## Connecting space-based observations with dense networks of surface measurements

### Ronald C. Cohen UC Berkeley

### \$ BAAQMD, NASA, UC Berkeley, HEI, Koret Foundation

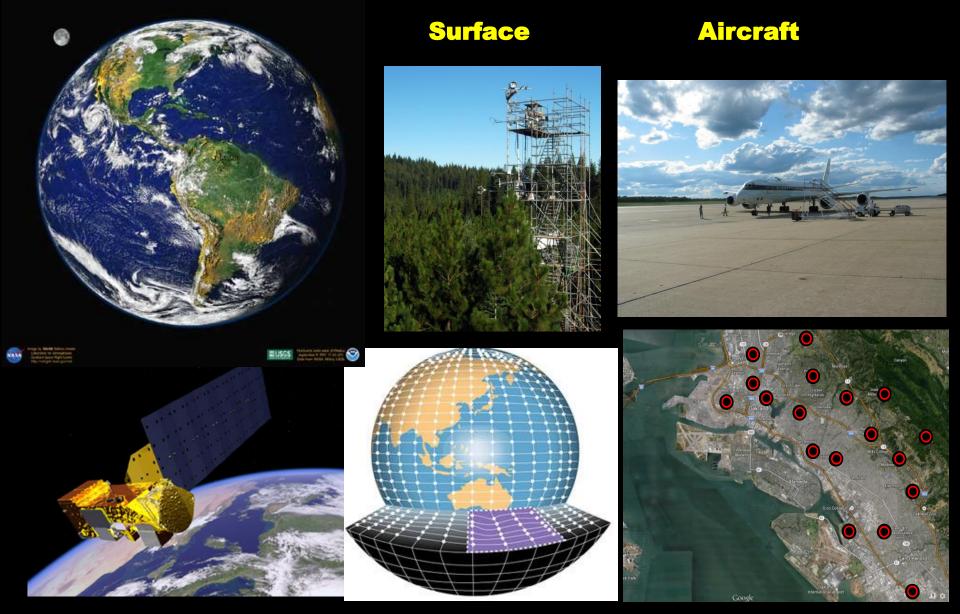
## **My Questions**

What can we do to understand the processes affecting air quality at the neighborhood scale?

How are those processes changing over time?



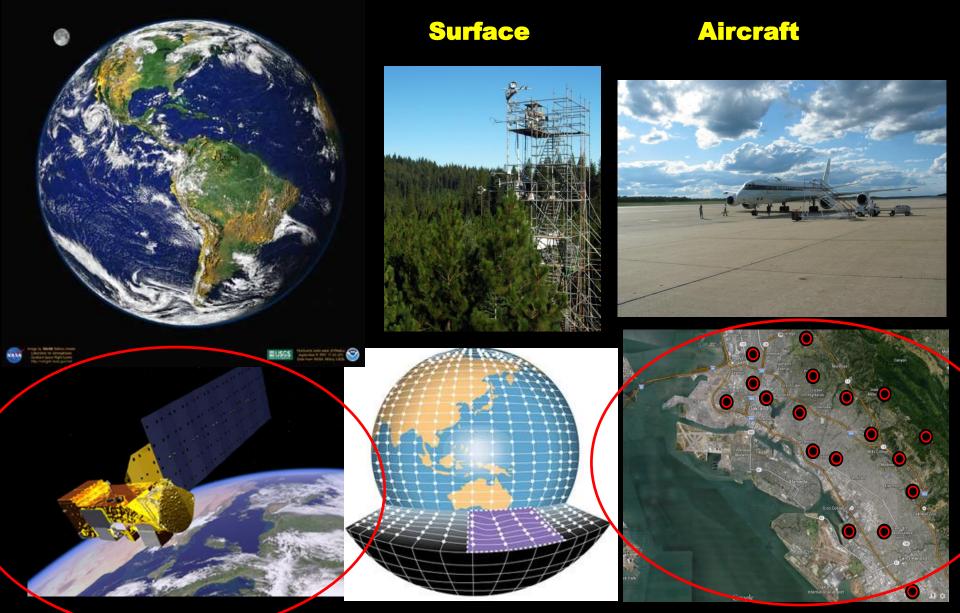
1972 2001 New York City



Remote sensing NO<sub>2</sub>

**Data-Model Syntheses** 

Ubiquitous sensing CO<sub>2</sub>, NO<sub>2</sub>, ...



#### Remot<del>e sensing</del> NO<sub>2</sub>

#### **Data-Model Syntheses**

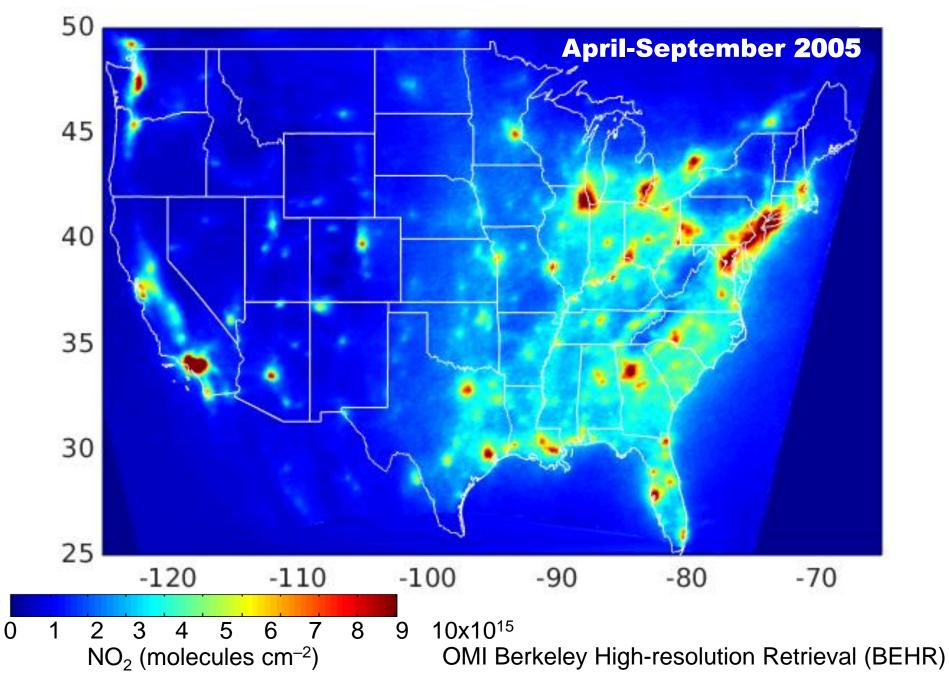
Ubiquitous sensing CO<sub>2</sub>, NO<sub>2</sub>, ...



