## Insights into urban CO<sub>2</sub> emissions from BEACO<sub>2</sub>N

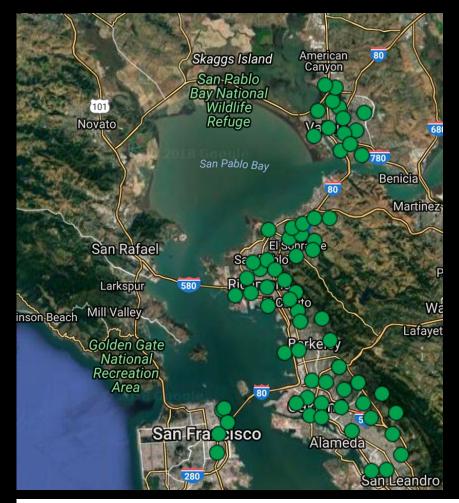
#### Ronald C. Cohen UC Berkeley

What observations would support cities' evaluation of their successes in various kinds of emissions reductions?

How can observations point to win-win-wins for climate, air quality and equity of exposure.

# Dense Observing systems—a new approach to understanding urban emissions

Berkeley Environmental Air Quality and CO<sub>2</sub> Observation Network



#### http://beacon.berkeley.edu



# $NO_2$ , NO, $O_3$ , CO, $CO_2$ , particles

**\$8500 + shipping; Monthly fee for share of technical support and data management** 

Maintenance ~10% or less/yr

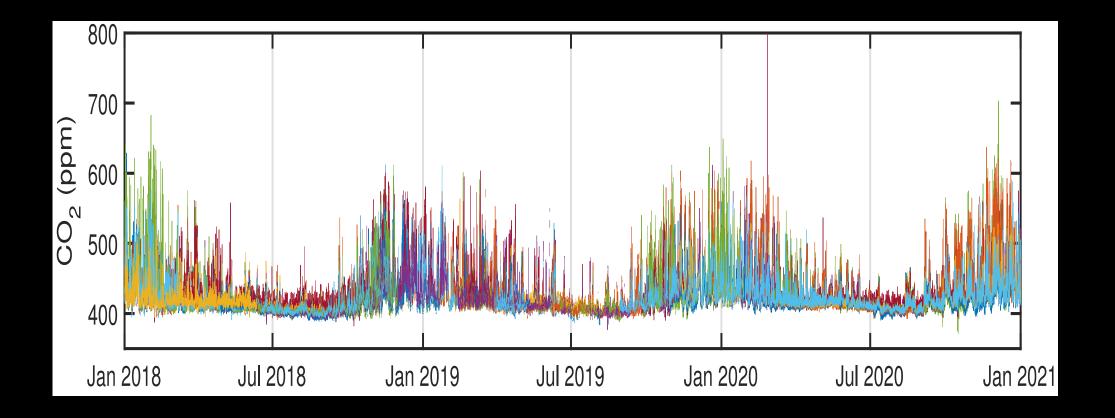
Note: Hardware costs are small compared t o ongoing interpretation.

~20nodes = 1 person year

A. Shusterman, et al., ACP. 2016 J. Kim, et al. AMT, 2018 E.R. Delaria et al. ACP. 2021



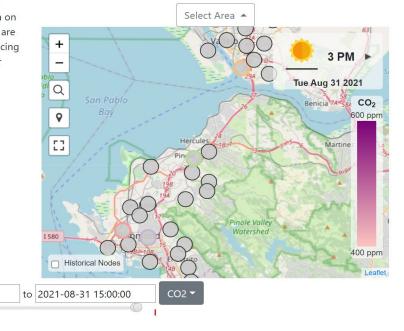
What makes  $BEACO_2N$  unique is the combination of  $CO_2$ and AQ. This brings together siloed research (AQ, GHGs, Climate, EJ) and policy communities (NGOs, cities, regions, national government) that should be working more closely together.



climate change, and reports back to this site where the collected data is publicly available for viewing and download. The nodes also collect data on nitrogen oxides, ozone, carbon monoxide, and particulate matter which are indicators for the overall air quality of an area, and may be useful for tracing the origins of CO<sub>2</sub> emissions. CO<sub>2</sub>, CO, and aerosol data are available for download via this site. Data for other species is not yet ready for public viewing, but will be added to the site soon.

