

Air Pollution Exposure and Public Health

Needs and Opportunities for Remote Sensing Data Products

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NASA Aerosol and Clouds, Convection, and Precipitation (ACCP)

Air Quality Workshop Environmental Epidemiology

March 18, 2021

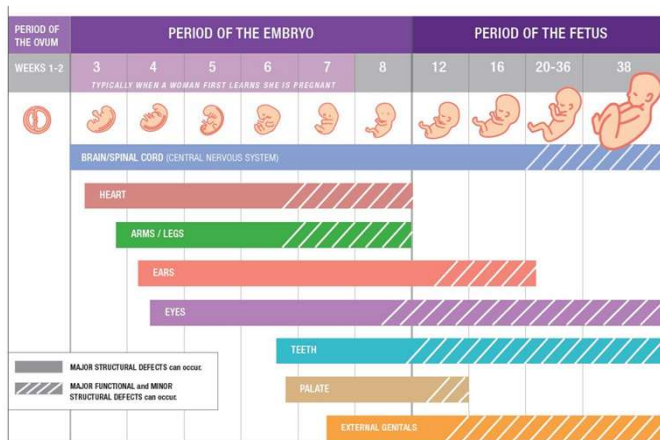
Introduction

- Air pollution is a public health concern
 - Multiple endpoints, acute and chronic
- Generally difficult to assess exposure accurately, efficiently, and at high spatiotemporal resolution in epidemiological studies
 - Air pollution is complex (chemistry/size, phases, sources, mixtures)
 - Humans are complex (mobility, time-activity, behaviors)
- Goal in health studies is to estimate “true, personal” exposure in breathing zone
 - f(outdoor concentrations, human time-activity/mobility, building/home characteristics and indoor sources)
 - Ideally ↓ exposure error to ↑ statistical power to detect true effects

Chronic Disease Conceptual Models

DOHaD HYPOTHESIS

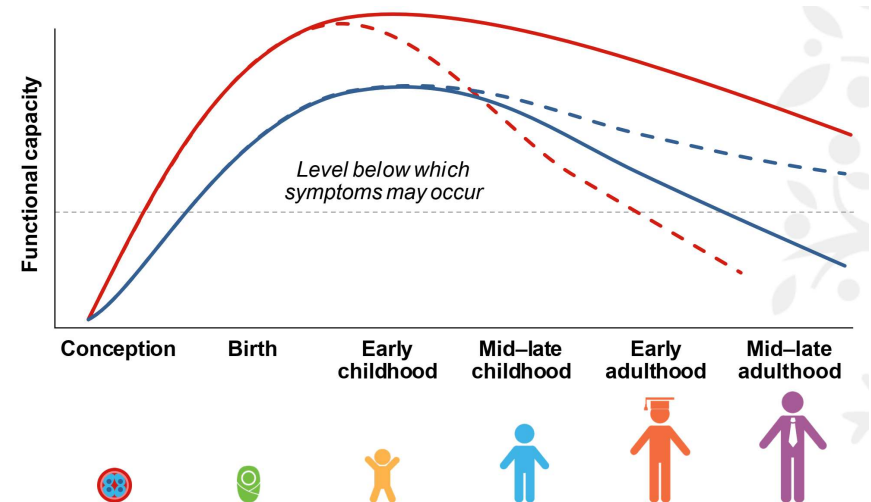
- Critical prenatal/early life developmental periods
- Order of days to weeks



<https://mothertobaby.org/wp-content/uploads/2020/02/Adapted-from-Moore-1993-and-the-National-Organization-of-Fetal-Alcohol-Syndrome-NOFAS-2009.-3.png>

LIFE COURSE FRAMEWORK

- Early environmental exposures can have a lifetime impact
- Order of months to years



https://echochildren.org/wp-content/uploads/2019/03/ECHO_Overview-Slides_Final.pdf

MADRES and ECHO Cohort Studies

- Los Angeles pregnancy cohort, n~1,000, maternal and child health (2015-2025)



<https://madres.usc.edu/>

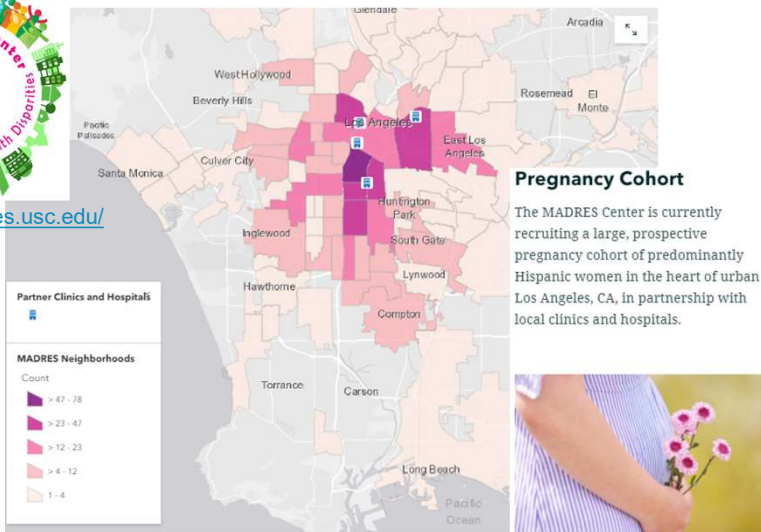
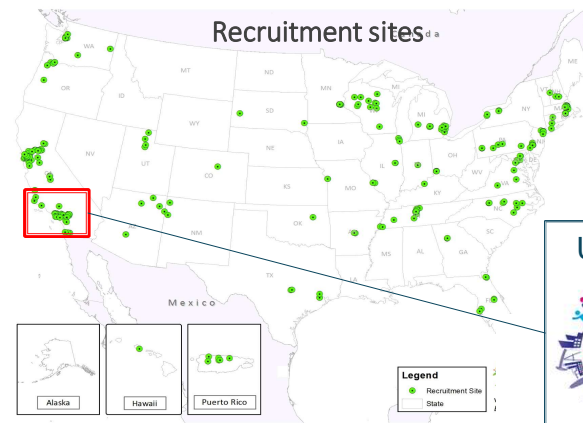


