



# Environmental Health, Racial/Ethnic Health Disparity, and Climate Impacts of Inter Regional Freight Transport in the United States

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- Funding: U.S EPA: Center for Air, Climate, and Energy Solutions (CACES)



CACES

# Research question

If a unit mass of freight is shipped from an origin to a destination, how do impacts on human health, climate, and exposure/human health disparity vary by mode of travel?



~30,000 routes



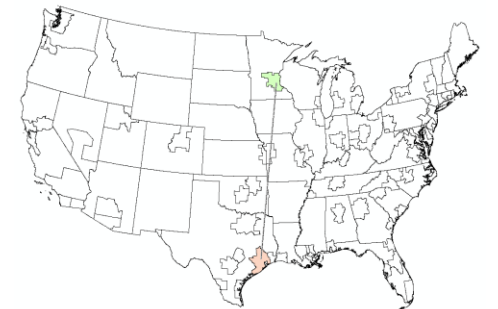
**Heavy-duty Truck**



**Rail**



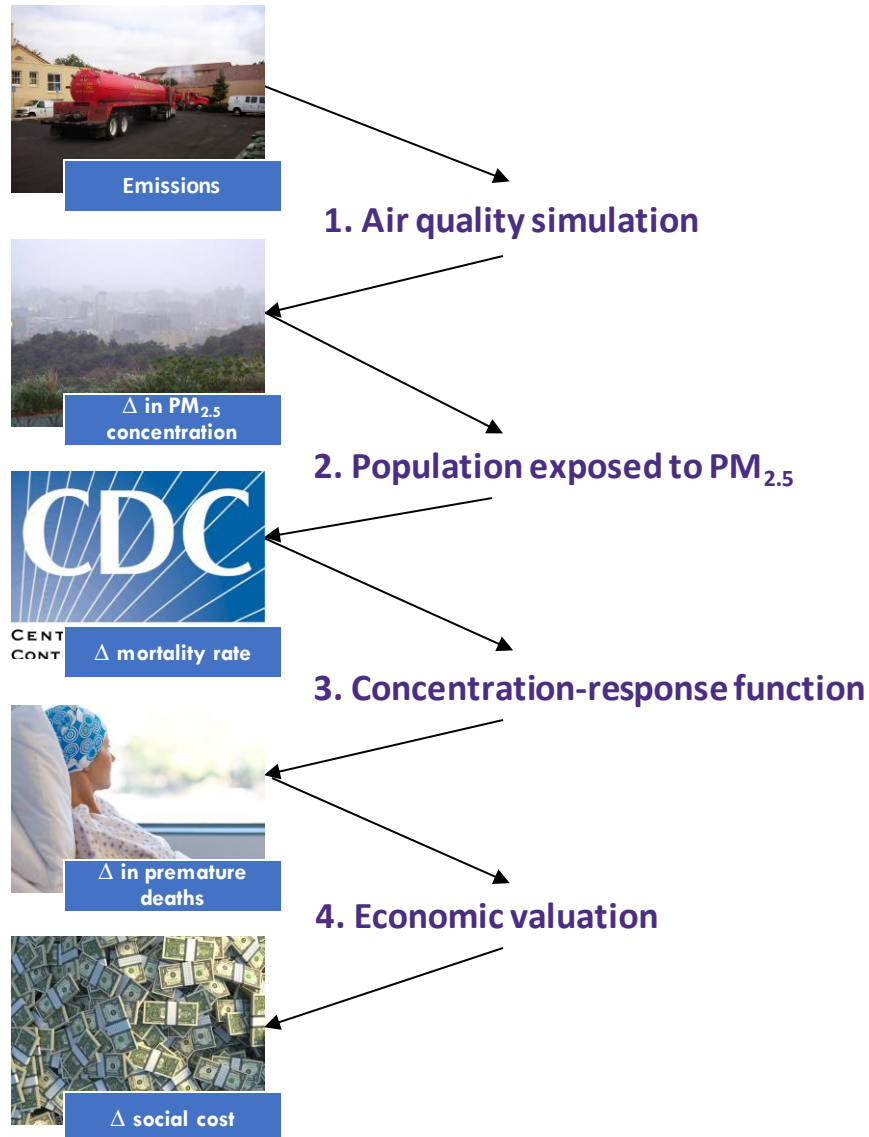
**Barge**



**Aircraft**

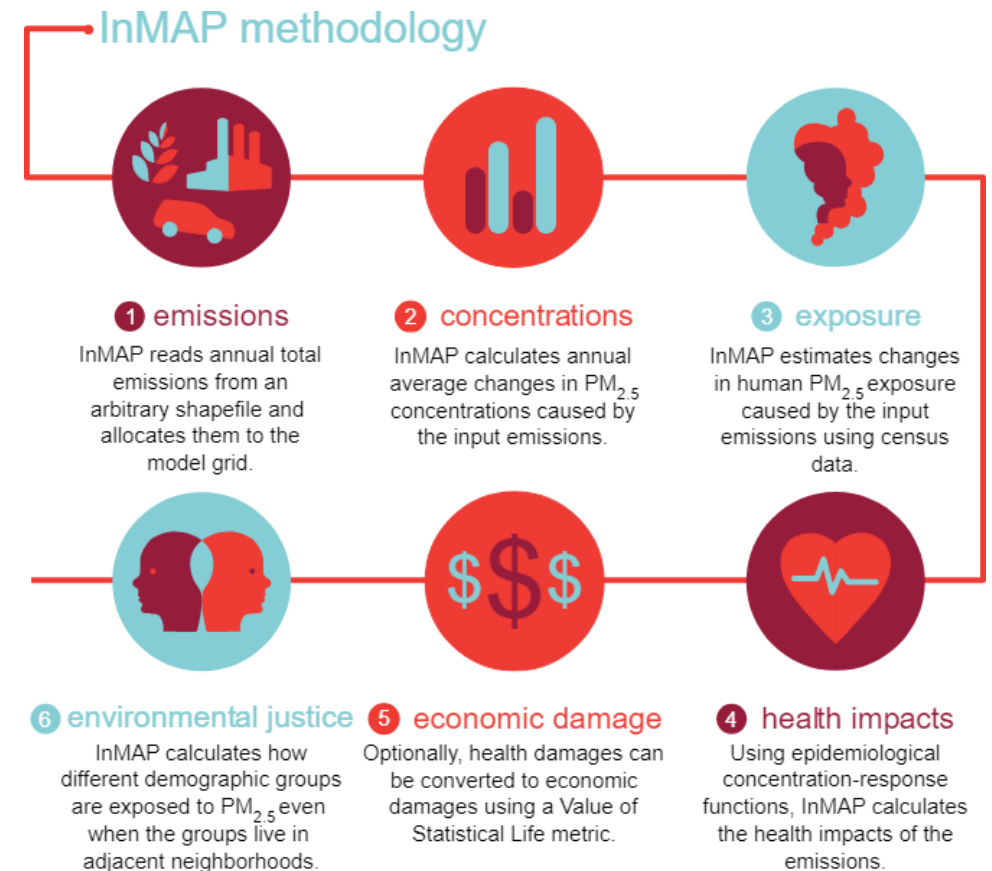
# Method: reduced-complexity, high spatial-resolution AQ model for annual average $PM_{2.5}$

- Mechanistic modeling approach



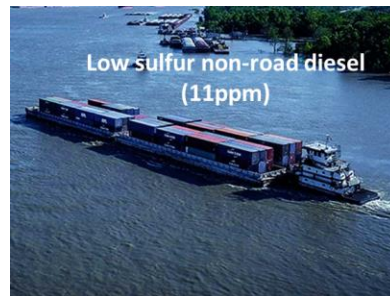
## Interventional Model for Air Pollution (InMAP)