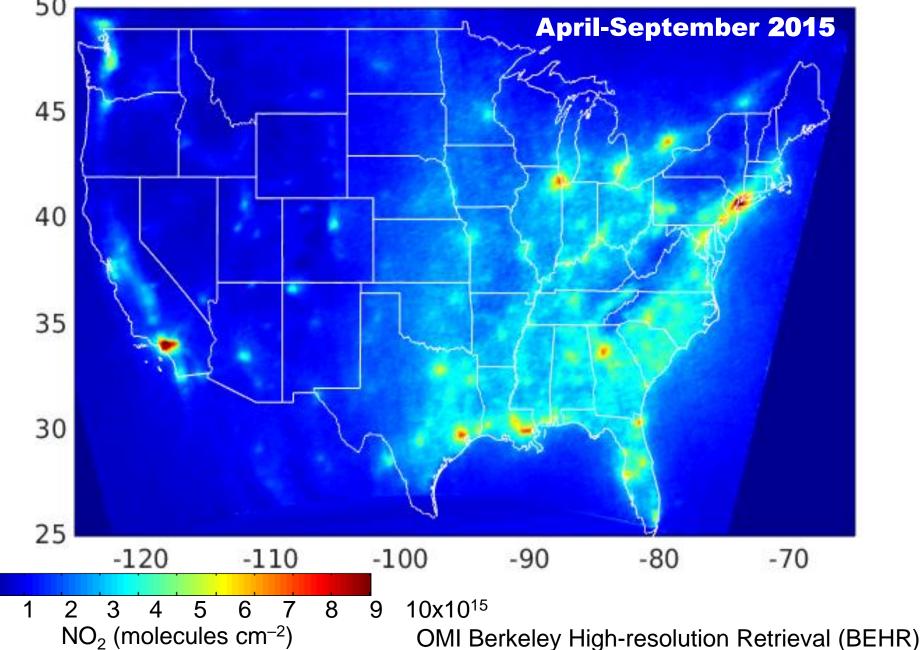
## Satellite remote sensing of chemicals: global and once per day

**Tropospheric NO<sub>2</sub> Column** 

#### **Continental and urban scale averages**



Large decreases over the last decade in U.S. result in smaller spatial extent of urban and power plant plumes

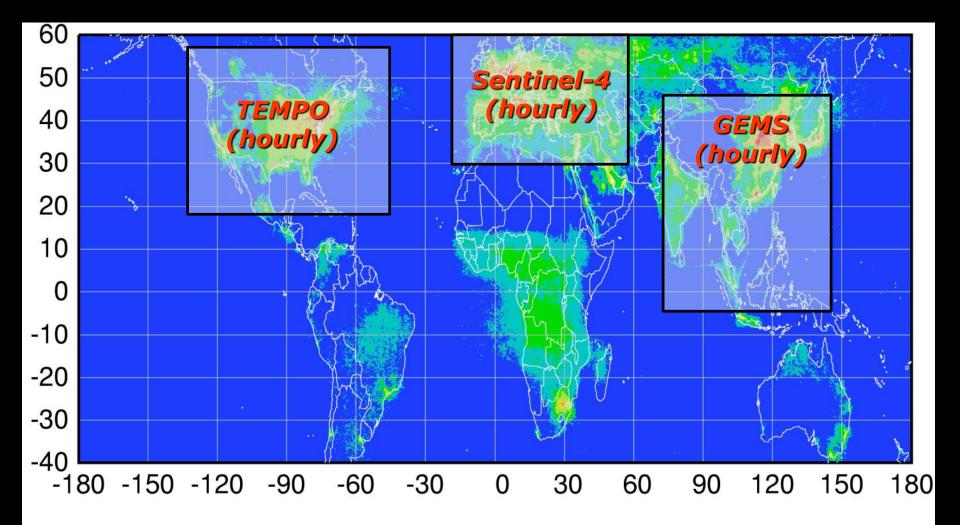


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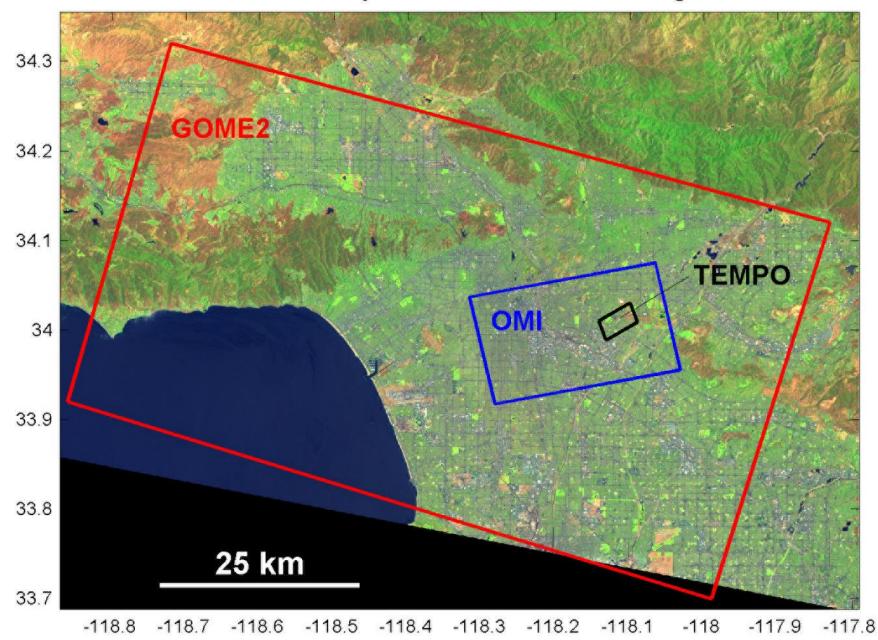
• Measurements (voltage, current ...)

Understanding about how the world works

## Geostationary instruments to be launched soon will be local and ~12 times per day



#### Instrument Footprint over Northwest Los Angeles

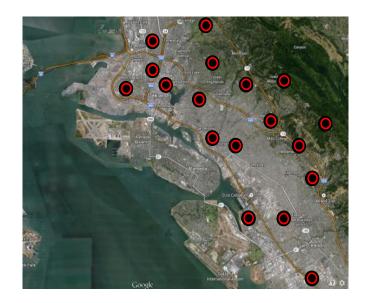


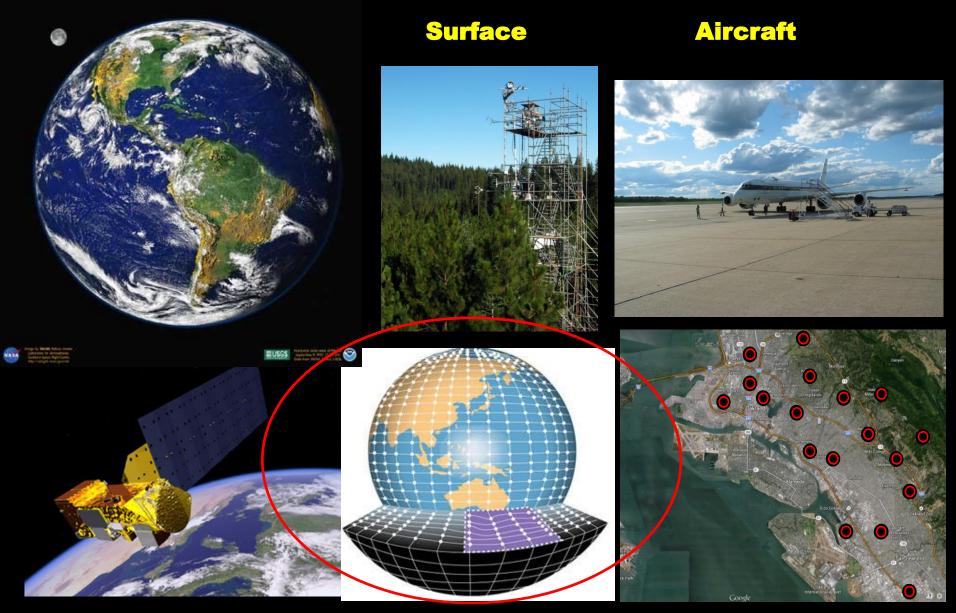
### On a neighborhood scale new satellites and inexpensive sensing will change how we think about emissions and air quality

#### On a neighborhood scale inexpensive sensing is one way we will provide ground truth for new satellites

To understand what low cost sensors and satellites can teach us that is genuinely new, we have some hard work to do to express current understanding in accessible forms.