Photo by Ashton Mullins on Unsplash




- Nationwide pediatric cohort, n~50,000, children's health (2016-2023)
- Habre, Co-Chair Geospatial WG



USC participating cohorts



+ Children's Health Study

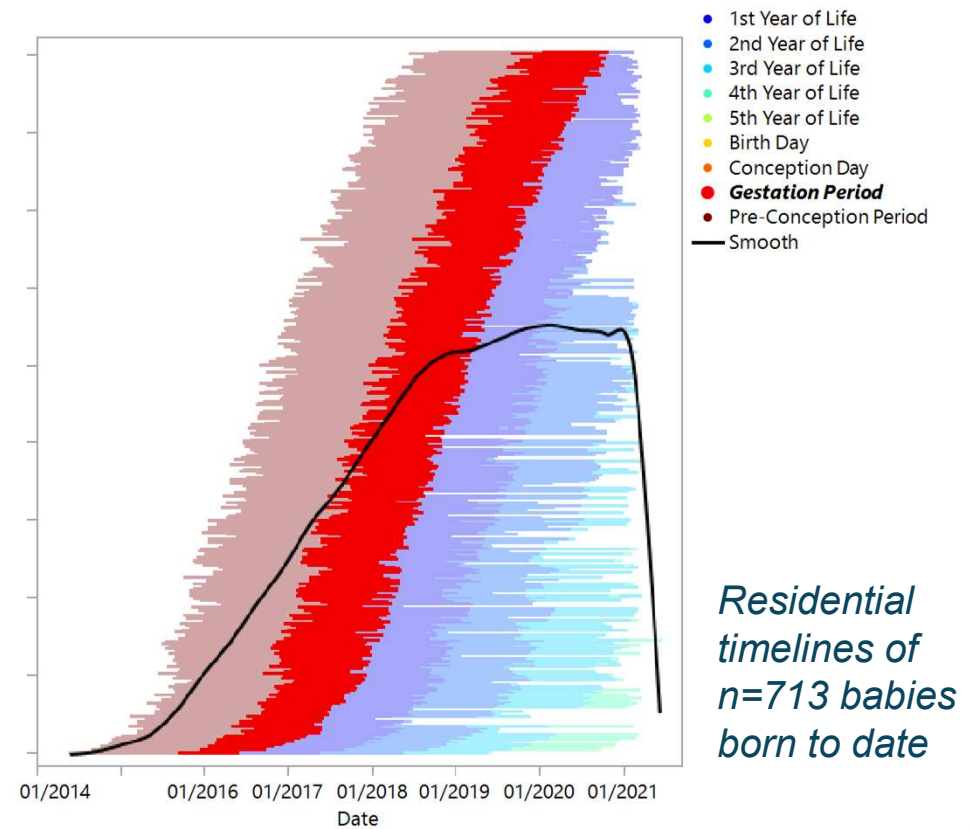
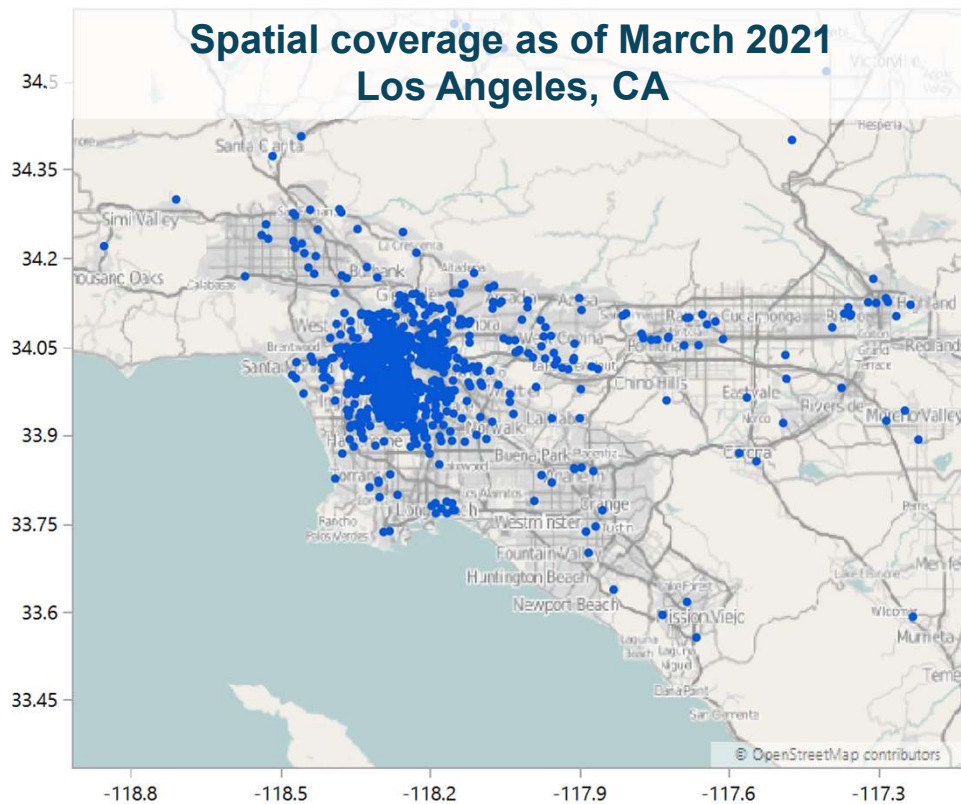