Tessum, C. W.; Hill, J. D.; Marshall, J. D. InMAP: A model for air pollution interventions. PLoS ONE 2017, 12 (4)

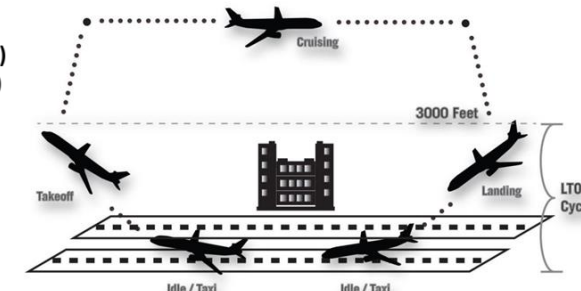


# Emissions input to InMAP

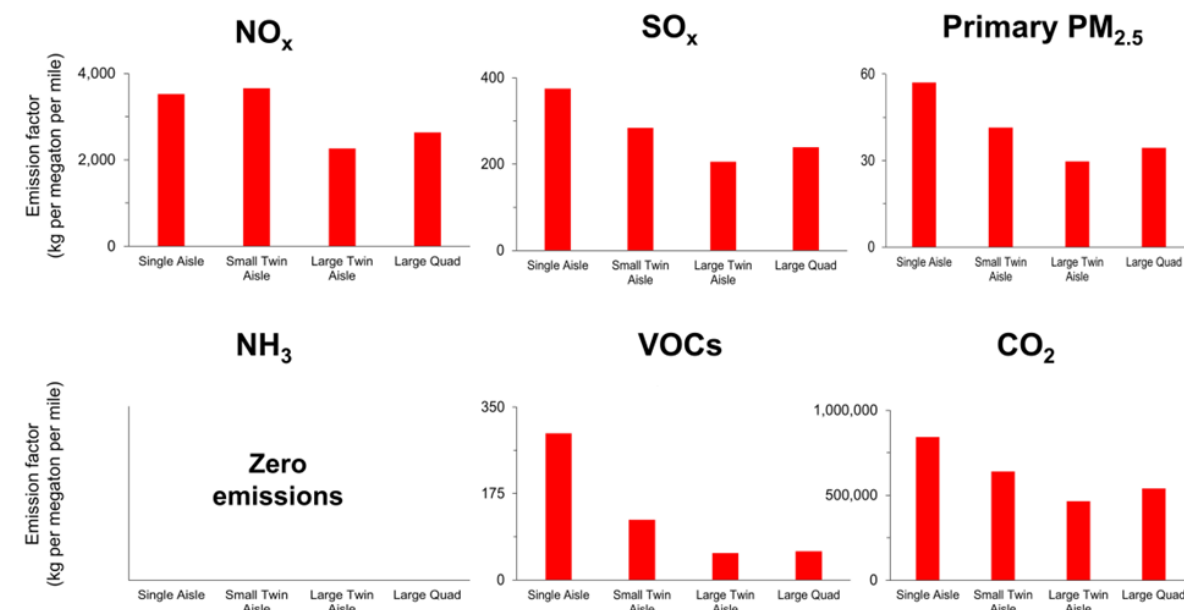
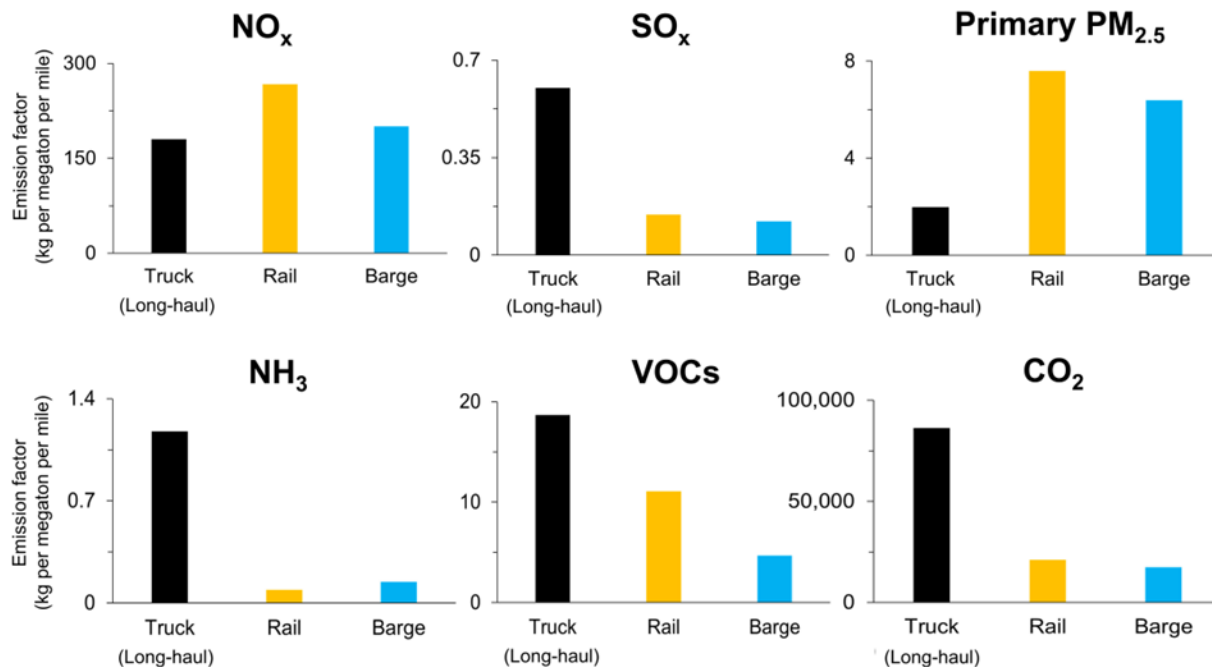
## Non-aircraft modes



