available time / resources
- Variation in local wind direction/speed
- Time variation in source emissions
- Confounding sources

Example plan to balance available sampling days among multiple routes

Prevailing wind direction

	Minimum target # days	N	NE	E	SE	S	SW	W	NW
Route 1	6						Target: 3+		
Route 2	5		Target: 2+						
Route 3	4	Target: 2+							
Route 4	3	Target: 1+						Target: 1+	

## ● Measurement evaluation

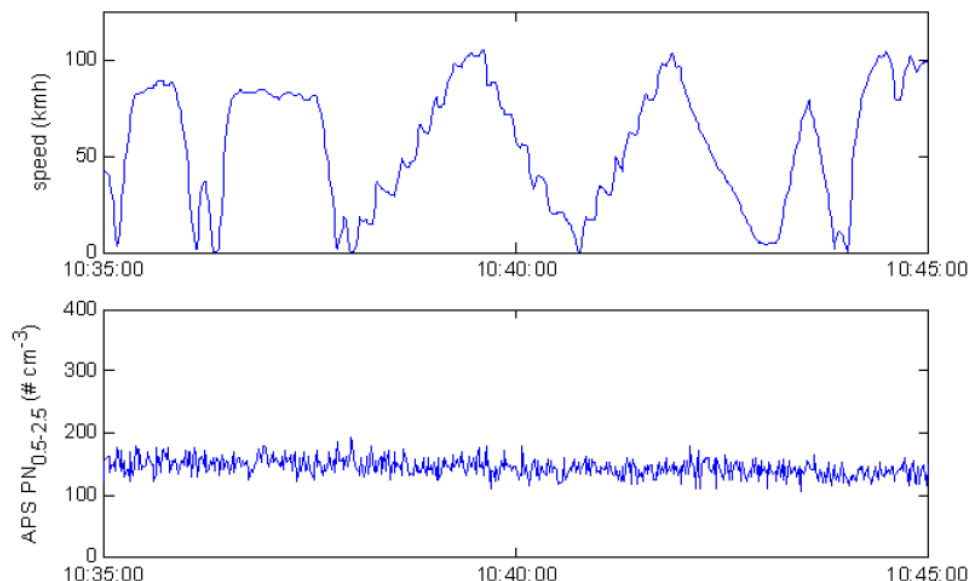


*"... we realized we need to do a lot of testing to make sure we understand our data ..."*

Elements to think about in instrumentation selection and application:

- Sampling inlet design
- Instrument response time
- Sampling lag time per instrument
- Measurement issues caused by instrument orientation or vibration