ECHO
Environmental influences on Child Health Outcomes
A program supported by the NIH
<https://echochildren.org/>



MADRES Pregnancy Cohort

Los Angeles, CA, more recent



Motivation for California PM_{2.5} Model

- To investigate PM_{2.5} health effects (total and wildfire-related) in our MADRES and ECHO studies
- Wildfires increasingly frequent and widespread

Environment International 145 (2020) 106143



ELSEVIER

Contents lists available at [ScienceDirect](https://www.sciencedirect.com)

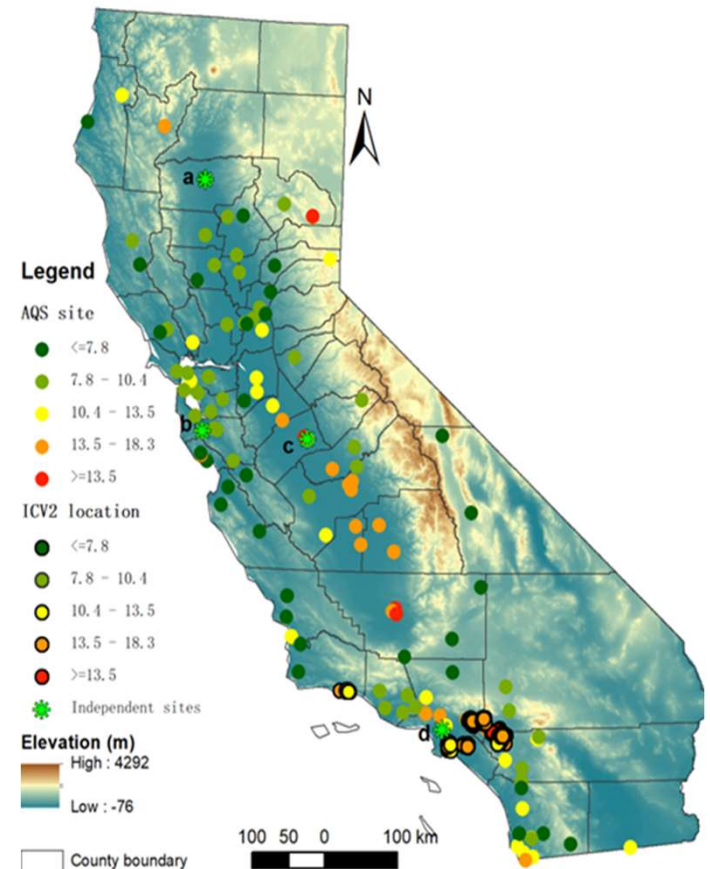
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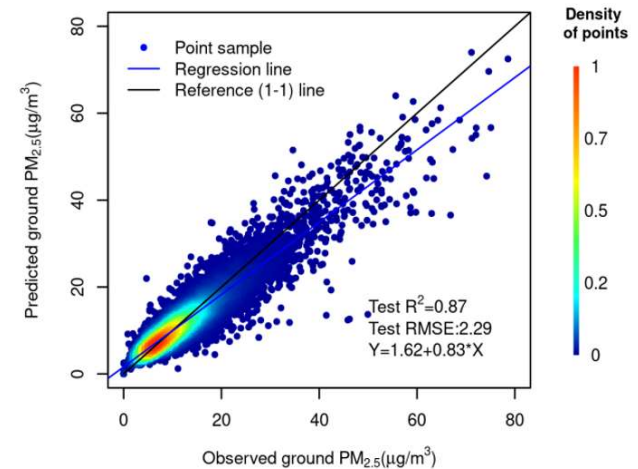
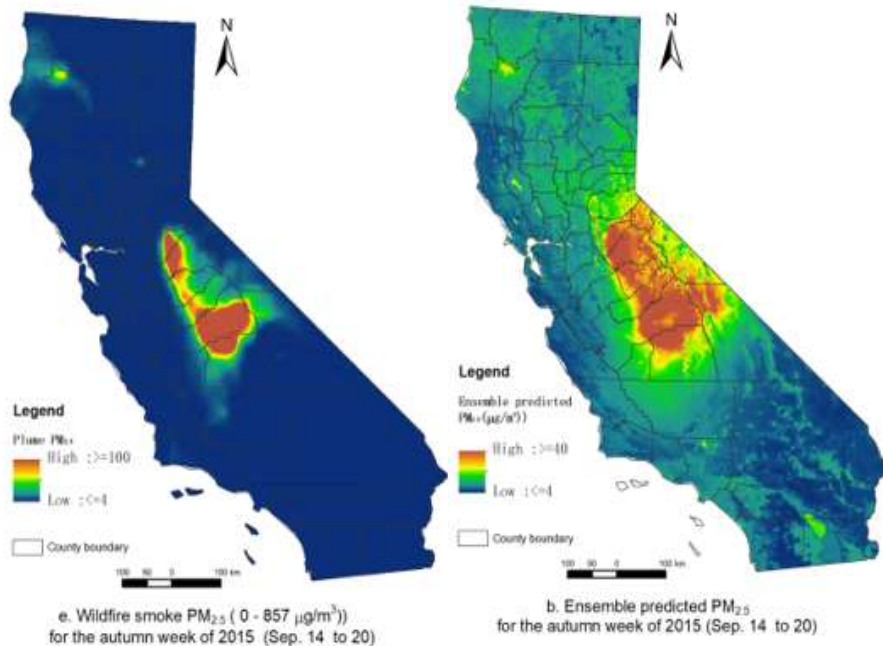
Ensemble-based deep learning for estimating PM_{2.5} over California with multisource big data including wildfire smoke