## Aircraft

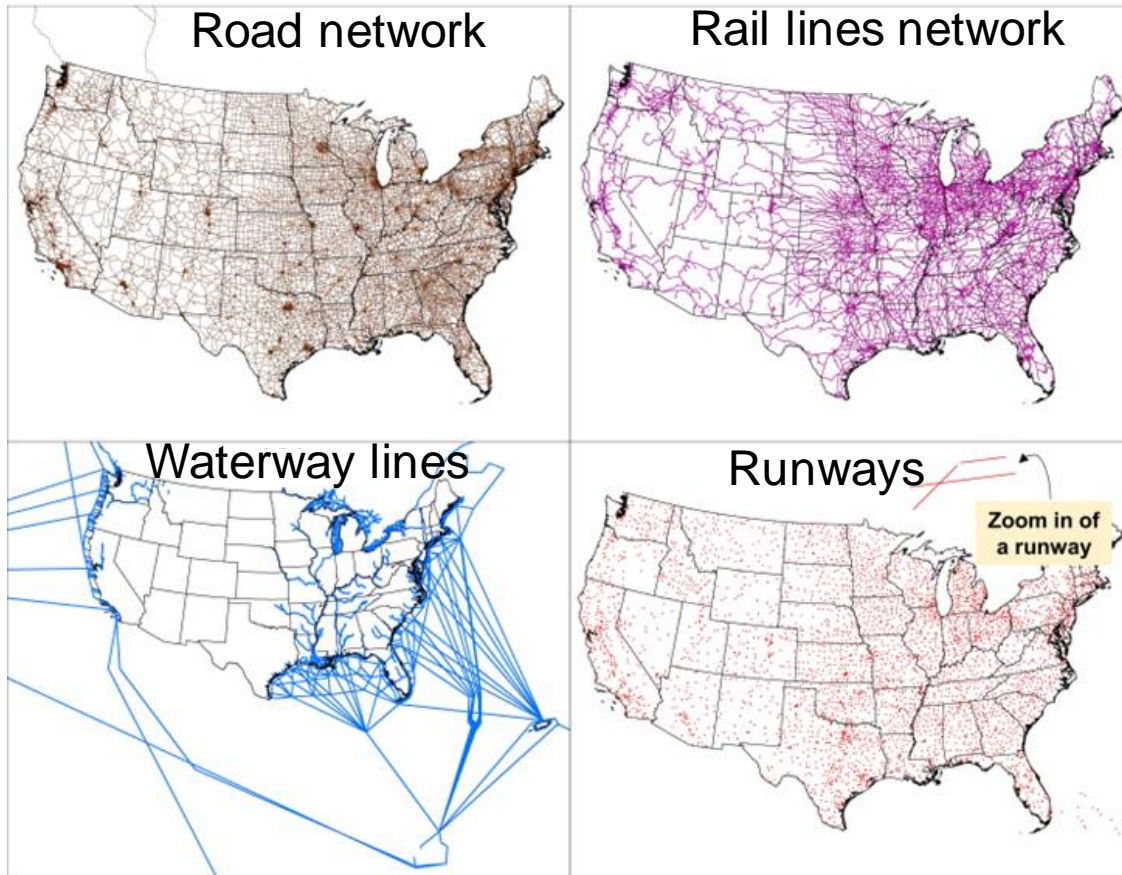


Source: ICAO

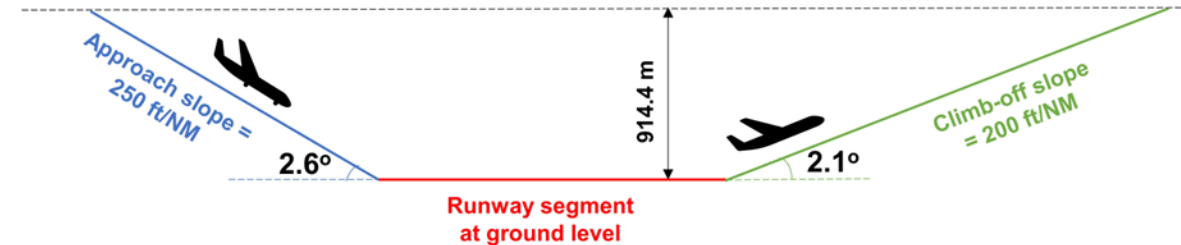
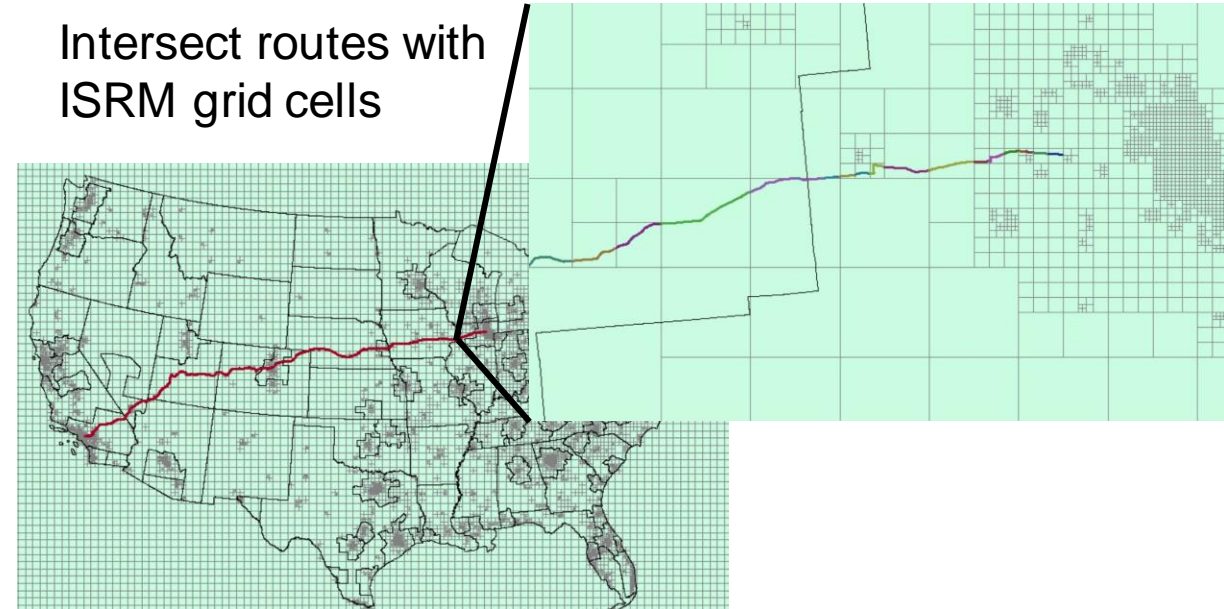


## Cruise emission factors

# Geospatial allocation of emissions to routes



Source: U.S. DOT's National Transportation Atlas Databases (NTAD)