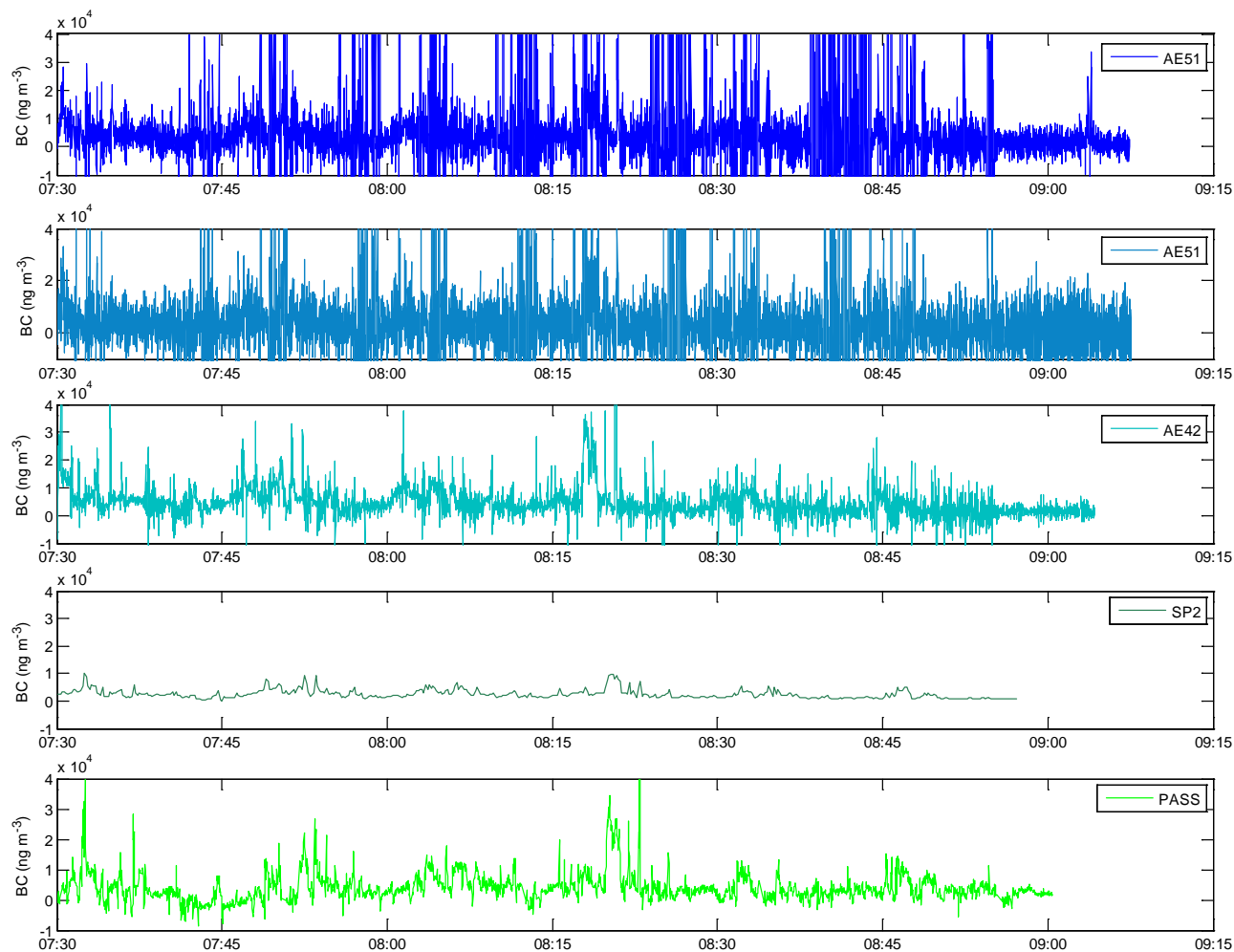
Testing on no-traffic road to see if varying vehicle driving speed leads to differences in instrument noise, artifact in larger particle sampling





# Dealing with data

- Measurement evaluation



Testing of various BC sampling instruments – instrument orientation a potential issue for AE51s

Holder et al., (2014). On-road black carbon instrument intercomparison and aerosol characteristics by driving environment. Atmospheric Environment. 88: 183-191.



# Dealing with data

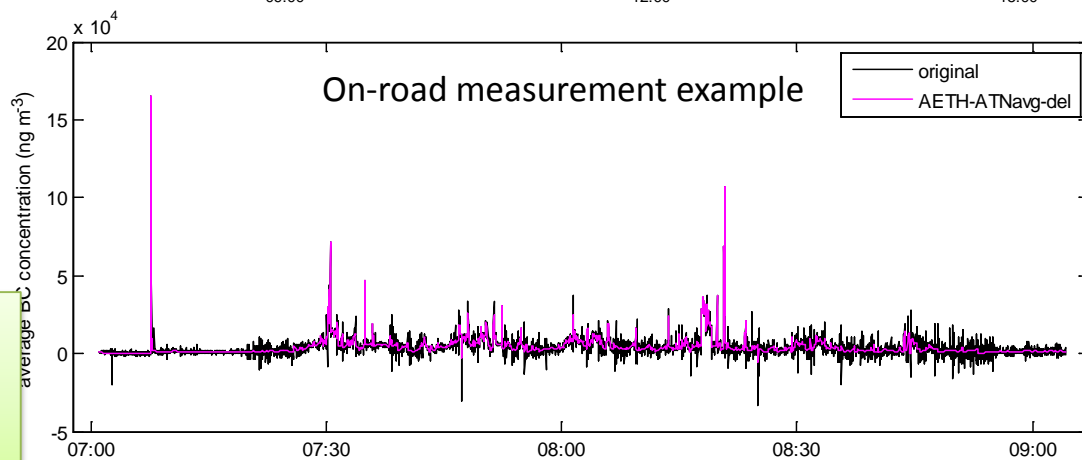
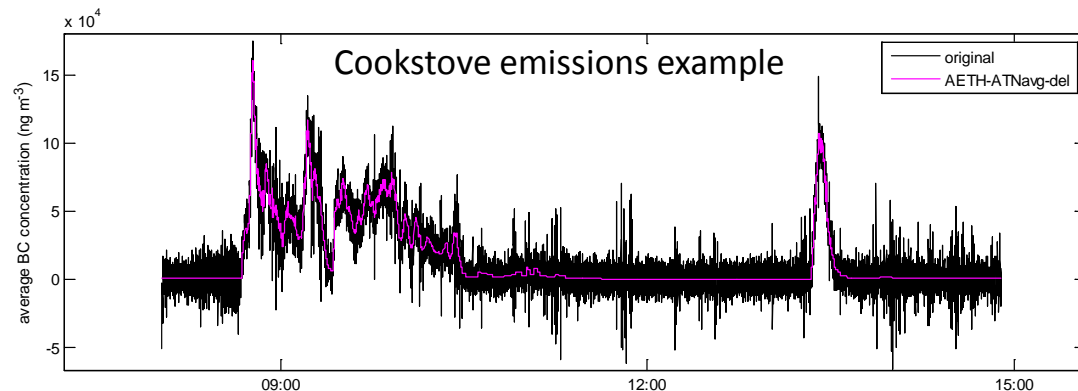
- Data processing approaches