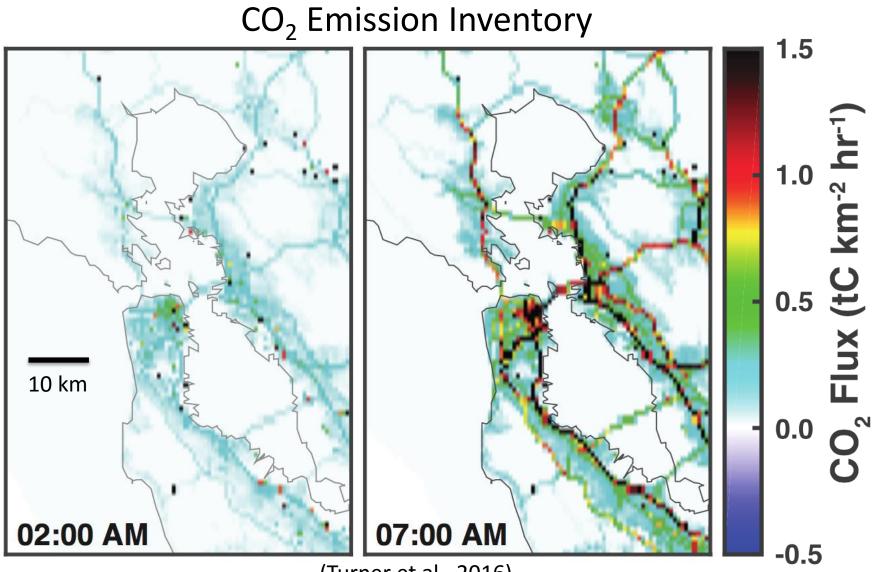




Remote sensing NO<sub>2</sub>

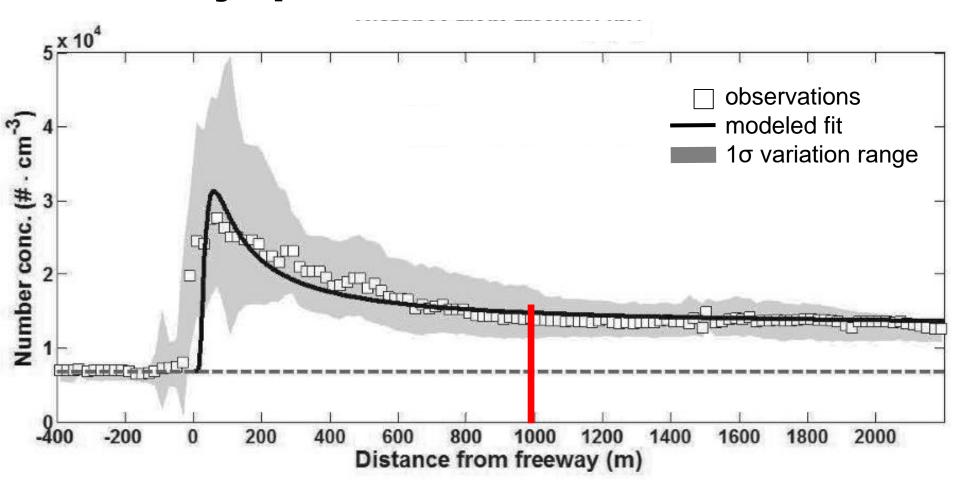
**Data-Model Syntheses** 

Ubiquitous sensing CO<sub>2</sub>, NO<sub>2</sub>, ... Current models of emissions have few parts that respond to day-to-day variations in human behavior or weather.



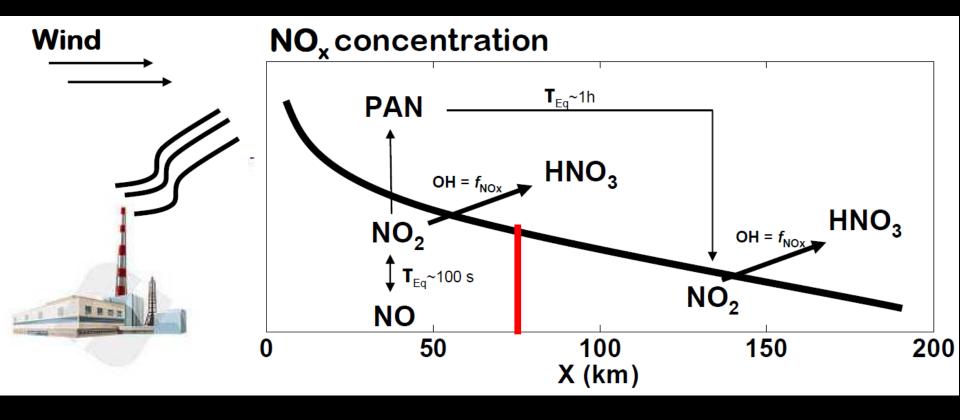
<sup>(</sup>Turner et al., 2016)