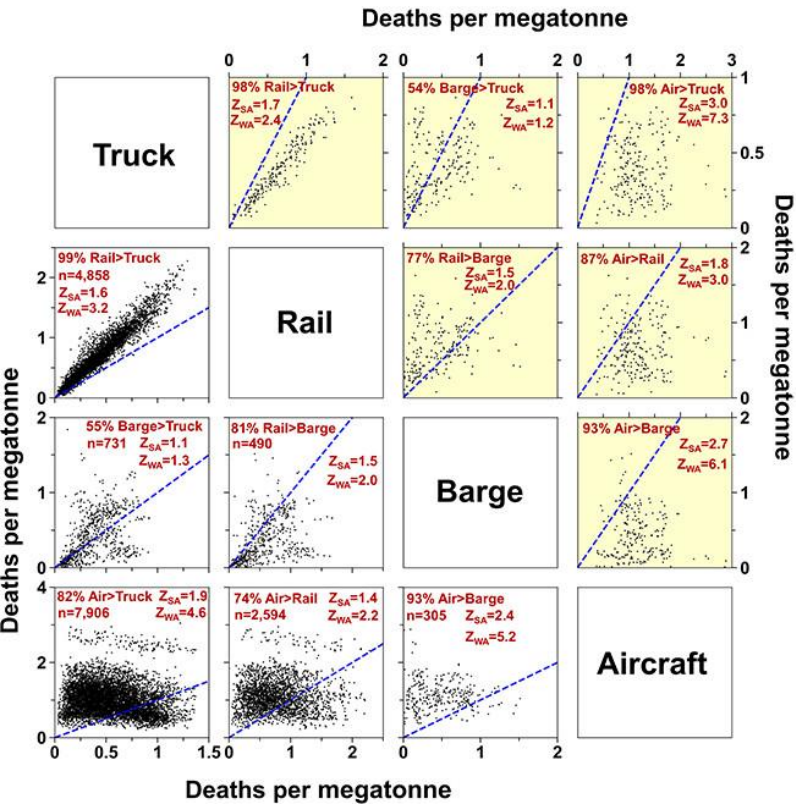


Side projection of simplified Landing and Take-off cycle

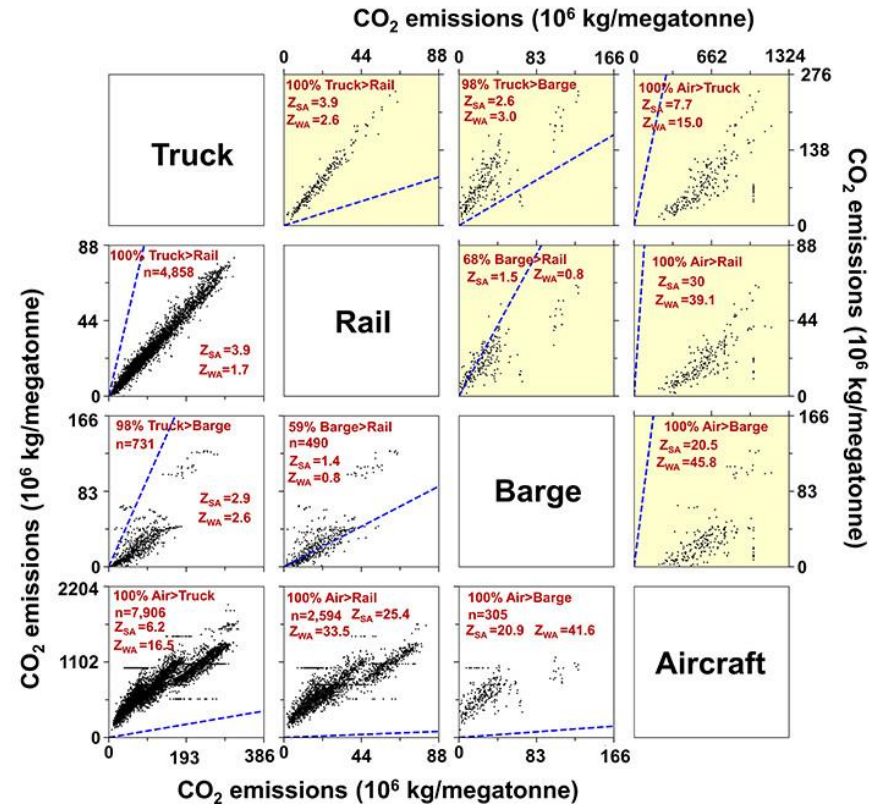
# Results

# Pairwise impacts from each origin–destination (O–D) pair

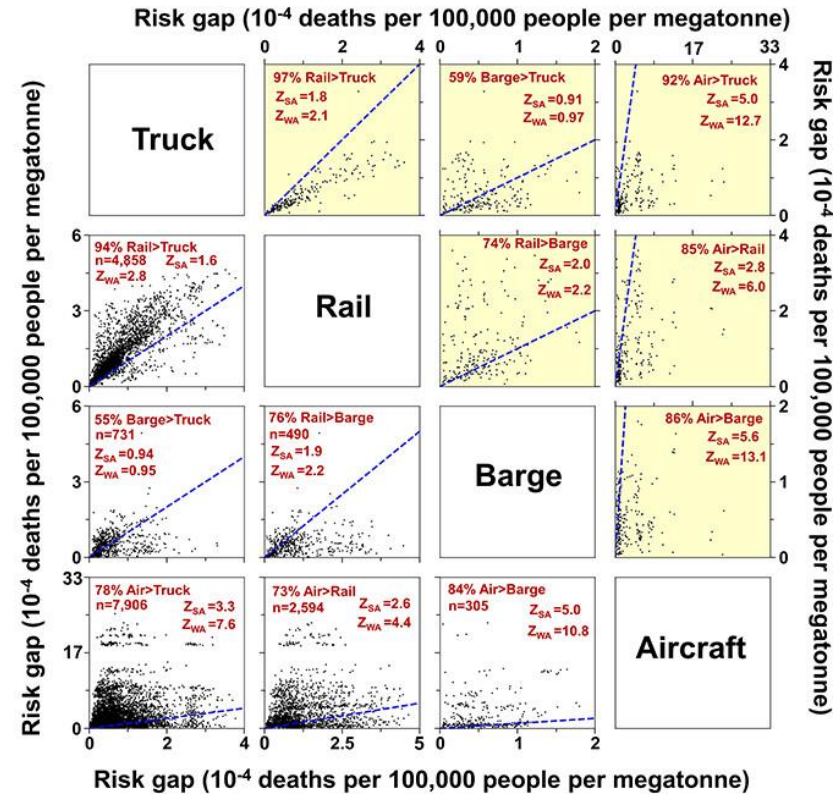
## Deaths per megatonne



## Kg CO<sub>2</sub> emissions per megatonne

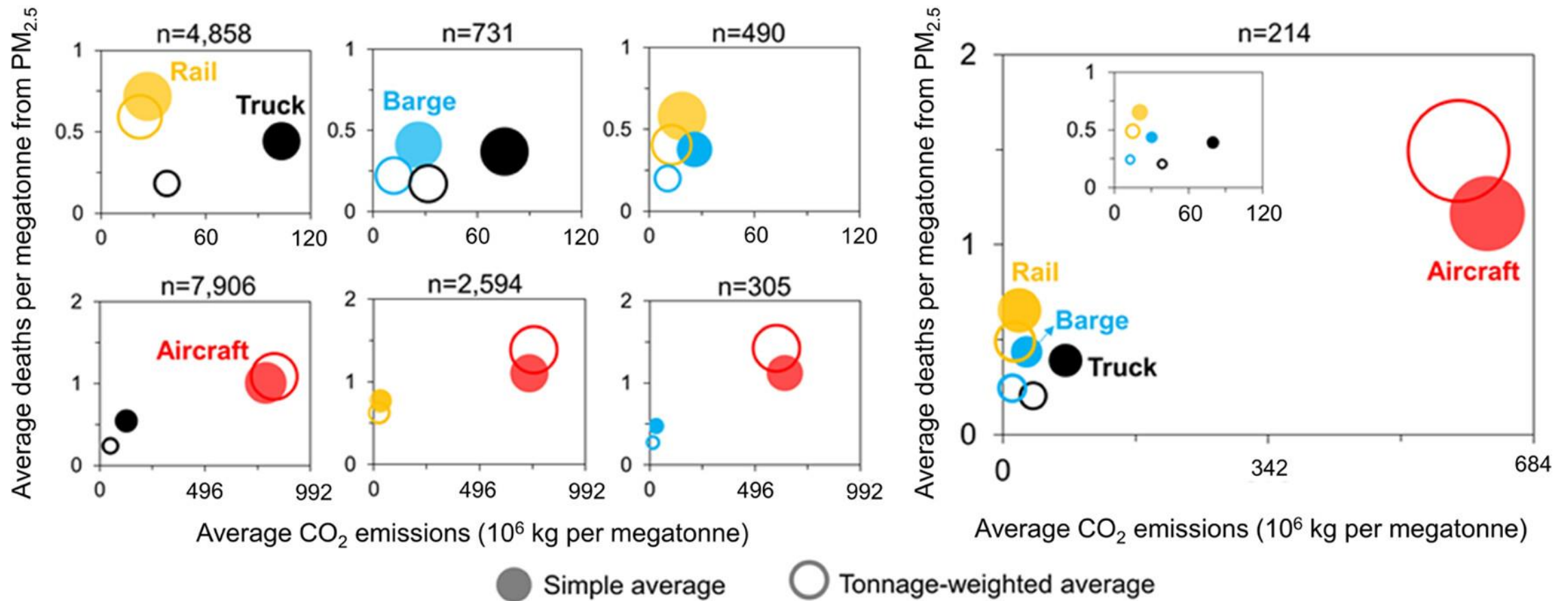


## Risk gap per megatonne





# Comparison among modes



# Urban vs rural

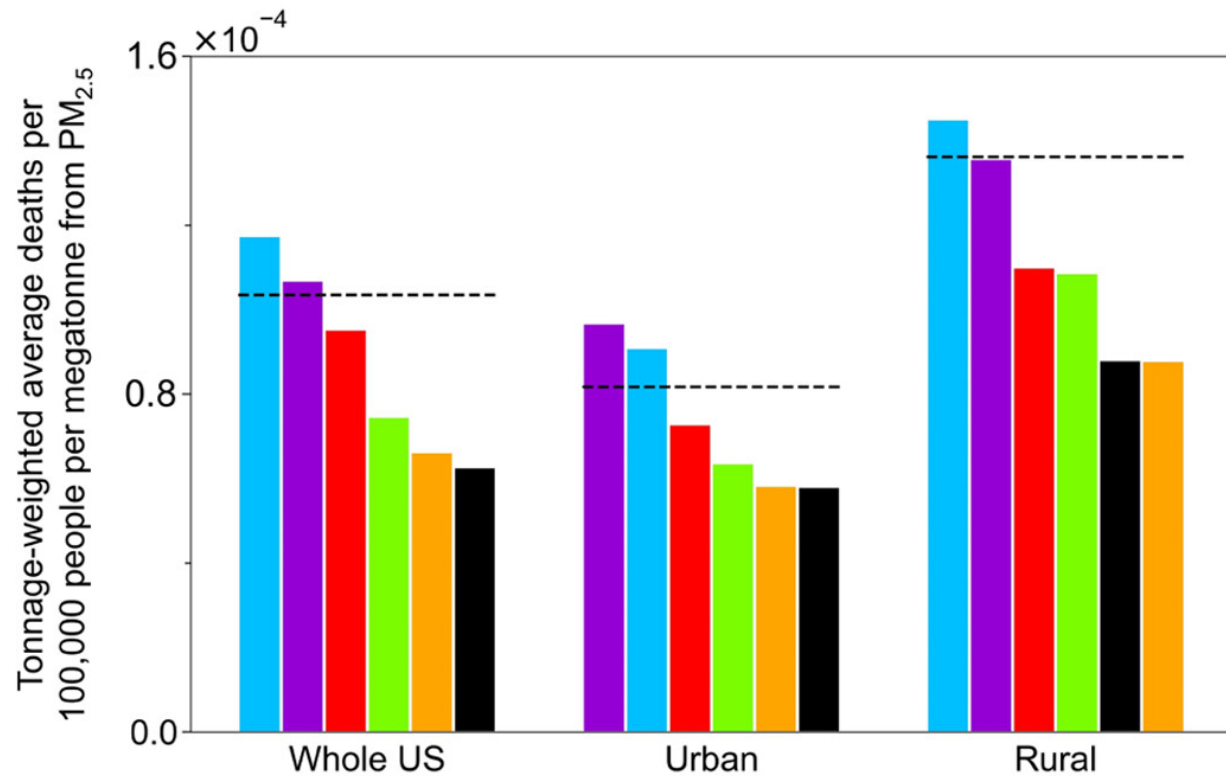
		deaths per megatonne <sup>a</sup>			<sup>b</sup>