*“Need to develop custom algorithms ...”*

Algorithm to maximize utility of real-time Aethalometer data

Code and executable available at:  
<http://www.epa.gov/ordntrnt/ORD/NRMRL/appcd/mmd/ona.html>



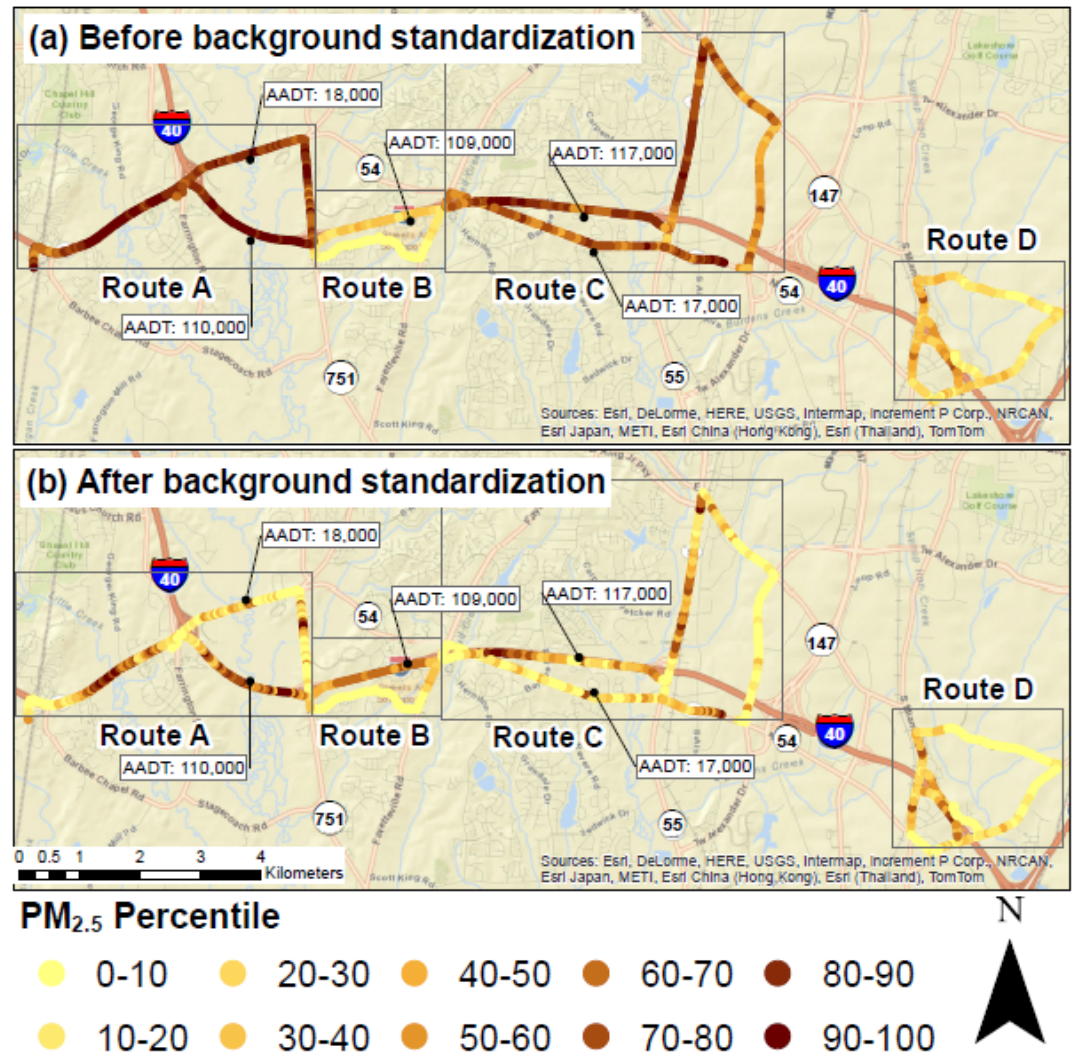
Hagler et al., (2011). Post-processing method to reduce noise while preserving high time resolution in Aethalometer real-time black carbon data. Aerosol and Air Quality Research. 11: 539-546.