## Atmospheric mixing and dilution occurs on many space and time scales

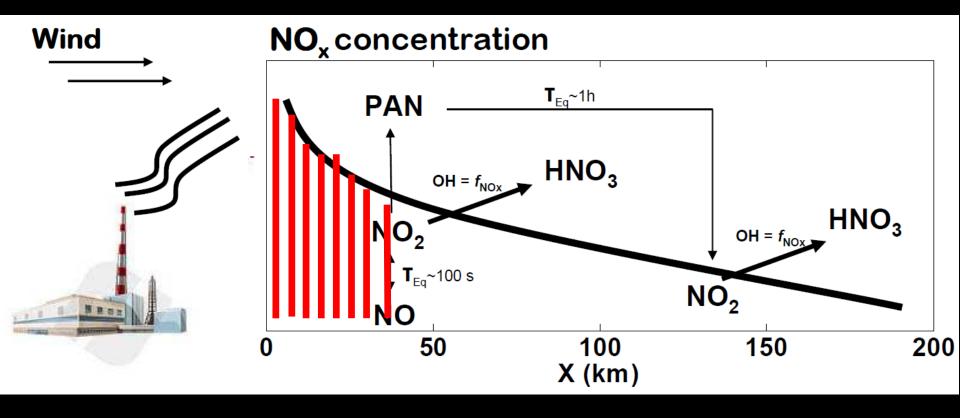


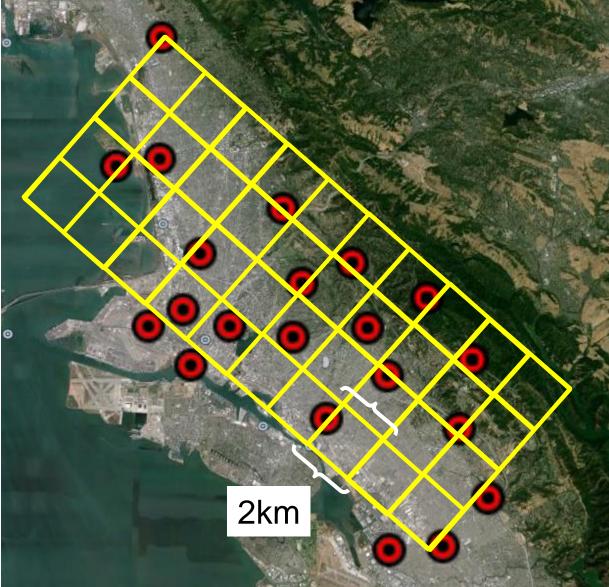
from Choi et al. 2014

## Atmospheric chemistry also has characteristic space and time scales



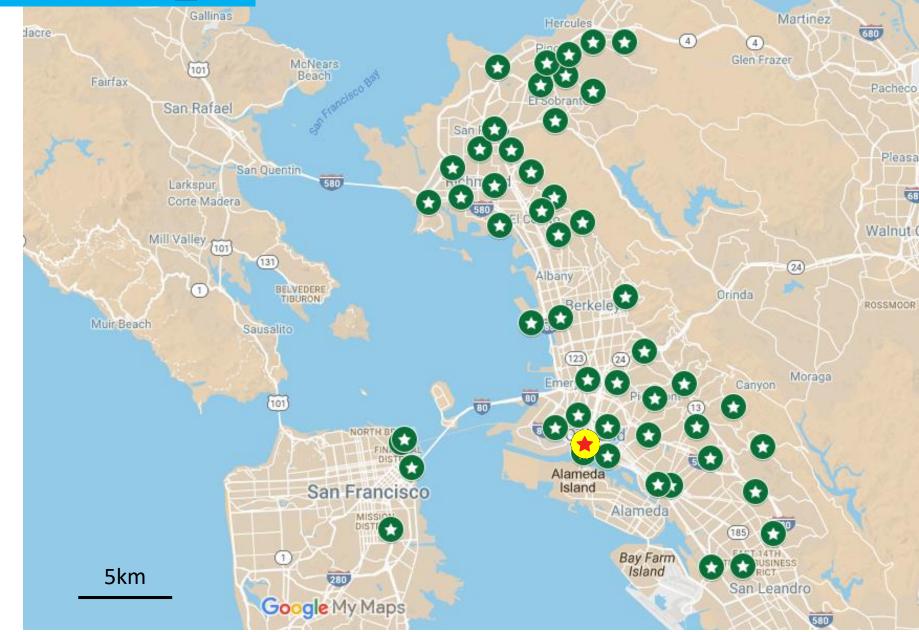
## BEACO<sub>2</sub>N pointwise surface network at ~2km resolution