mode	<i>n</i> (number of O–D pairs)	urban	rural	combined	percentage urban-impact routes (%) <sup>b</sup>
truck	16,293	0.27	0.30	0.57	32
rail	4875	0.37	0.42	0.79	32
barge	732	0.19	0.26	0.45	19
aircraft	7913	0.72	0.40	1.11	85

<sup>a</sup>Overall average for that mode (“combined”), subdivided into impacts to urban and rural populations. Values reflect, where the impacts occur (urban versus rural), attributable to total emissions. Numbers given here might not sum because of rounding.

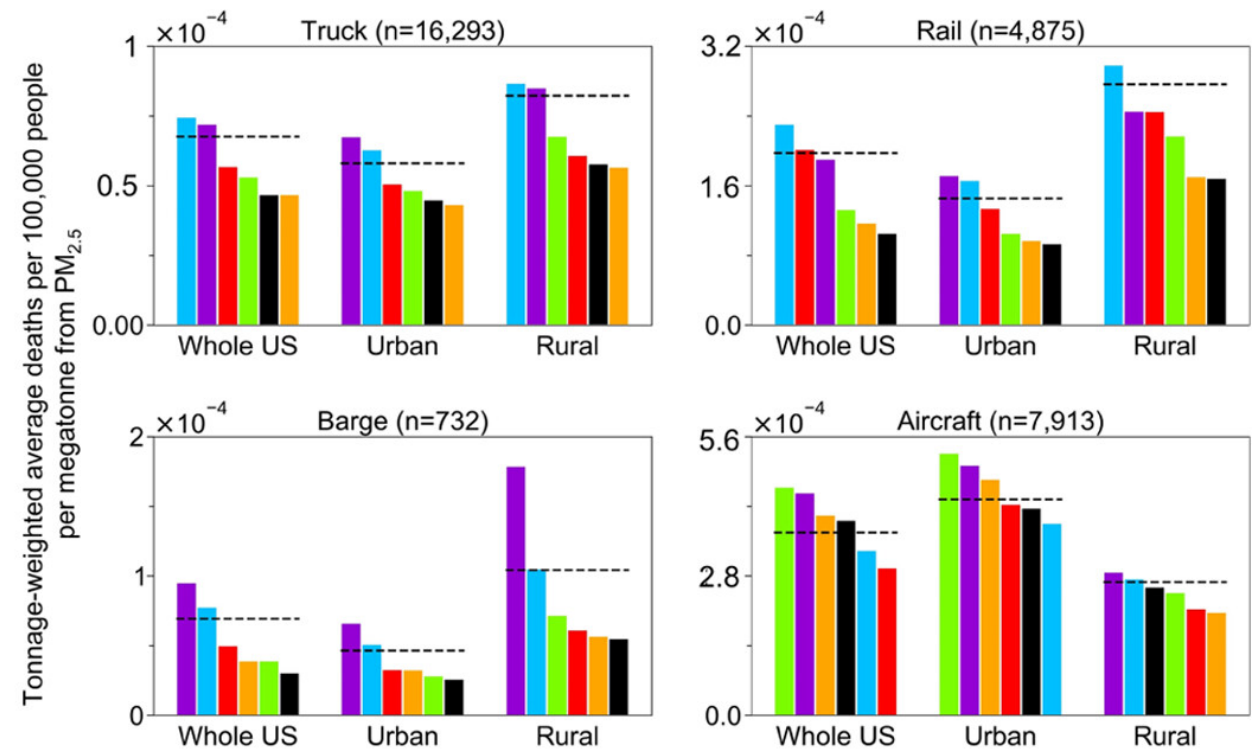
<sup>b</sup>Percent of O–D pairs for which health impacts are greater in urban than in rural areas.