# Dealing with data

- Data processing approaches

Evaluating method to merge together and interpret data collected on different routes, on different days...with different regional background levels



Brantley et al. (2014). Mobile air monitoring data-processing strategies and effects on spatial air pollution trends. *Atmospheric Measurement Techniques*. 7: 2169-2183.

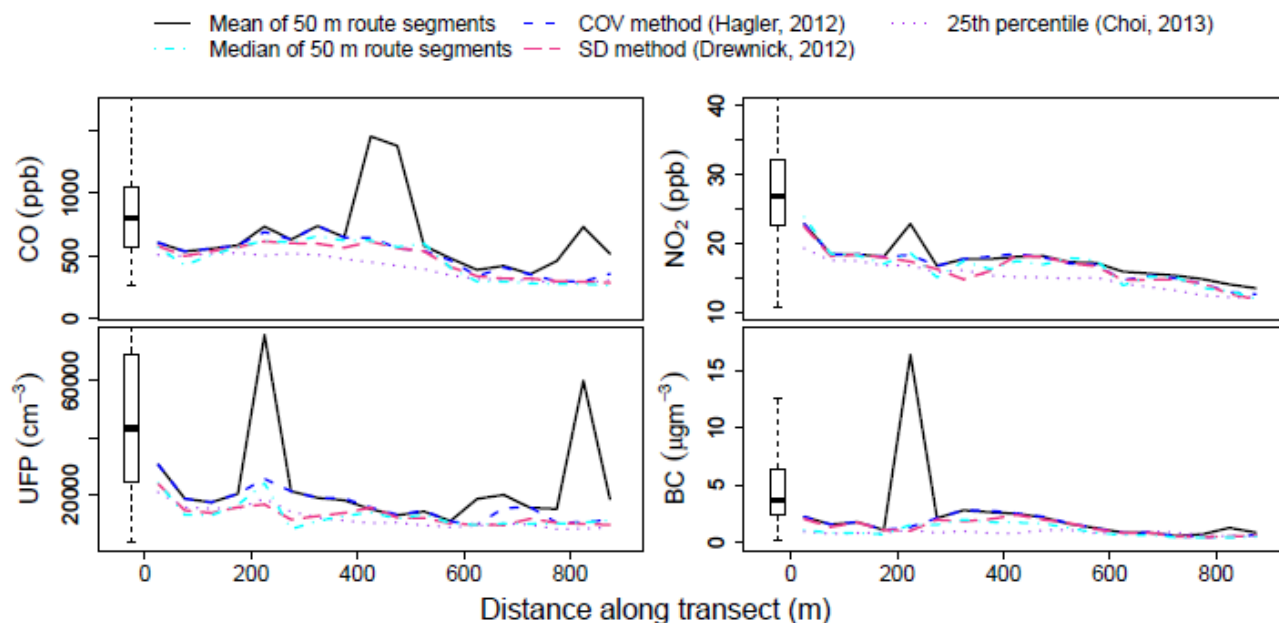


# Dealing with data

- Data processing approaches

Evaluating methods to merge together many laps of a near-road transect and isolate/remove brief proximate exhaust events

(simply taking a spatial median was comparable to more sophisticated techniques)



Brantley et al. (2014). Mobile air monitoring data-processing strategies and effects on spatial air pollution trends. *Atmospheric Measurement Techniques*. 7: 2169-2183.



