

# Quantifying Impacts of Emission Reductions on Environmental Justice and Human Health in a Metropolitan Area

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# Introduction

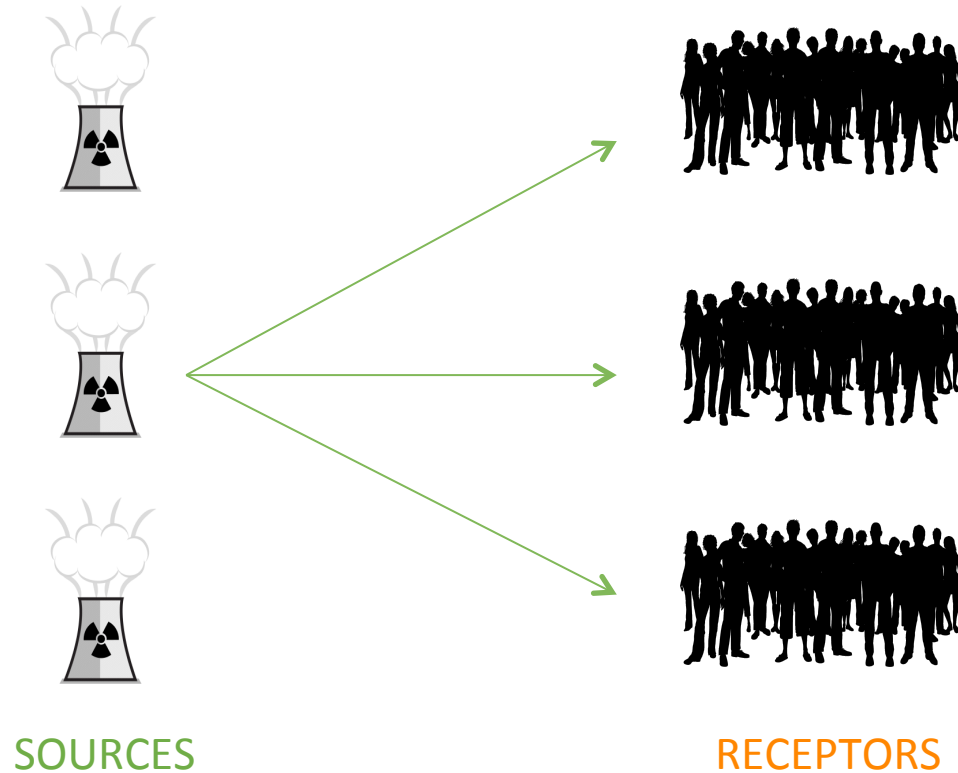
- Globally, ambient particulate matter (PM) pollution accounts for approximately 3.2 million premature deaths every year, and is considered one of the largest environmental health risks
- Environmental justice investigates how environmental risk factors are associated with socioeconomic status (SES; e.g. income, race, etc.)
  - Previous studies have found that lower income households are more often located in areas with higher air pollution

# Objectives

For PM<sub>2.5</sub> exposure in New York City and surrounding areas:

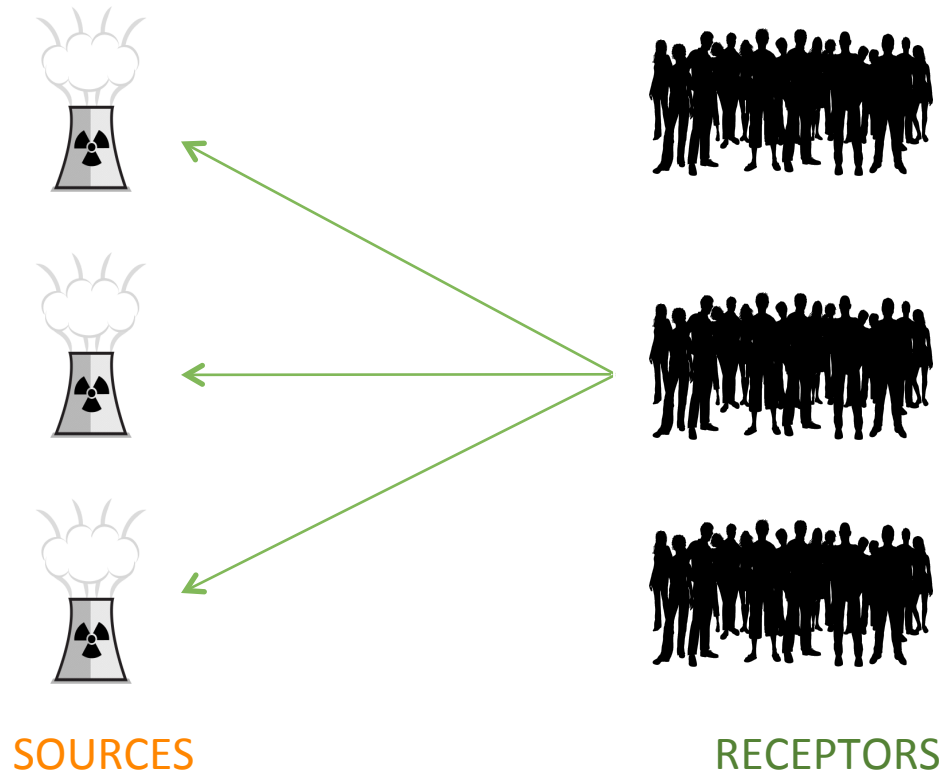
1. Identify emission control measures to improve:
  - a) human health
  - b) environmental equity across income groups
2. Contrast the sensitivities of health and equity measures to emission reductions, to better coordinate air quality management strategies

# Forward Sensitivity Analysis



Forward: where impacts go to ...

# Backward/Adjoint Sensitivity Analysis



Adjoint/backward: where influences come from