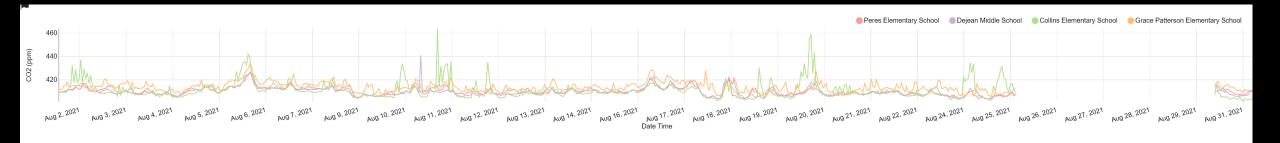
Date Range: 2021-08-01 15:00:00

□ Real-time



Data is posted and available to the public as it comes in.

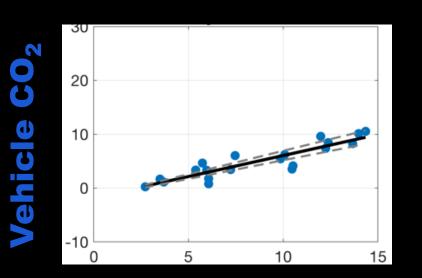
#### Open data, calibration and interpretation.



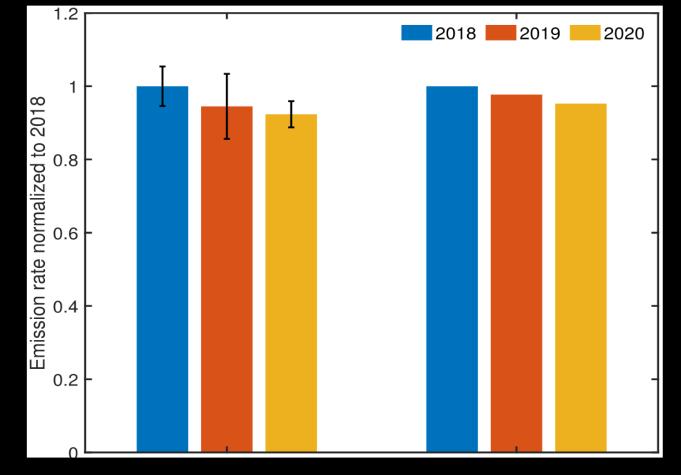
#### http://beacon.berkeley.edu

## **1. Trends in annual emissions per vehicle**

#### **Combining data from 50 locations**



**Vehicles per time** 



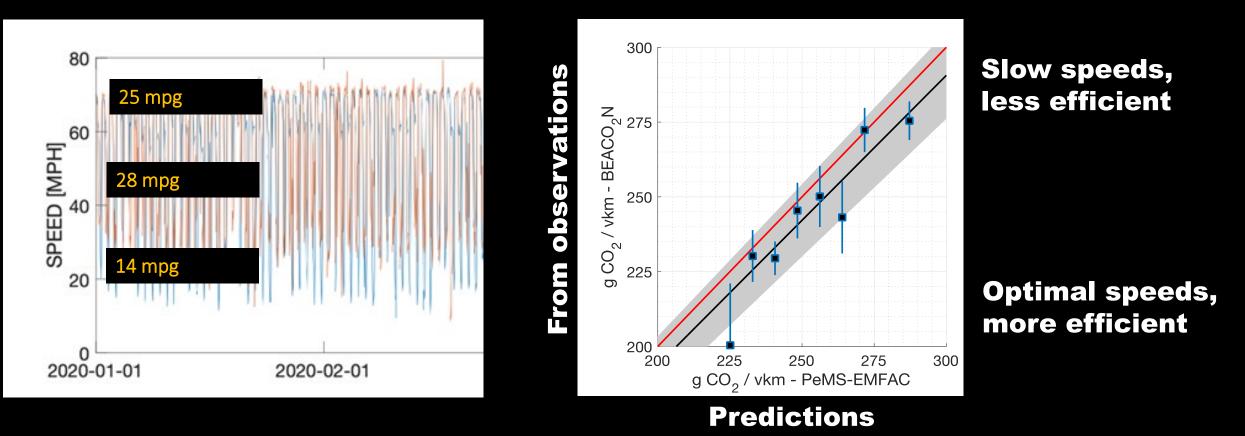
Kim et al. ES&T 2022

#### **Observed 3.8%/yr**

Modeled 2.3%/yr