Lianfa Li^{a,b,*}, Mariam Girguis^a, Frederick Lurmann^c, Nathan Pavlovic^c, Crystal McClure^c, Meredith Franklin^a, Jun Wu^d, Luke D. Oman^e, Carrie Breton^a, Frank Gilliland^a, Rima Habre^{a,*}



Model Overview

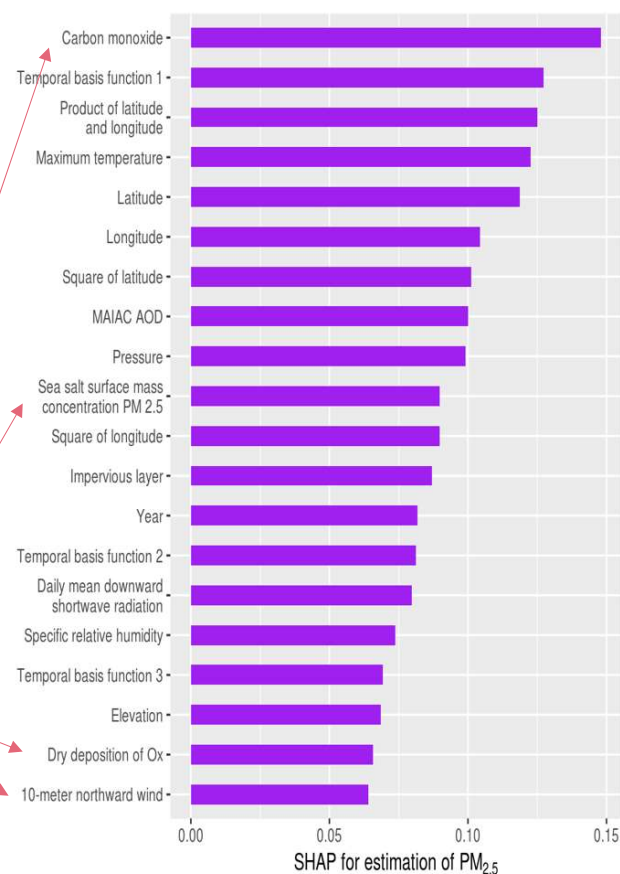
Weekly, 1KM² PM_{2.5} Model, 2008-2017, incorporating Wildfire Smoke Plumes



- Residual autoencoder and ensemble learning
 - Test R^2 0.82, RMSE 2.70 µg/m³
- Measurements, remote sensing, M2GMI, dispersion models of wildfire smoke

Key Contributions of NASA Remote Sensing and Hindcast Simulation Data

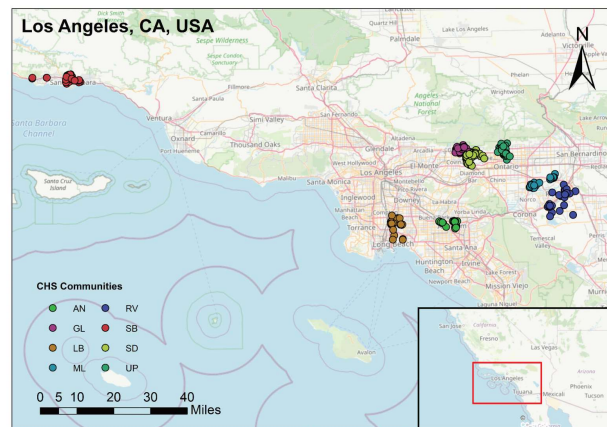
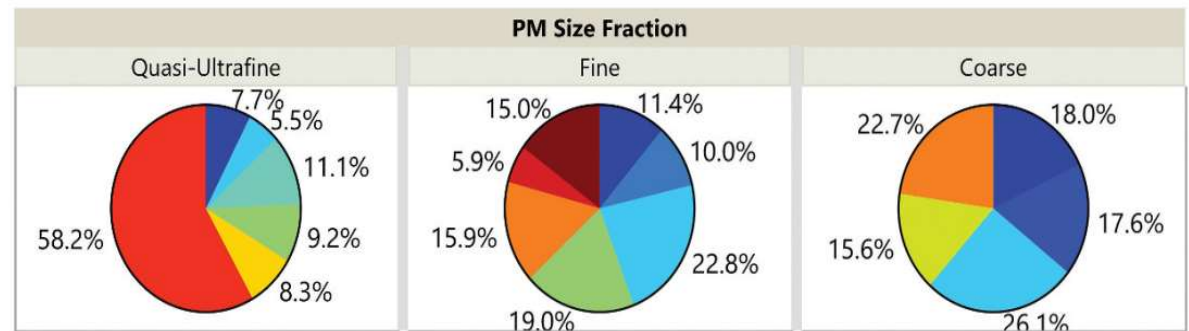
- MAIAC AOD (1km²)
- M2GMI Replay Simulation
 - ~50km² AOD to impute missing MAIAC AOD
 - PBLH for AOD vertical adjustment
 - Wind speeds at 2m, 10m and 50m to calculate indicators of vertical stagnation and wind sheer/mechanical mixing
 - Gases and PM_{2.5} aerosol types in surface layer, highly important features