# PM<sub>2.5</sub> health impacts by race-ethnicity

## From all freight movement



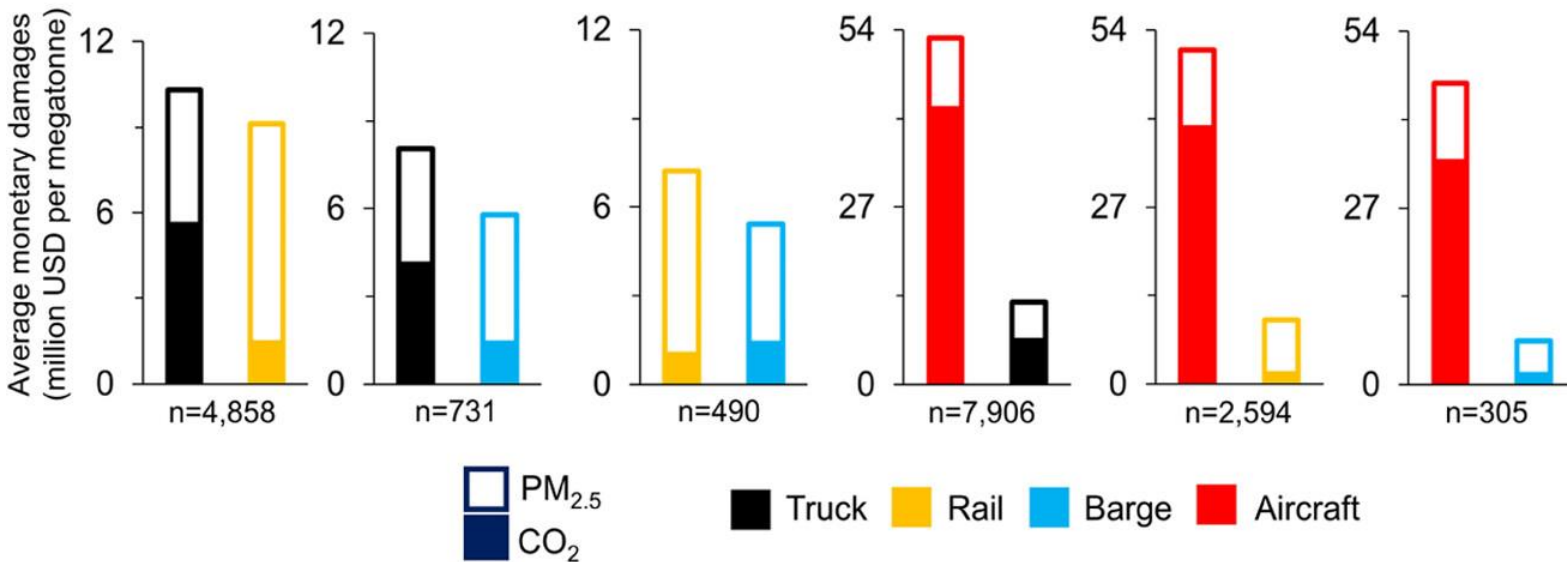
## By mode



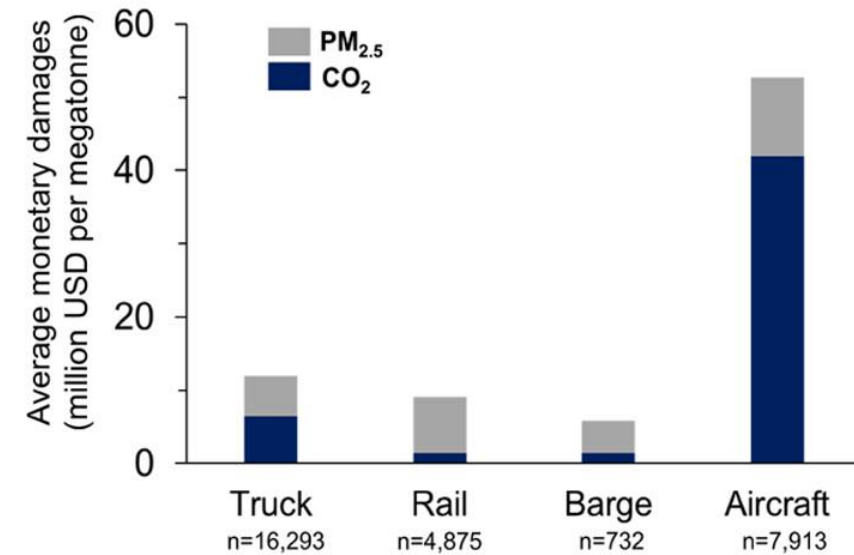
# Monetized damages

CO<sub>2</sub> social cost: \$54 per tonne CO<sub>2</sub>, VSL: \$9.7 million

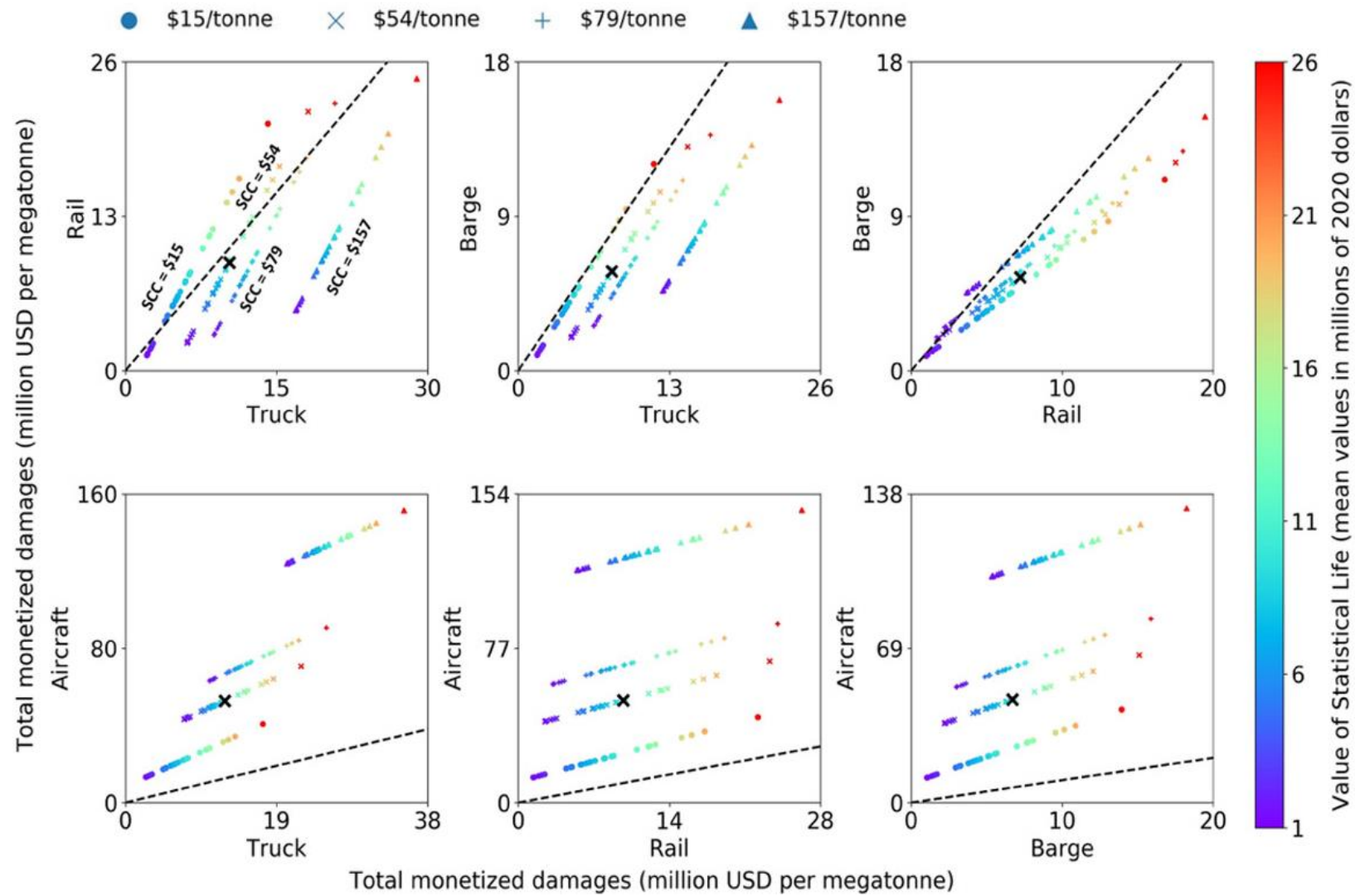
Pairwise comparison



from all routes for a mode

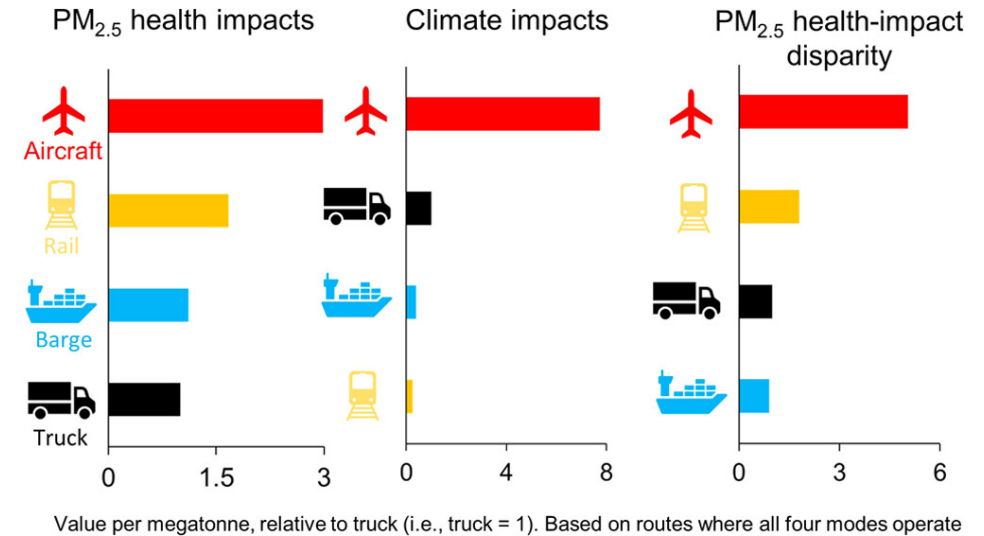


# Sensitivity analysis of monetized results



# Conclusions

- Airplane > train > barge/truck (health)
- Health / EJ / climate
- Importance of urban / peri-urban freight