**BErkeley Atmospheric**  $CO_2$ Observation Network

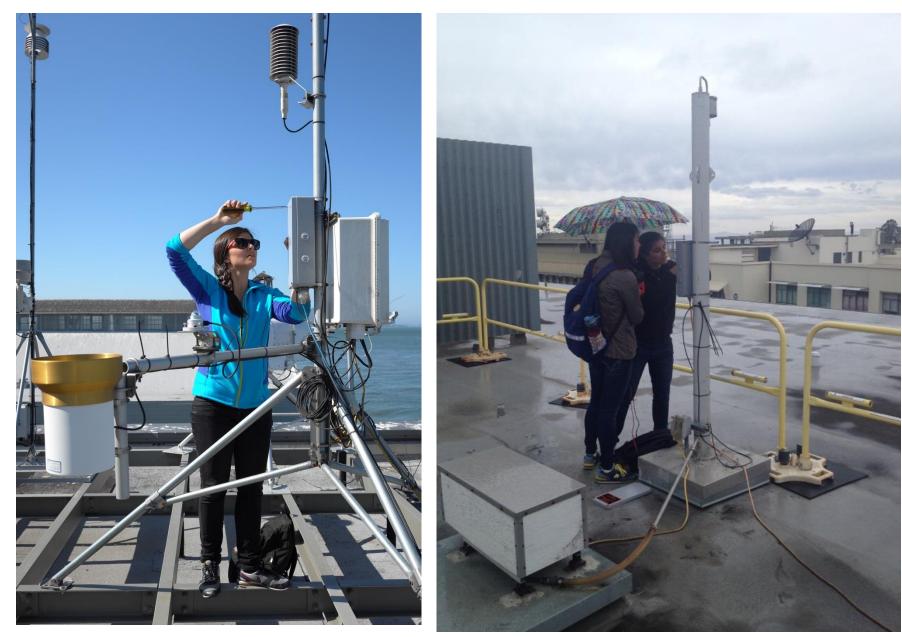
## **BEACO<sub>2</sub>N**



## Posters by Jinsol Kim and Kaitlyn Lieschke

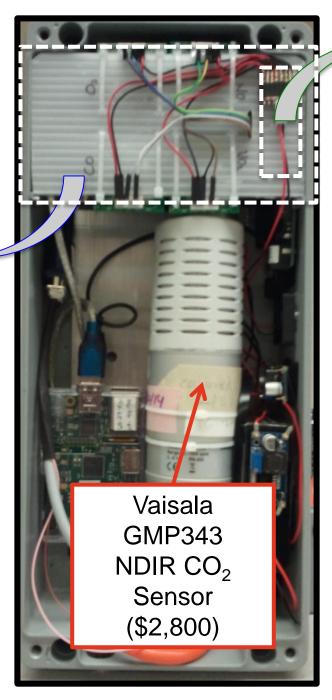


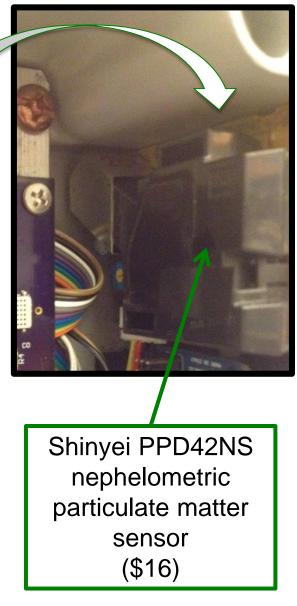
## $BEACO_2N: 2.5m - 130m AGL$



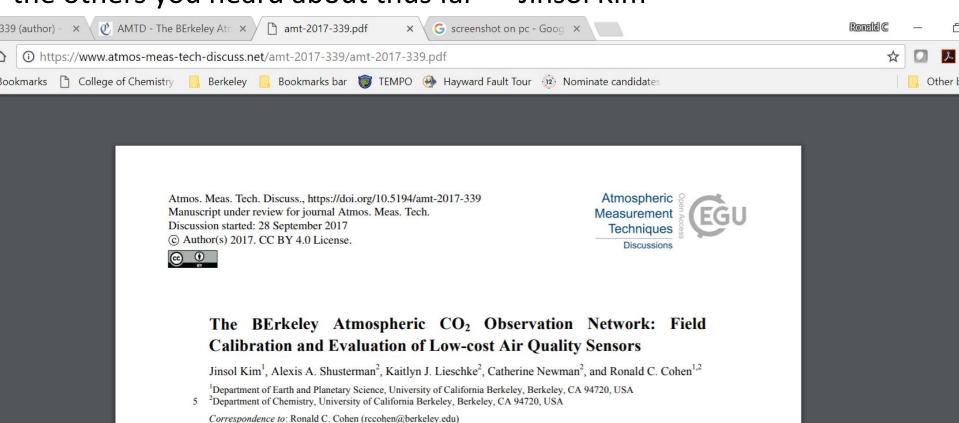
Alphasense B4 Electrochemical  $O_3$ , CO, NO & NO<sub>2</sub> Sensors (\$216 ea.)

O2-B4 161





#### Calibration using approach that is largely different than any of the others you heard about thus far --- Jinsol Kim



Abstract. The newest generation of air quality sensors is small, low cost, and easy to deploy. These sensors are an attractive option for developing dense observation networks in support of regulatory activities and scientific research. They are also of interest for use by individuals to characterize their home environment and for citizen science. However, these sensors are

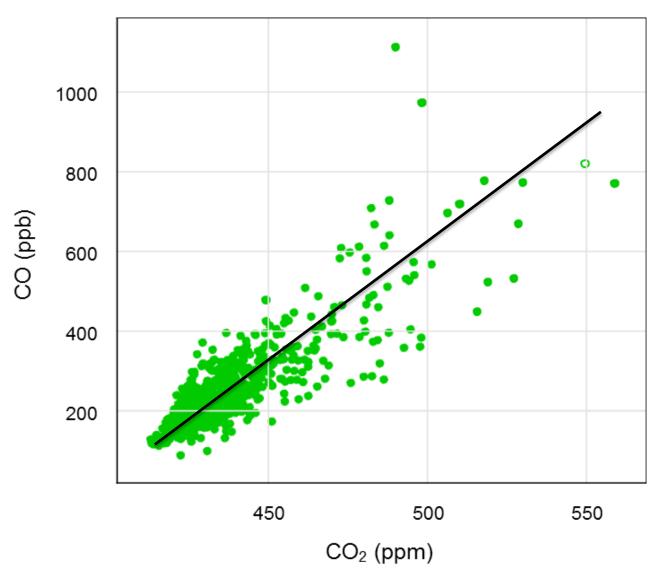
10 difficult to interpret. Although some have an approximately linear response to the target analyte, that response may vary with time, temperature, and/or humidity, and the cross-sensitivity to non-target analytes can be large enough to be confounding. Standard approaches to calibration that are sufficient to account for these variations require a quantity of equipment and labor that negates the attractiveness of the sensors' low cost. Here we describe a novel calibration strategy for a set of sensors including CO, NO, NO<sub>2</sub>, and O<sub>3</sub> that makes use of multiple co-located sensors, a priori knowledge about the 15 chemistry of NO, NO<sub>2</sub>, and O<sub>3</sub>, as well as an estimate of mean emission factors for CO and the global background of CO.

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The strategy requires one or more well calibrated anchor points within the network domain but it does not require direct.



# Sources emit multiple compounds and aerosol



0.6% CO/CO<sub>2</sub>

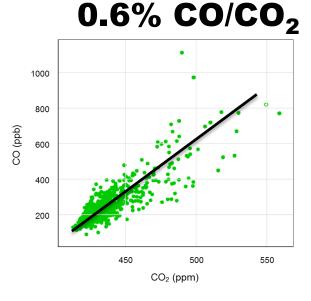
# Sources emit multiple compounds and aerosol

- Cookstoves and charcoal burning ~6% CO/CO<sub>2</sub>; low NO<sub>x</sub>, high aerosol
- Gasoline cars with catalysts (U.S.)
   0.75% CO; 0.01% NO<sub>x</sub> per CO<sub>2</sub>; low aerosol
- Coal fired power plants

low CO:CO<sub>2</sub>, high NO<sub>x</sub> and SO<sub>2</sub> unless controlled

• Heavy duty diesel trucks

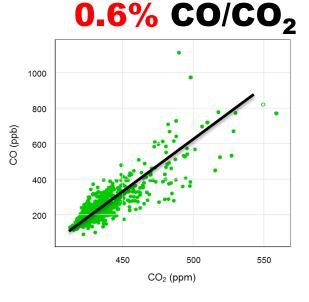
0.4% CO, .12 NO<sub>x</sub> per CO<sub>2</sub>, high aerosol