### 2. Current fleet fuel efficiency vs. speed



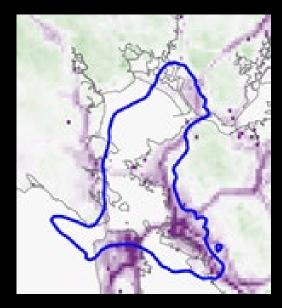
**BEACO<sub>2</sub>N suggests entire vehicle fleet slightly more fuel efficient than predicted at all speeds. Confirms predicted speed dependence is accurate.** 

Fitzmaurice et al. ACP 2022

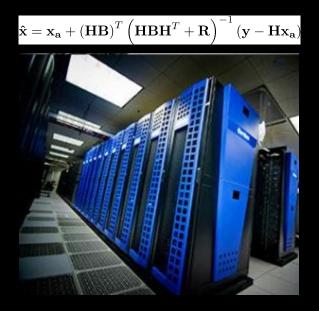


## **3.** How much did $CO_2$ emissions drop in the early phase of the COVID-19 shelter-in-place and why?

## **3 steps in a cycle of observation driven understanding of emissions**







Predictions/ hypotheses

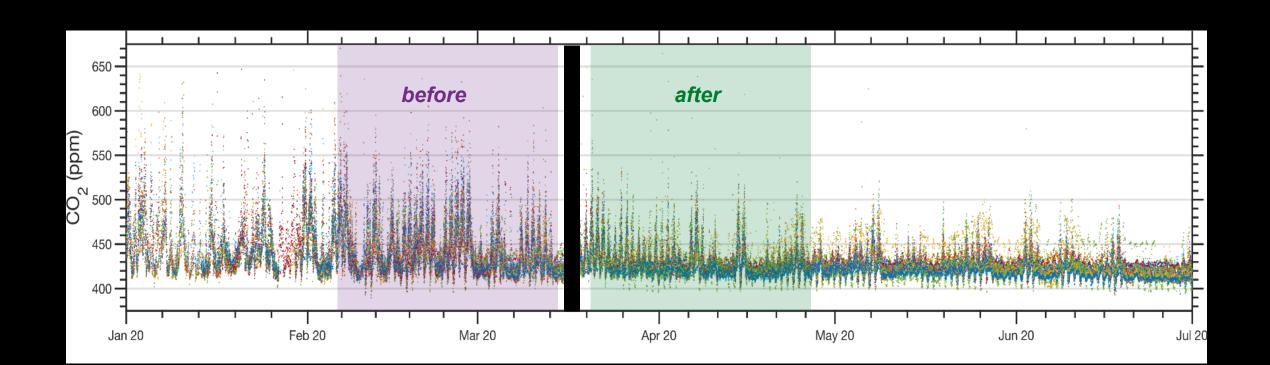
economic, social, and weather **Observations** 