- RETIGO: free tool for a quick upload and exploration of geospatial air monitoring data.
- Email: [hagler.gayle@epa.gov](mailto:hagler.gayle@epa.gov) if you are interested in information on its pending availability and live webinar tutorials

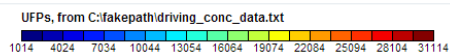


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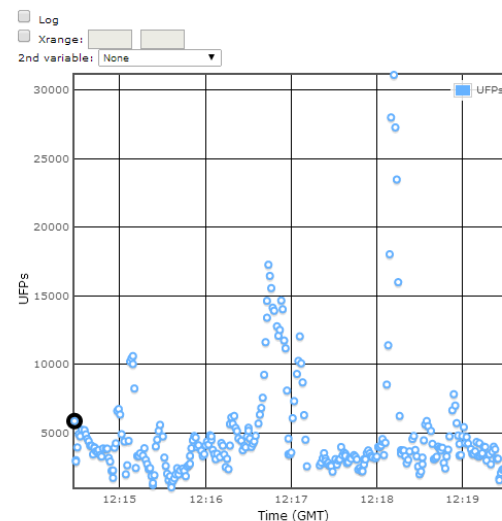
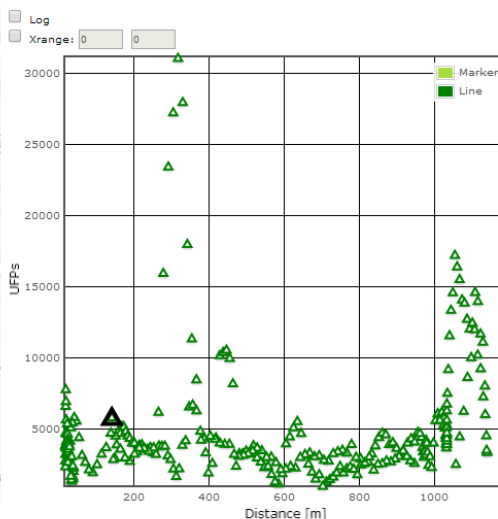
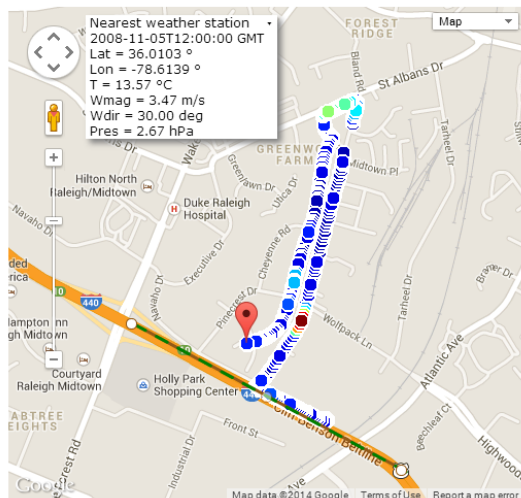
RETIGO is a free, web-based tool for viewing local air quality data. It is intended to be used by anyone to display their crowd-sourced air quality data. Data from nearby air quality and meteorological stations can optionally be displayed. Enter your data file below, or visit the [tutorial page](#) for help in getting started.

← Look at another data file



Time: Wed, 05 Nov 2008 12:14:28 GMT

UFPs = 5846.0000



☒ Show map  
☒ Show analysis plot  
☒ Show timeseries plot  
☐ Show KML layer  
☐ Show connecting line  
☒ Show all points  
☐ Single point  
 Map size:

Identifier:  All  None

☒ Raleigh

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Time range: ☒ Avg ☐ Block  
☒ 2008-11-05T12:14:00

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min:  1014 max:

31114

☐ speed  
☒ UFPs  
☐ PM  
☐ O3



## Take-home thoughts

- Mobile monitoring is an extremely useful tool for near-source air quality characterization
- Successful data collection is highly labor and data-processing intensive – careful data interpretation required, taking into light instrumentation capability, route complexity, local meteorology.
- Emergence of new portable instrumentation is likely to increase the prevalence of mobile monitoring (bicycles, wearables, vehicles)



## Acknowledgements

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- Lockheed Martin: Matt Freeman, Mike Uhl
- ARCADIS: Parik Deshmukh, Michael Derlicki