Feature importance across 100 ensembles

PM Composition and Sources

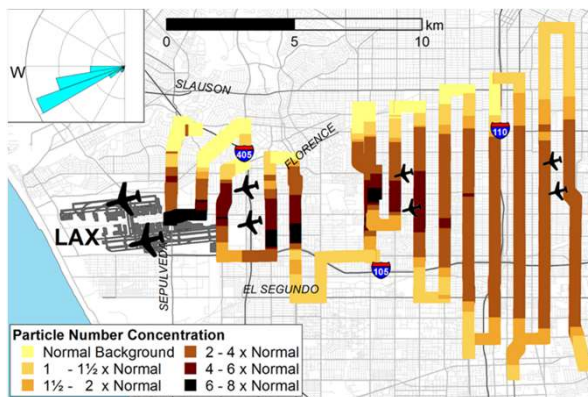
- Drive toxicity and health effects
- Size distribution
- Urban sources
 - Tailpipe and non-tailpipe traffic
 - Airport-related UFPs



- Source
- Abrasive Vehicular Emissions
 - Ammonium Nitrate
 - Ammonium Nitrate/Ammonium Chloride
 - Ammonium Sulfate
 - Biomass Burning
 - Crustal
 - Crustal (Fertilized)
 - Fuel Oil
 - Sea Salt
 - Traffic
 - Traffic (Diesel)
 - Traffic (Gasoline)

Figure 1. Map of CHS southern California communities participating in the ICV2 sampling campaign (AN = Anaheim, GL = Glendora, LB = Long Beach, ML = Mira Loma, RV = Riverside, SB = Santa Barbara, SD = San Dimas, UP = Upland).

Airport-related UFPs, Acute Effects



Hudda et al. (2014), *Environmental Science & Technology*, 48(12), 6628–6635.

Environment International 118 (2018) 48–59

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journal homepage: www.elsevier.com/locate/envint

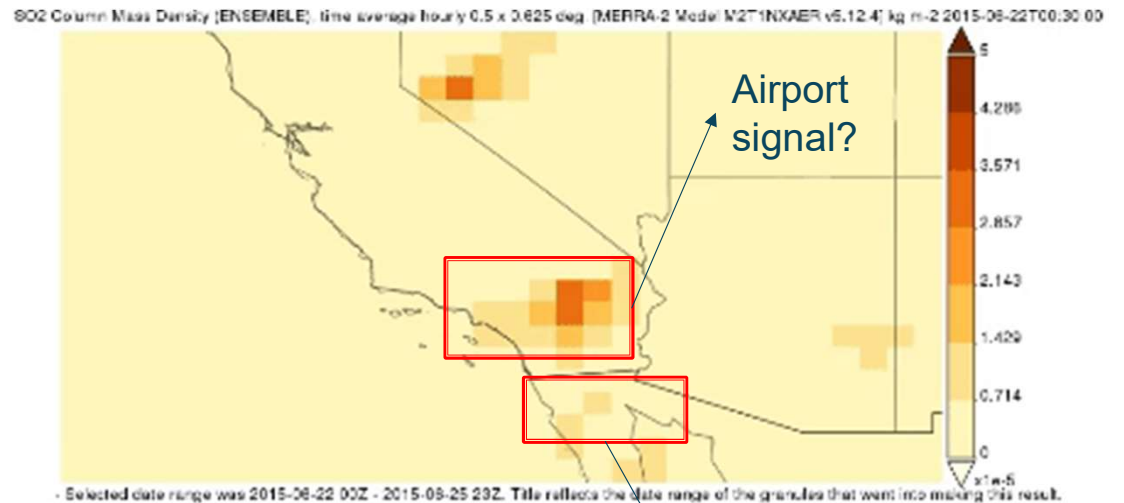


Short-term effects of airport-associated ultrafine particle exposure on lung function and inflammation in adults with asthma

Rima Habre^{a,*}, Hui Zhou^a, Sandra P. Eckel^b, Temuulen Enebish^a, Scott Fruin^a, Theresa Bastain^a, Edward Rappaport^a, Frank Gilliland^a