  - Greater EJ concern; more opportunities for solutions, e.g., electrification
- Future work:
  - Community groups; not just air pollution
  - Technical “solutions” (vehicles/EVs; placement of distribution centers; vehicle-routing)



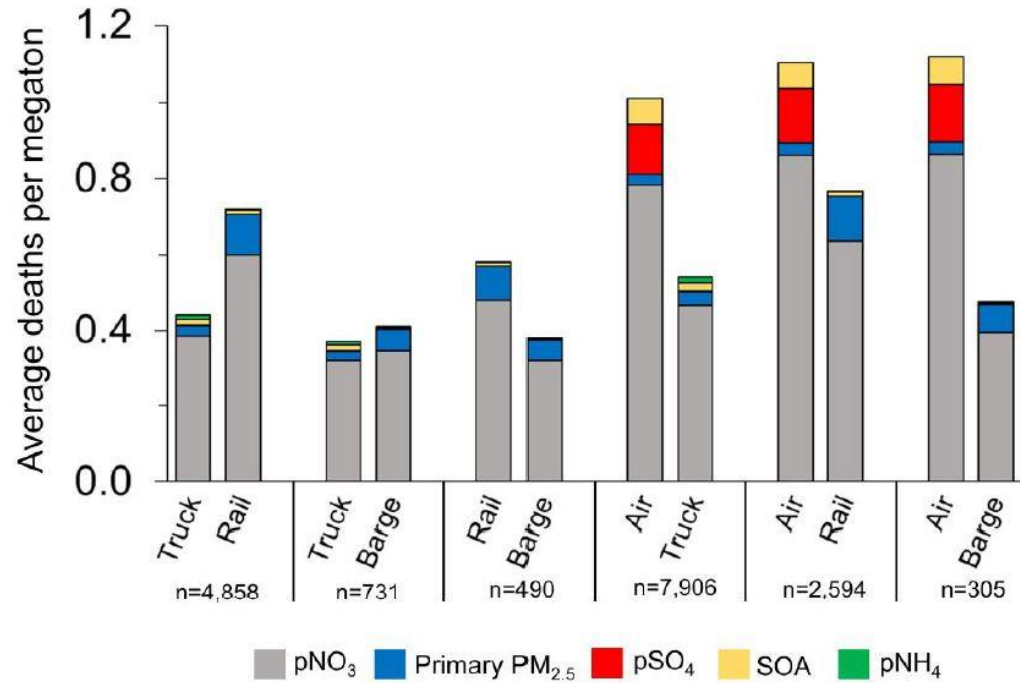
**THANK YOU!**

**QUESTIONS?**

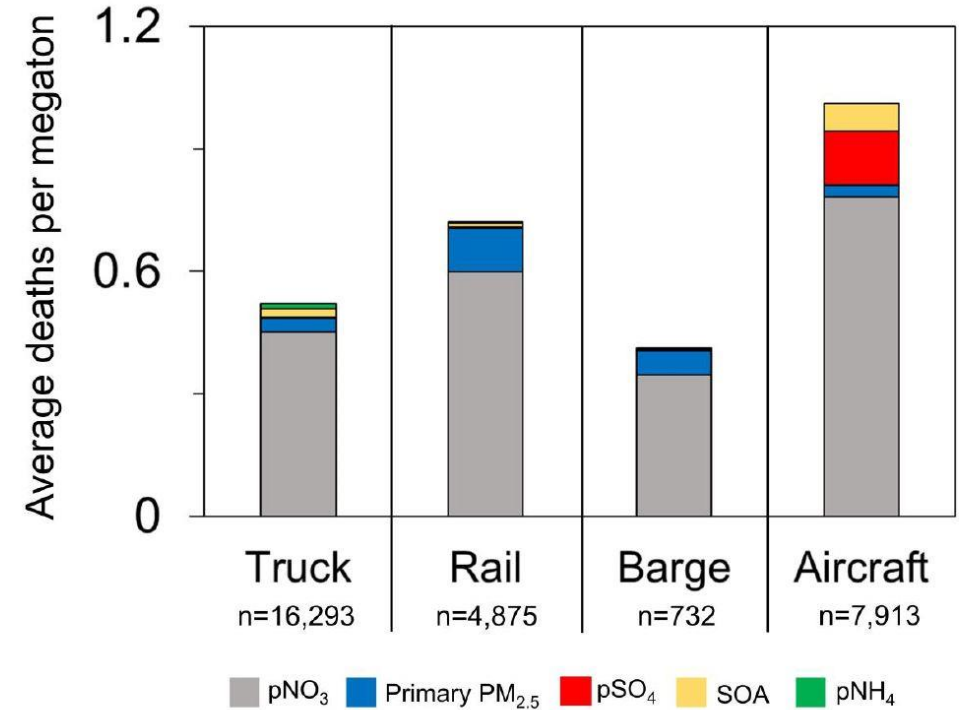
# Extra slides



# Pairwise modal comparison of average deaths per megaton by PM<sub>2.5</sub> precursor type



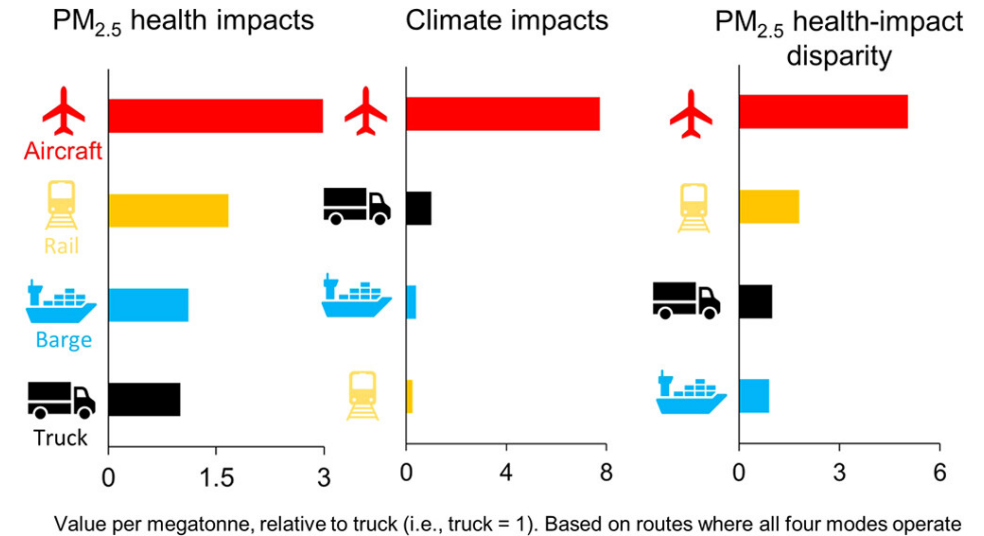
**Figure S17.** Pairwise modal comparison of average deaths per megaton by PM<sub>2.5</sub> precursor type.