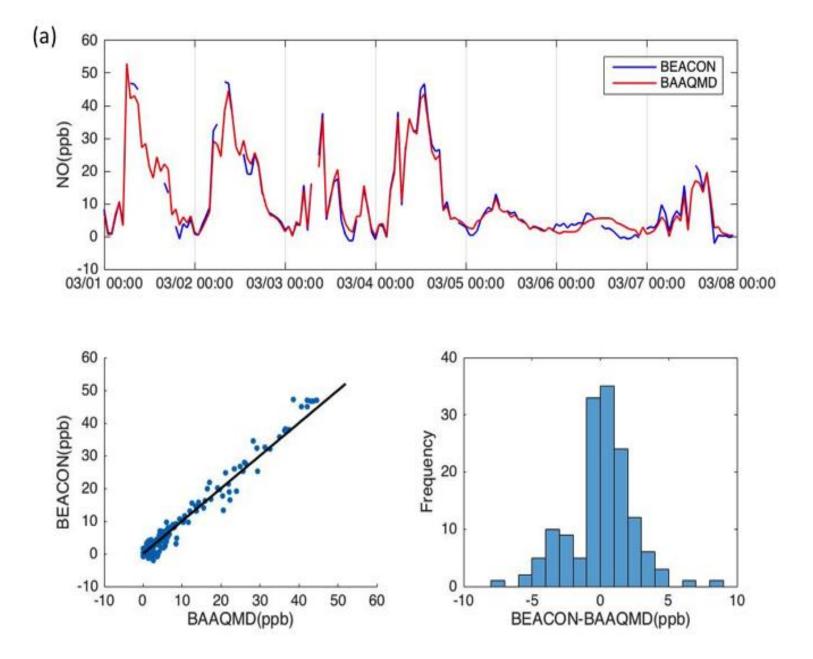


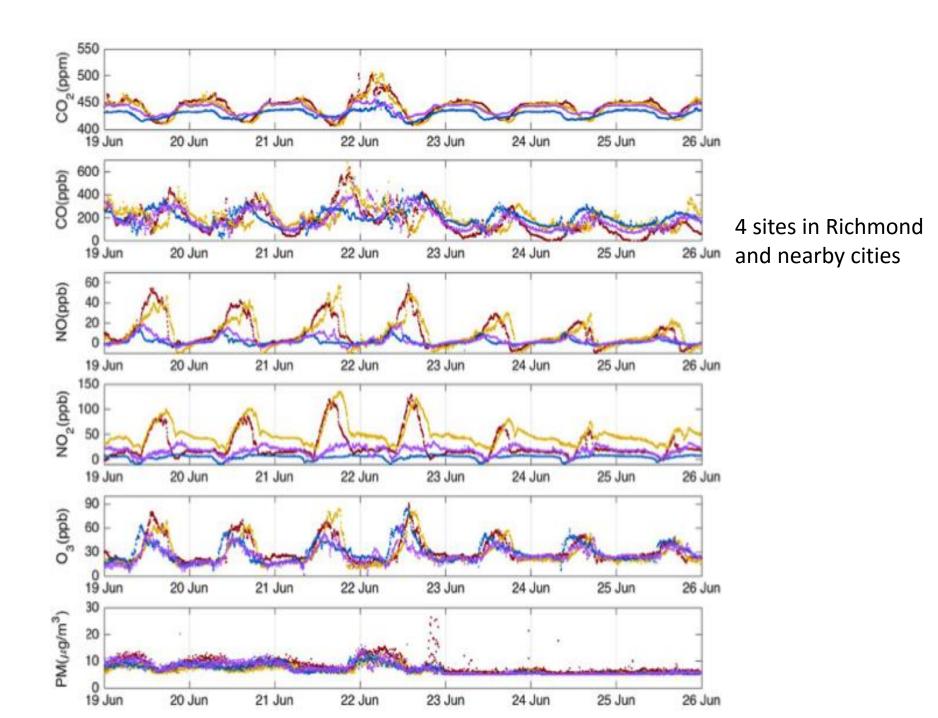
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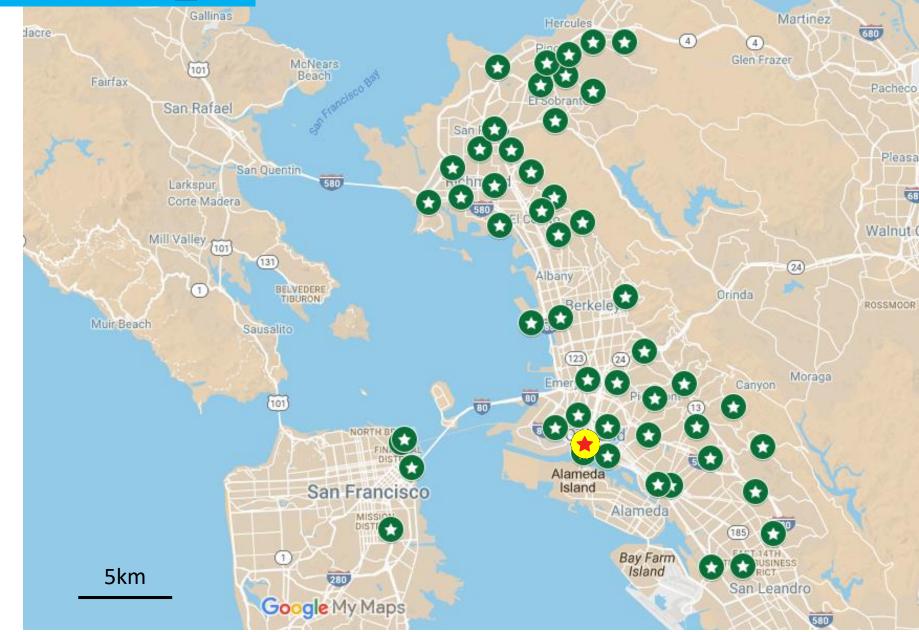
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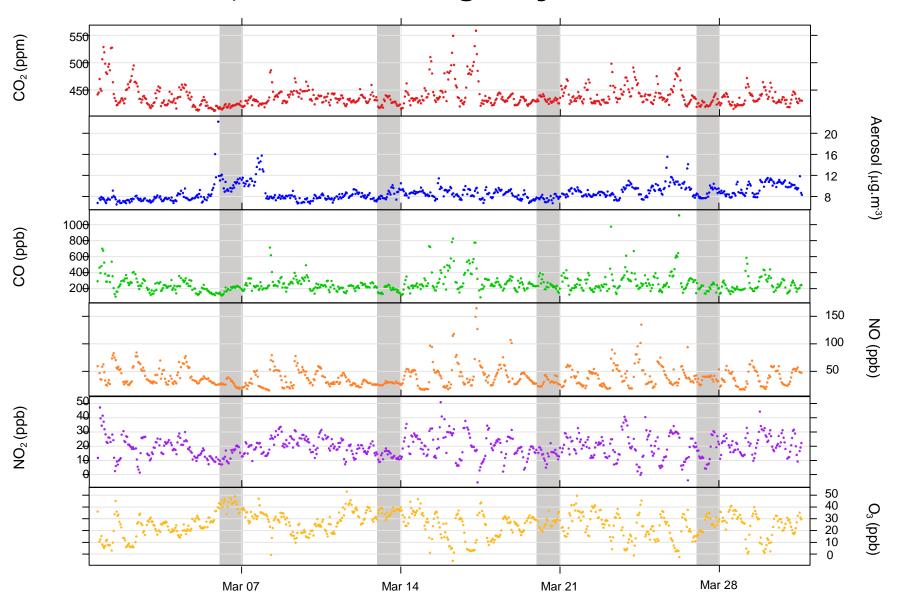