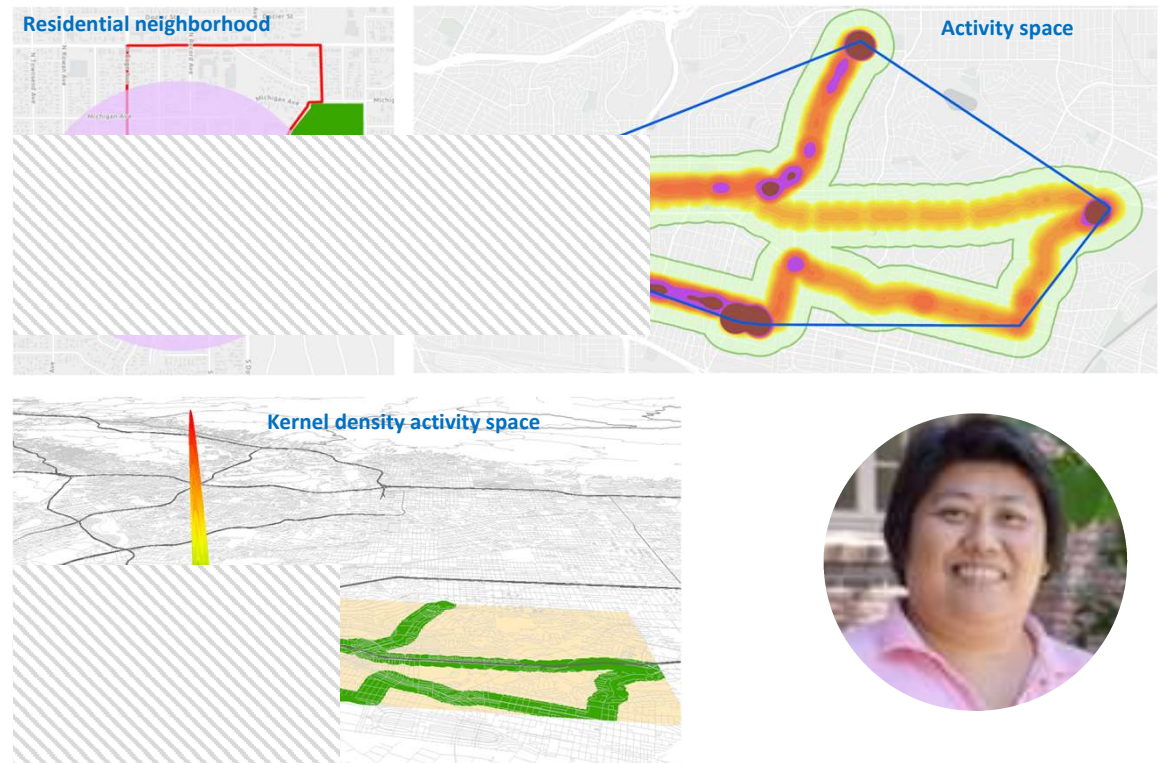
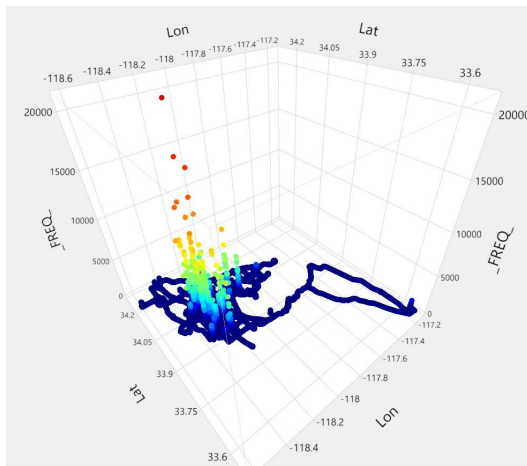
SO₂ column mass density from MERRA-2 over southern CA, few days in 2015



Diesel trucks/goods movement signal?

Future Directions...

- Incorporating mobility and activity spaces into air pollution exposure assessment