# Monetized Health Impacts: Marginal Benefits

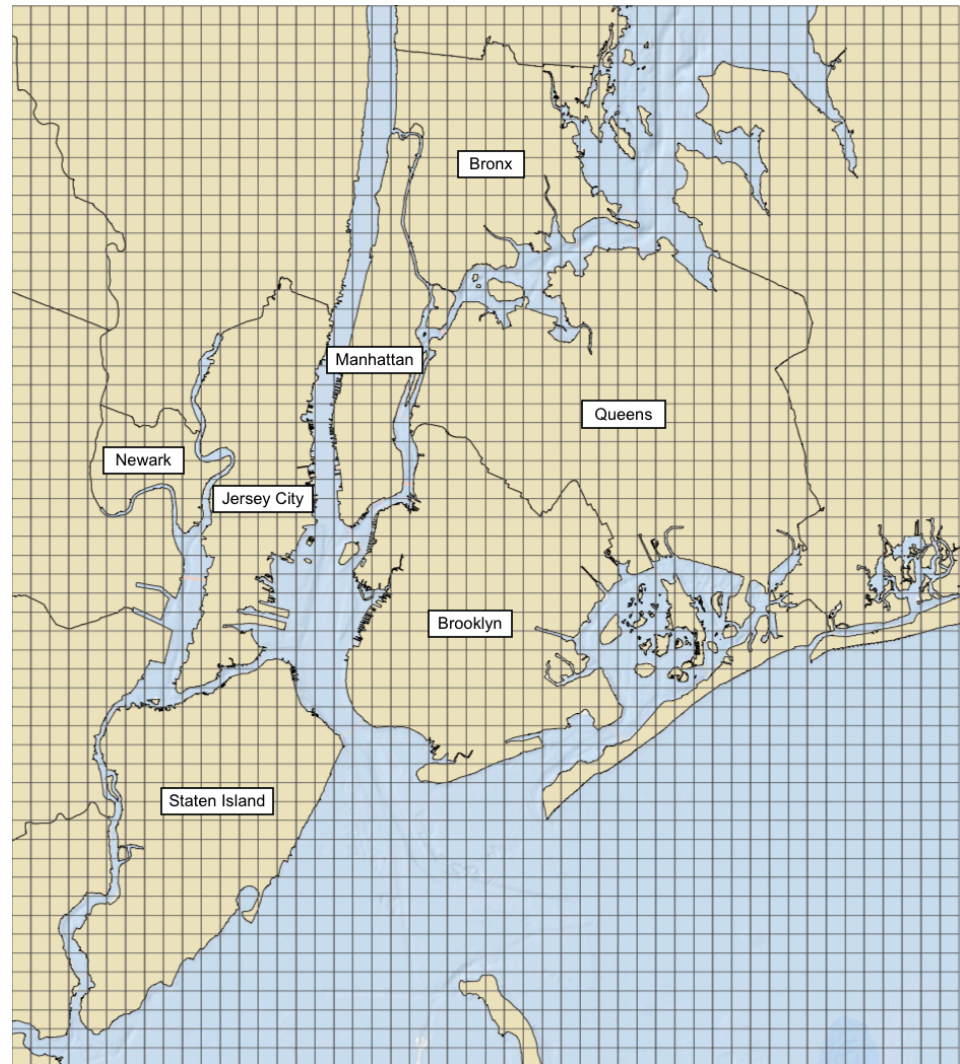
$$\frac{\Delta\$}{\Delta\text{Emissions}} = \underbrace{\frac{\Delta\$}{\Delta\text{Mortality}}}_{\text{Economics}} \times \underbrace{\frac{\Delta\text{Mortality}}{\Delta\text{Concentrations}}}_{\text{Epidemiology}} \times \underbrace{\frac{\Delta\text{Concentrations}}{\Delta\text{Emissions}}}_{\text{Air quality modeling}}$$