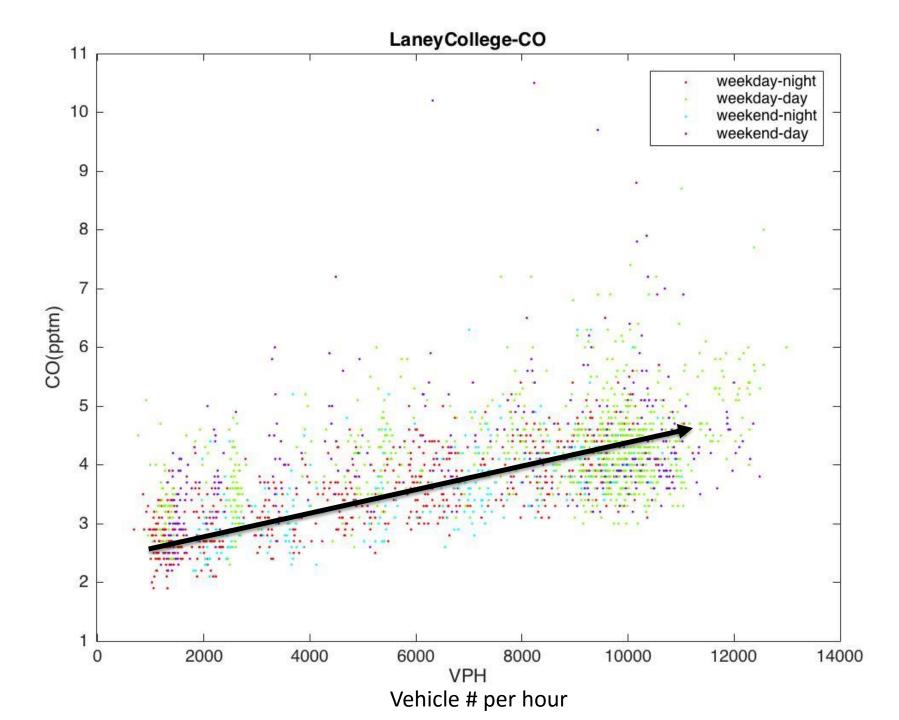
## **BEACO<sub>2</sub>N**

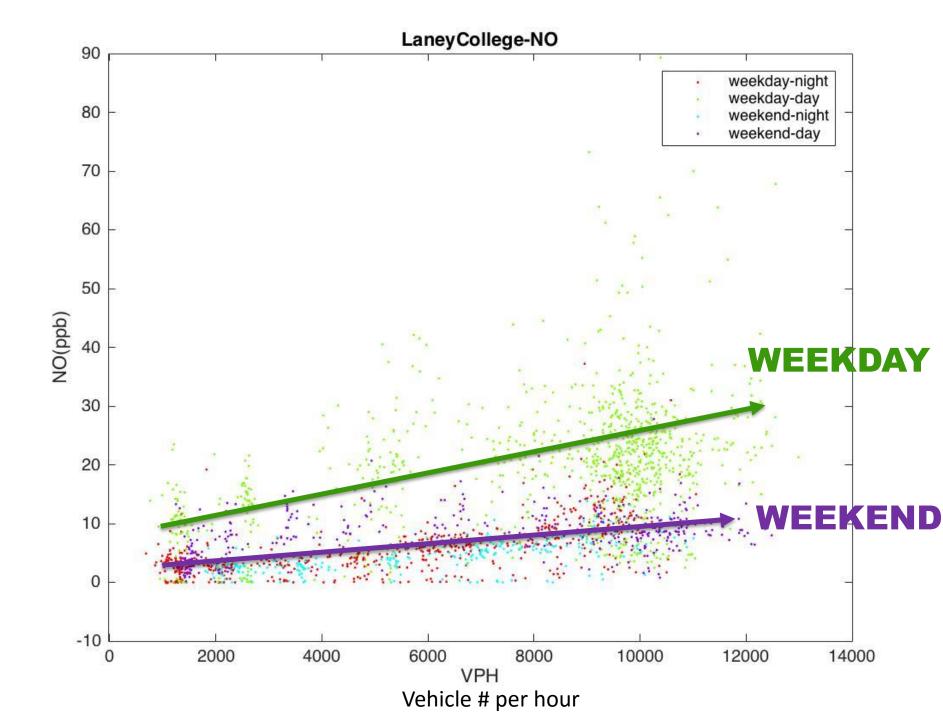


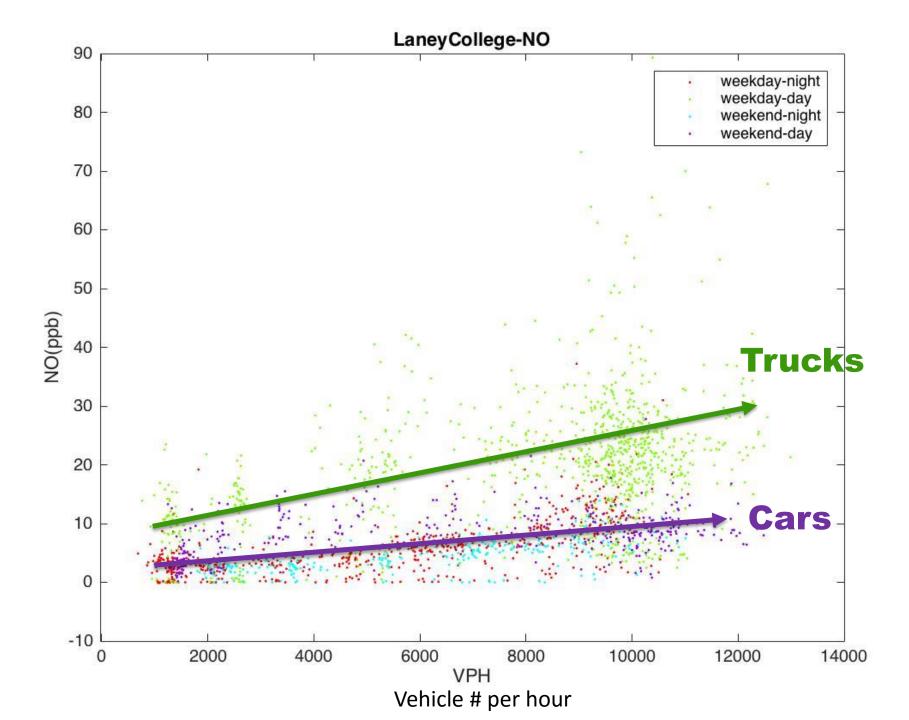


#### **One site, not far from highway - March 2016**

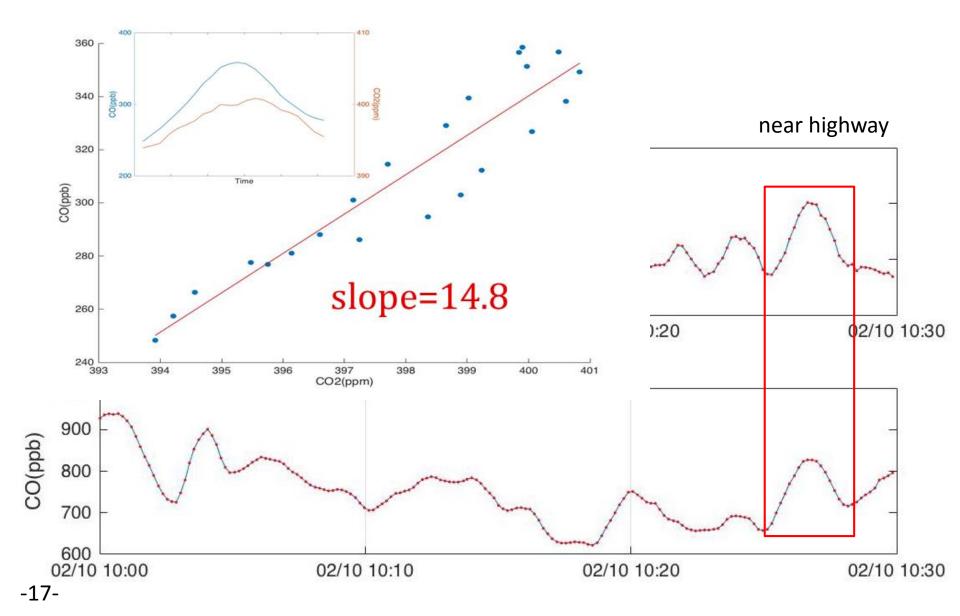




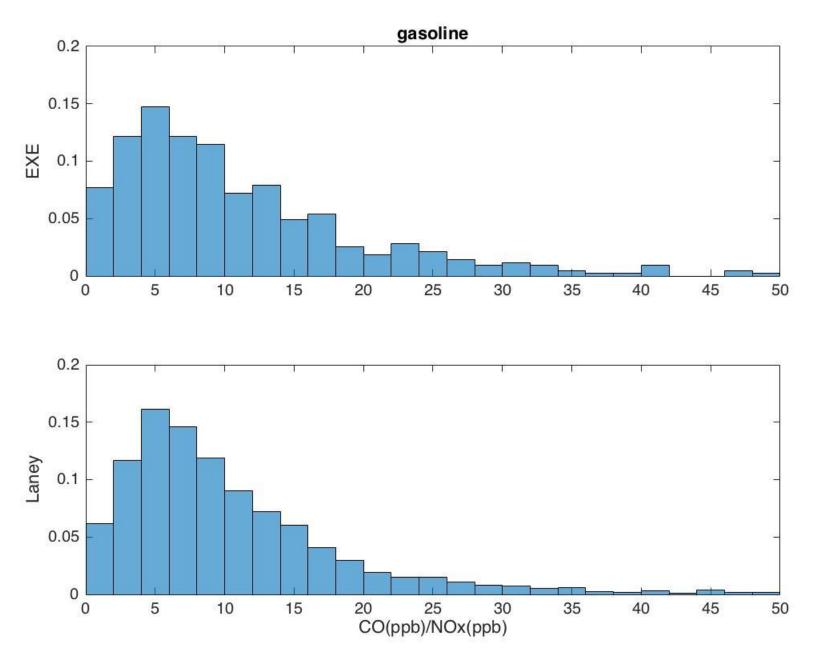




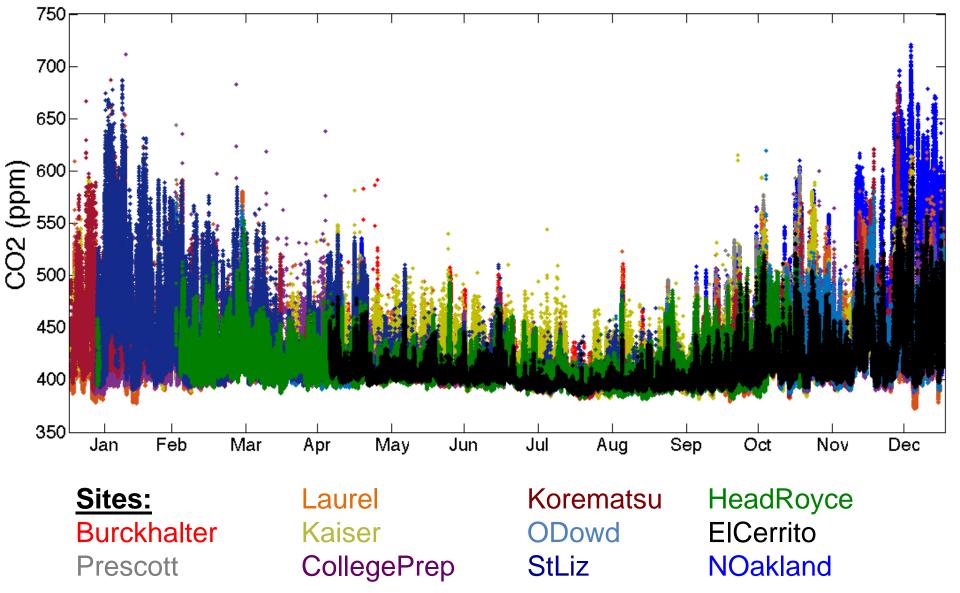
## Analyze every plume



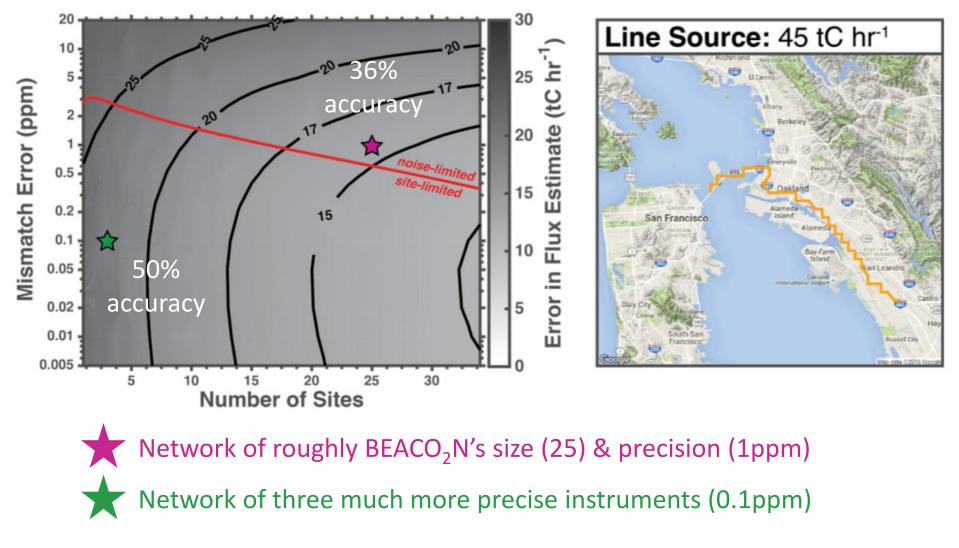
#### **Emission Factors are similar in different locations**



## BEACO<sub>2</sub>N CO<sub>2</sub> 2013



## Quality vs. Quantity



Turner et al. ACP 2016

**BEACO<sub>2</sub>N:** A high spatial resolution observing system for GHGs (CO<sub>2</sub>) and air quality (CO, O<sub>3</sub>, NO, NO<sub>2</sub>, particles)

#### 

A.A. Shusterman, V. Teige, A.J. Turner, C. Newman, J. Kim, and R.C. Cohen: The BErkeley Atmospheric CO<sub>2</sub> Observation Network: initial evaluation, Atmos. Chem. Phys., doi:10.5194/acp-2016-530, 2016.

A.J. Turner, A.A. Shusterman, B.C. McDonald, V. Teige, R.A. Harley and R.C. Cohen, *Network design for quantifying urban CO*<sub>2</sub> *emissions: Assessing tradeoffs between precision and network density* Atmos. Chem. Phys. Disc., 2016.

#### AQ gases

J. Kim, and above team, In field calibration of CO, NO, NO<sub>2</sub>, O<sub>3</sub>, submitted manuscript

#### Aerosol

Kaitlyn Lieschke and above team

and the state of the state of the state

Winess ......

## **Conclusions and Outlook**

High space and time resolution observations using networks with multiple chemicals and aerosol offer a new window into mechanisms affecting emissions and chemistry in cities.

Satellites will offer the same kinds of information with much more complete coverage.

Such networks are one way we will evaluate new space based geostationary sensors that have very small footprints