Yan Xu, PHP doctoral candidate

Paired with Personal PM_{2.5} Monitoring

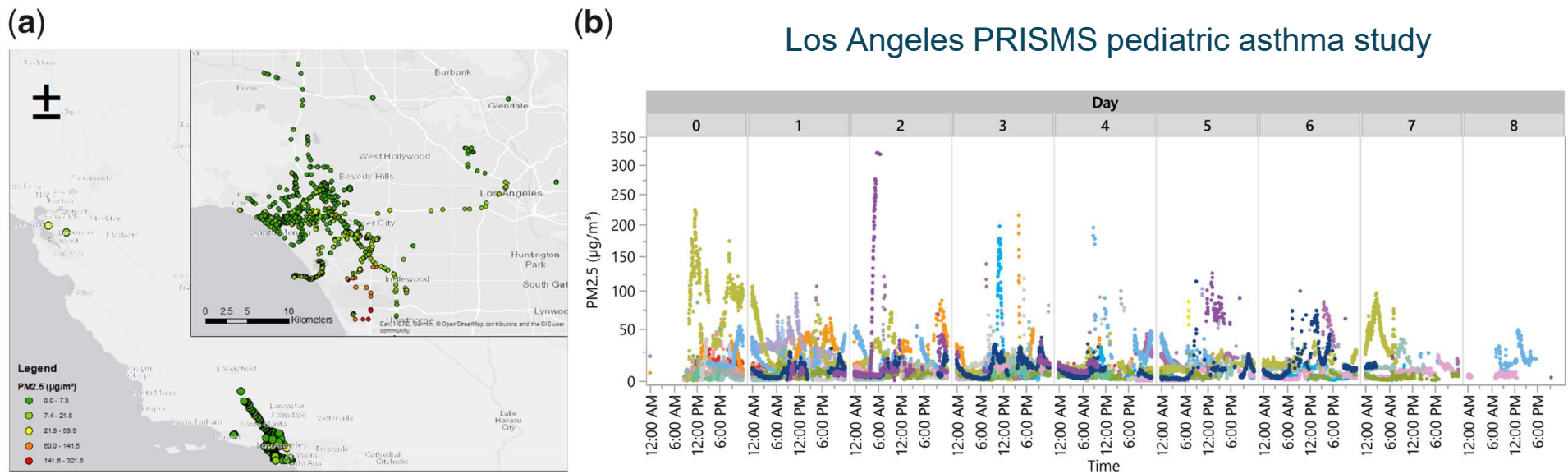


Figure 5. Examples of data collection from BREATHE. (A) Map of GPS trajectories across all subjects, correlated with 1-min PM_{2.5} concentrations. (B) Temporal variation in personal PM_{2.5} concentrations colored by subject. BREATHE: Biomedical REAL-Time Health Evaluation; GPS: global positioning system; PM: particulate matter.

Bui et al, *JAMIA Open*, 3(2), 2020

<https://youtu.be/6y0tzsfApw4>

Summary

- Air pollution exposure and health research needs
 - Composition, size distribution, mixtures!
 - Remote sensing data products, especially hindcast simulations (gas and aerosol), incredibly useful
 - Enhance/expedite exposure modeling work, minimize lag time
 - Spatiotemporal coverage key (simulations)
 - Spatiotemporal resolution
 - Daily to hourly temporal resolution important for understanding acute effects
 - Spatial resolution increasingly important considering human activity spaces
 - Vertical resolution

Thank You

- habre@usc.edu
- LA DREAMERs USC ECHO Center
 - MPIs Breton, Bastain, Farzan, Habre
 - NIH UH3OD023287
- MADRES Center
 - MPIs Breton and Bastain
 - NIMHD/NIEHS P50MD015705
- Los Angeles PRISMS Center
 - PI Bui
 - U54EB022002



Visit our story map to learn more about
MADRES!

<https://arcg.is/1y8KHn>

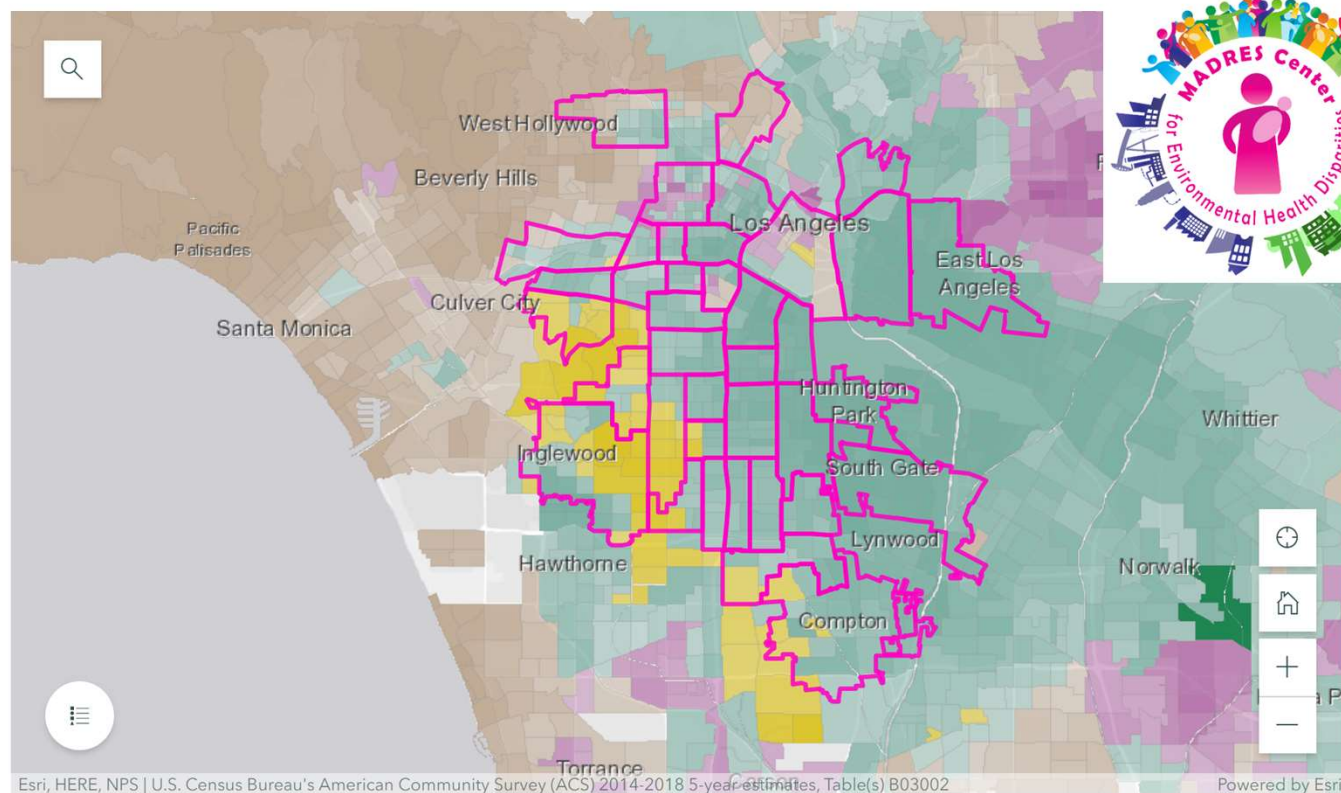
MADRES Center of Excellence on Environmental Health Disparities Research

MADRES Neighborhoods

MADRES participants live in predominantly Hispanic and African American communities in Los Angeles, CA.