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

Synthesis/iterative improvement

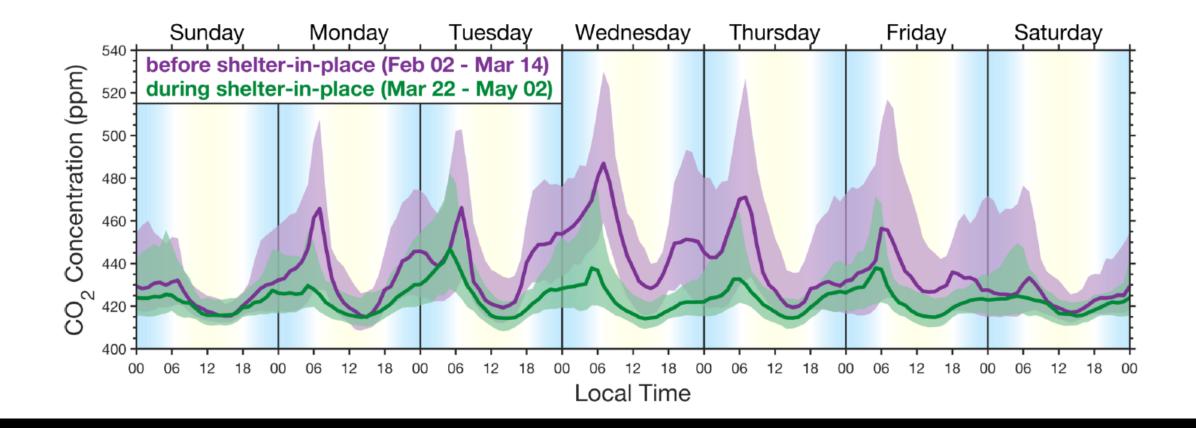
inverse model

#### **BEACO<sub>2</sub>N CO<sub>2</sub> observations SF Bay Area January – July 2020**



http://beacon.berkeley.edu





Turner, et al., Geophys. Res. Lett. doi.org/10.1029/2020GL09003, 2020

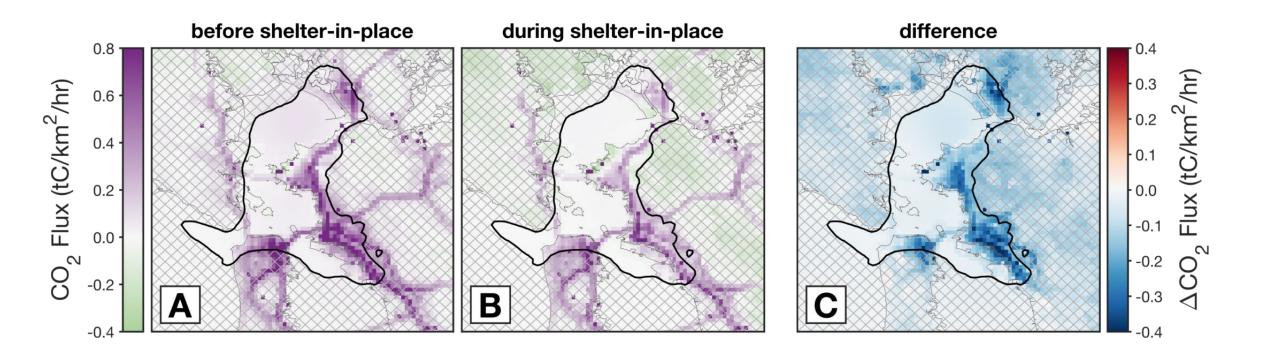
Inverse model leverages synthesizes prior knowledge with observations

$$\hat{\mathbf{x}} = \mathbf{x}_{\mathbf{a}} + (\mathbf{H}\mathbf{B})^T (\mathbf{H}\mathbf{B}\mathbf{H}^T + \mathbf{R})^{-1} (\mathbf{y} - \mathbf{H}\mathbf{x}_{\mathbf{a}})$$

-1

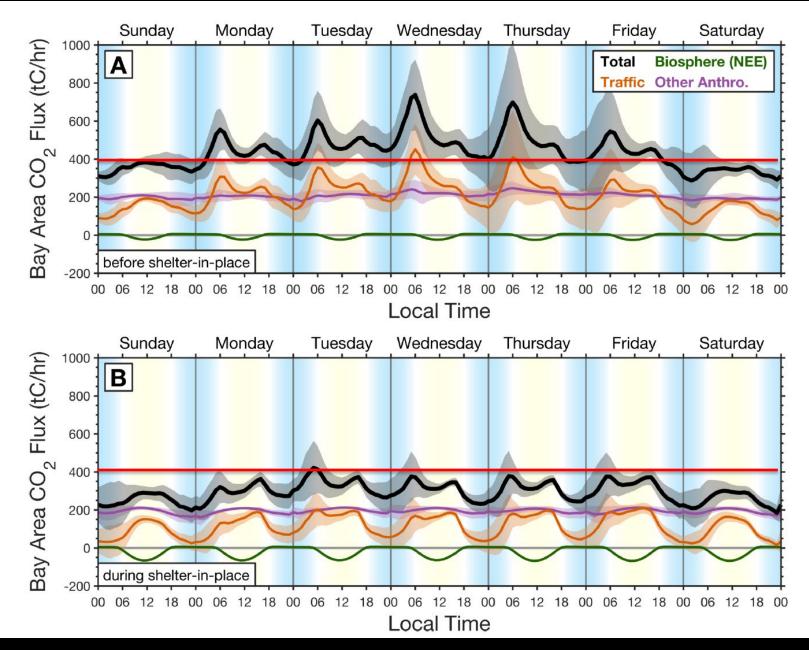


#### **Results on a Map**



- The emissions are best constrained inside the black line
- Largest changes on freeways; implied emissions on city streets changed