**Figure S18.** Average deaths per megaton by PM<sub>2.5</sub> precursor type for each mode for all O-D pairs.

# Electrification might be the only solution!

- Annual damages from freight movement:
  - ~1400 premature deaths (monetized: \$13 billion)
  - 150 billion kg CO<sub>2</sub> (monetized: \$8 billion)
  - Health disparity of 0.06 deaths per 100,000 people
- Health and climate impacts are often but not always aligned among modes.
- Level of exposure and disparity among racial-ethnic groups vary in urban versus rural areas.
- E-commerce is booming, so is emissions from freight.
- Important benefits from electrification of interregional (and other) freight transportation, combined with low emission or renewable electricity generation.
- Future work:
  - can look into impacts by different commodity types and value of commodity shipped.
  - explore impacts from within-region freight transport.



# Concentration-Response Function for PM<sub>2.5</sub>

- Log-linear concentration-response (C-R) function with no threshold derived from the ACS reanalysis study representative of US concentrations and population.

$$\text{No. of premature deaths} = \left( e^{(PM_{2.5} \text{ Linear Coefficient} \times [PM_{2.5}])} - 1 \right) \times P \times \frac{\text{All-Cause Mortality Rate}}{100,000}$$

Here, PM<sub>2.5</sub> Linear Coefficient =  $\ln(1.078)/10 = 0.007510747$ , i.e., a 7.8% increase in the number of premature deaths for every 10 ug/m<sup>3</sup> increase in the concentration of PM<sub>2.5</sub>. [PM<sub>2.5</sub>] is the concentration of PM<sub>2.5</sub>; P is total population.

- This C-R function is standard and most widely used in the literature.

**We investigated air pollution and climate impacts of freight transportation by mode and.....**



Source: Google images

**...first to look at health disparity among demographic groups from freight modes.**



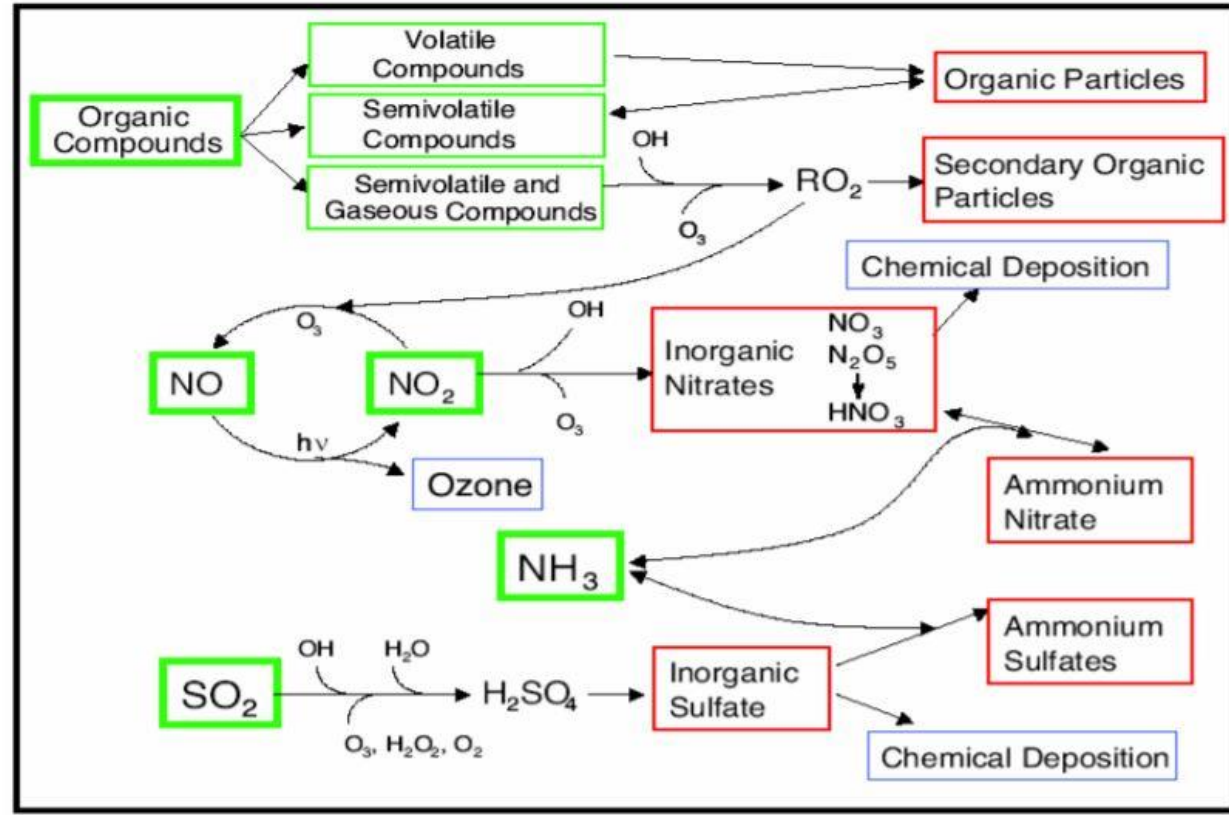
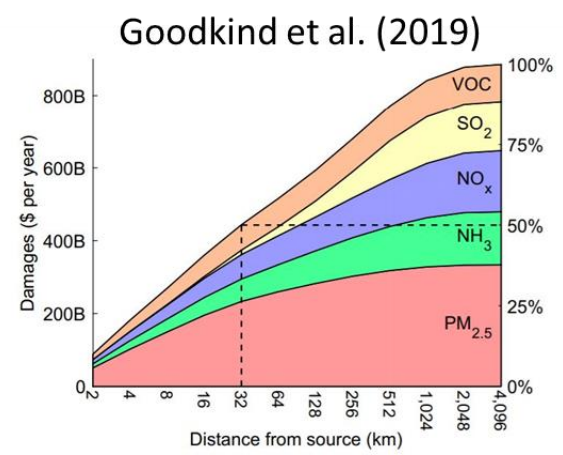
# Focused on a health-damaging pollutant: fine particulate matter (PM<sub>2.5</sub>)

$$\text{Total PM}_{2.5} = \text{Primary PM}_{2.5} + \text{pSO}_4 + \text{pNO}_3 + \text{pNH}_4 + \text{SOA}$$

## Chemical processes

- Chemical reaction of gases in the atmosphere
- Oxidation
- Gas- and particle-phase partitioning

## Distance



Source: U.S. EPA <https://www3.epa.gov/ttnchie1/conference/ei13/mobile/hodan.pdf>

## Physical processes

- Coagulation
- Nucleation
- Condensation
- Deposition

## Resolution

Paoella et al. (2018)