Photo by [Viviana Rische](#) on [Unsplash](#)

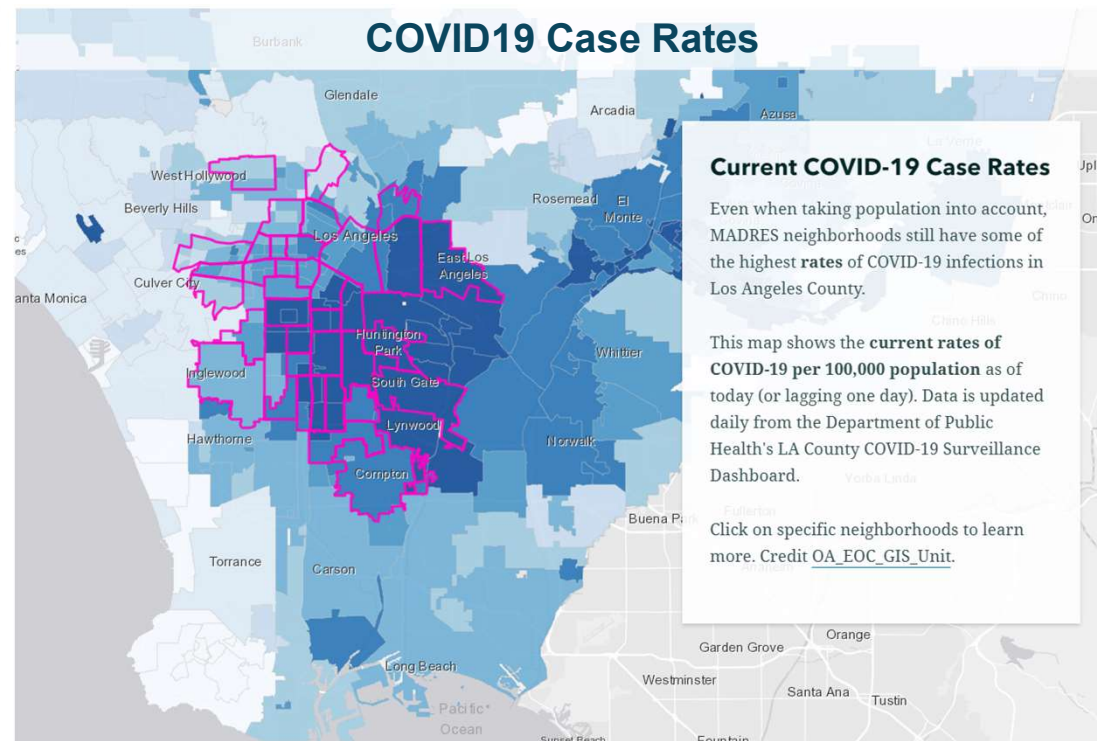
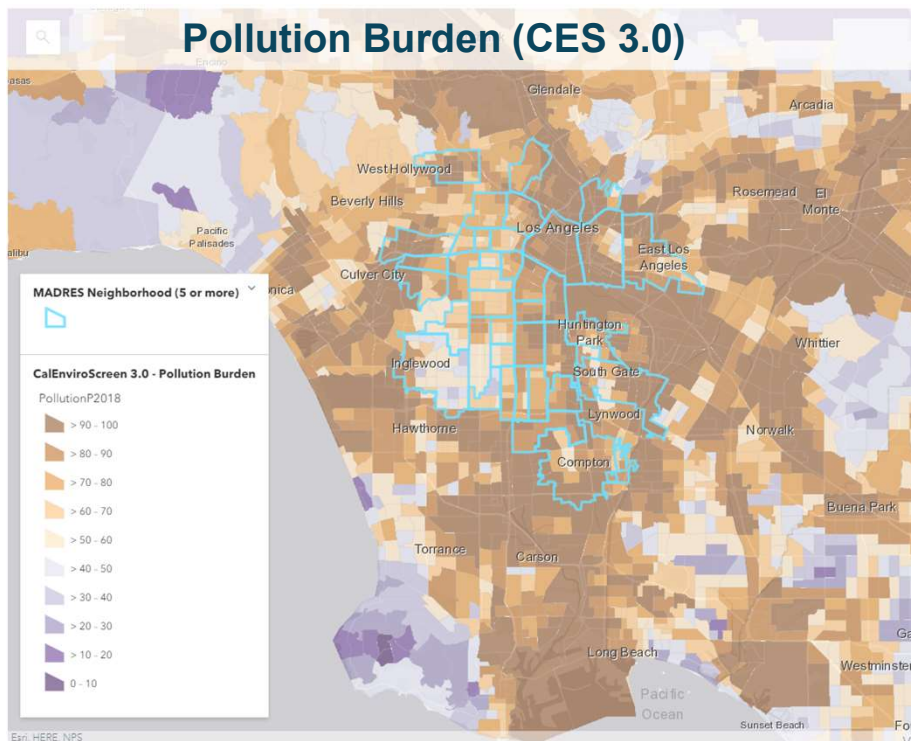


Visit this story map to learn more!



<https://arcg.is/1y8KHn>

Disproportionate Exposure to Pollution and Higher Susceptibility



Visit this story map to learn more!



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