### GHG (CO<sub>2</sub>) Emissions from the observations





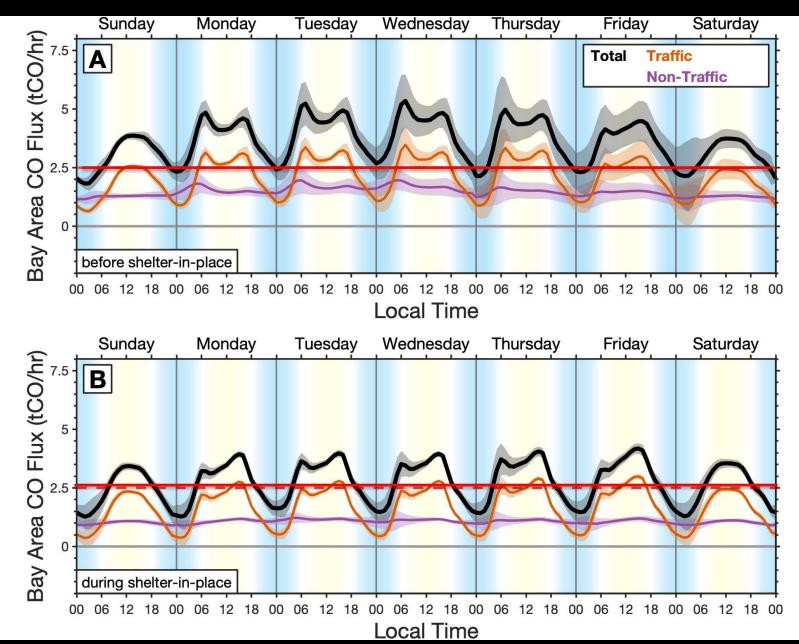
#### 2020

**CO<sub>2</sub> emissions before and after COVID shelter-inplace** 

**25% overall reduction** 

**45% vehicle reduction** 

#### Air Quality (Carbon Monoxide) Emissions from the observations





**2020** 

#### CO fluxes before and after COVID shelter-in-place

**New locations with BEACO<sub>2</sub>N hardware** 

Glasgow, Scotland — 12, soon 25 nodes UC Berkeley and Univ. Strathclyde

Los Angeles — 12 nodes USC, Will Berelson

Leicester, UK — delivered 10 nodes Univ. Leicester, Hartmut Boesch

Providence — 25 nodes Brown Univ., Meredith Hastings

In discussions with several other cities, please join us

## Conclusions

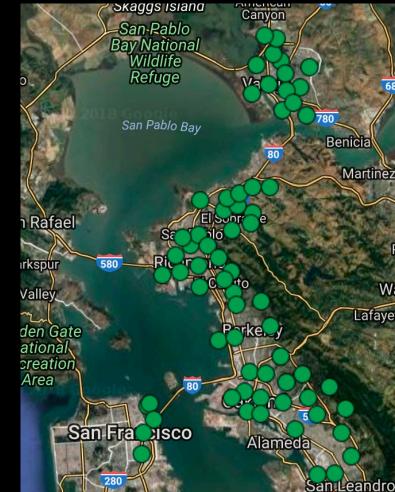
Demonstrated rapid (within months) reporting of  $CO_2$ emissions and changes, attribution of emissions by sector, testing of processes within emission models (e.g. speed), annual changes in vehicle emissions.

Our tools are ready to support these and other key elements of urban GHG reduction plans.

AQ results emerging; tests of cold start models. Connection to  $CO_2$ .



## Thank you!



#### **Catherine Newman**



Alexis Shusterman

Paul Wooldridge





Helen Fitzmaurice Pietro Vannucci



**Jinsol Kim** 

Naomi Asimow

**Kevin Worthington** 





Alex Turner