# Adjoint cost function

- We can use the adjoint method so long as
  - our “policy” metric can be condensed into a single number, called the **adjoint cost function**,
  - The functionality between the metric and concentrations is known.
  - Health outcomes, precipitation to a lake, average concentrations, crop damage, etc.
- Example: nationwide mortality due to long-term exposure.

# Area of Study

- 1km grid focused on New York City and surrounding area
- Focused on  $PM_{2.5}$  concentrations
- CMAQ 5.0 and its adjoint
- July 1<sup>st</sup> – 14<sup>th</sup>, 2008
- Income data was taken from the U.S. Census: 12-month household income, divided into 16 income bins

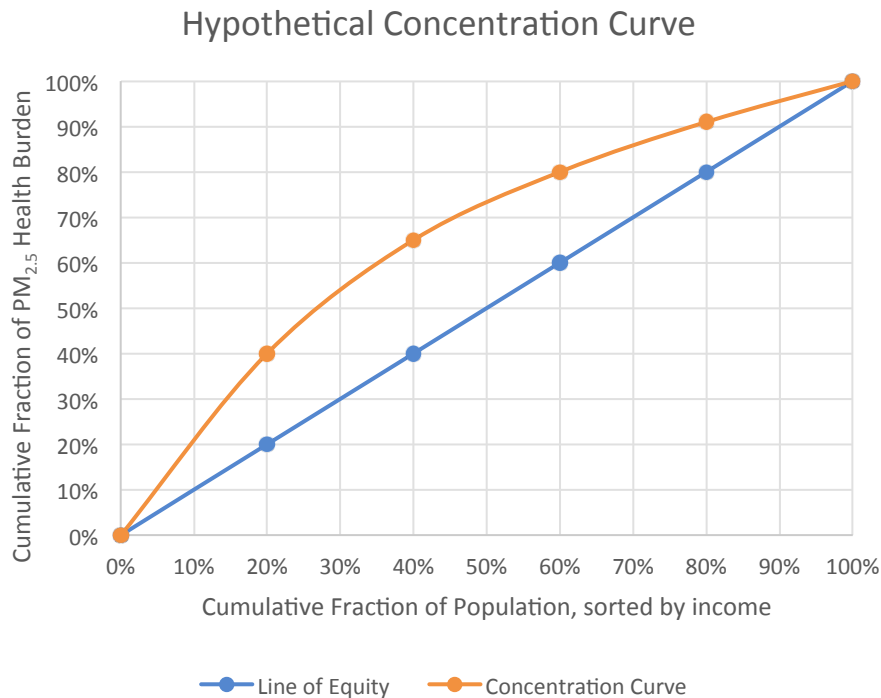




# Health Benefits vs. Health Inequity

- Health Benefits: Monetized domain-wide reduction in mortality per ton of emissions (primary PM<sub>2.5</sub>)
  - Chronic exposure mortality
  - Local baseline mortality
- Health Inequity: Change in domain-wide inequity metric (or its monetized form) due to one tonne reduction in emissions
  - Disparity in share of PM<sub>2.5</sub> mortality risk
  - Results only shown for primary PM emissions

# Estimating Environmental Inequity from PM<sub>2.5</sub>



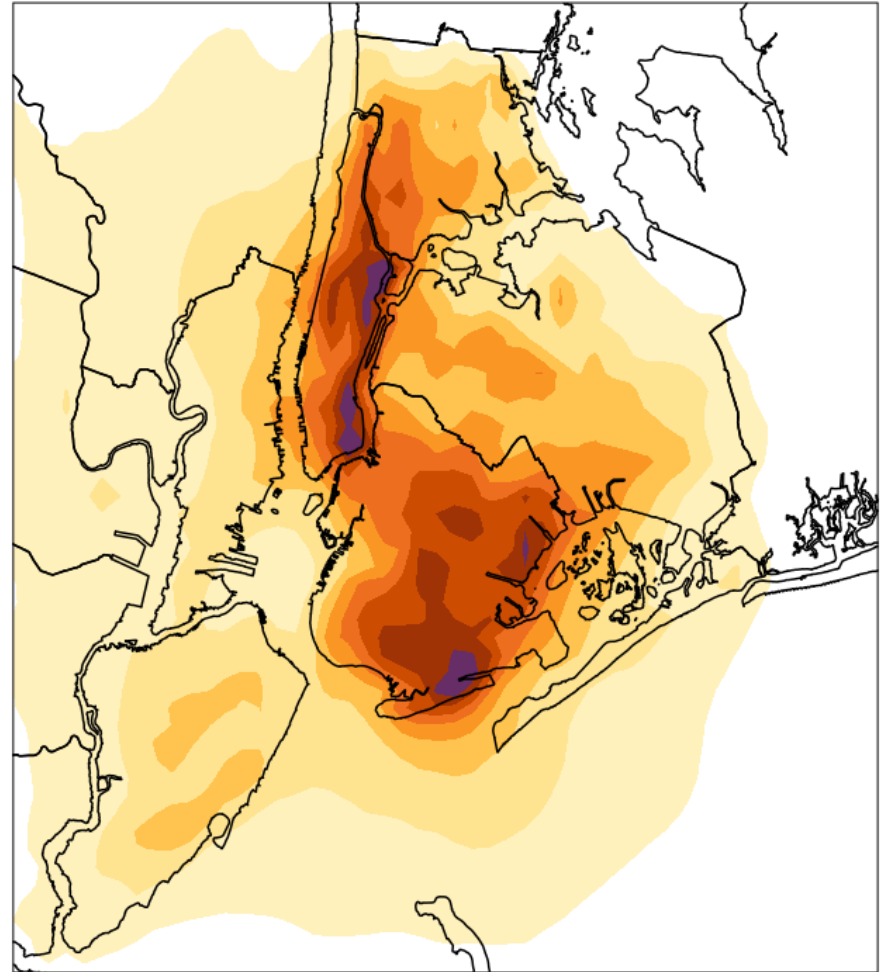
- **Concentration Curve** plots the fraction of PM<sub>2.5</sub> health burden earned by the cumulative fraction of the population, sorted by income
- **Concentration Index** is double the area between the Concentration Curve and the Line of Equity
  - Index ranges from 0 – 1
  - 0 – Indicates equity
  - 1 – Indicates inequity

# Results

## Marginal Health Benefit of Reduced PM<sub>2.5</sub> Exposure from Primary PM Emissions

### Marginal Benefits of Reduced Mortality

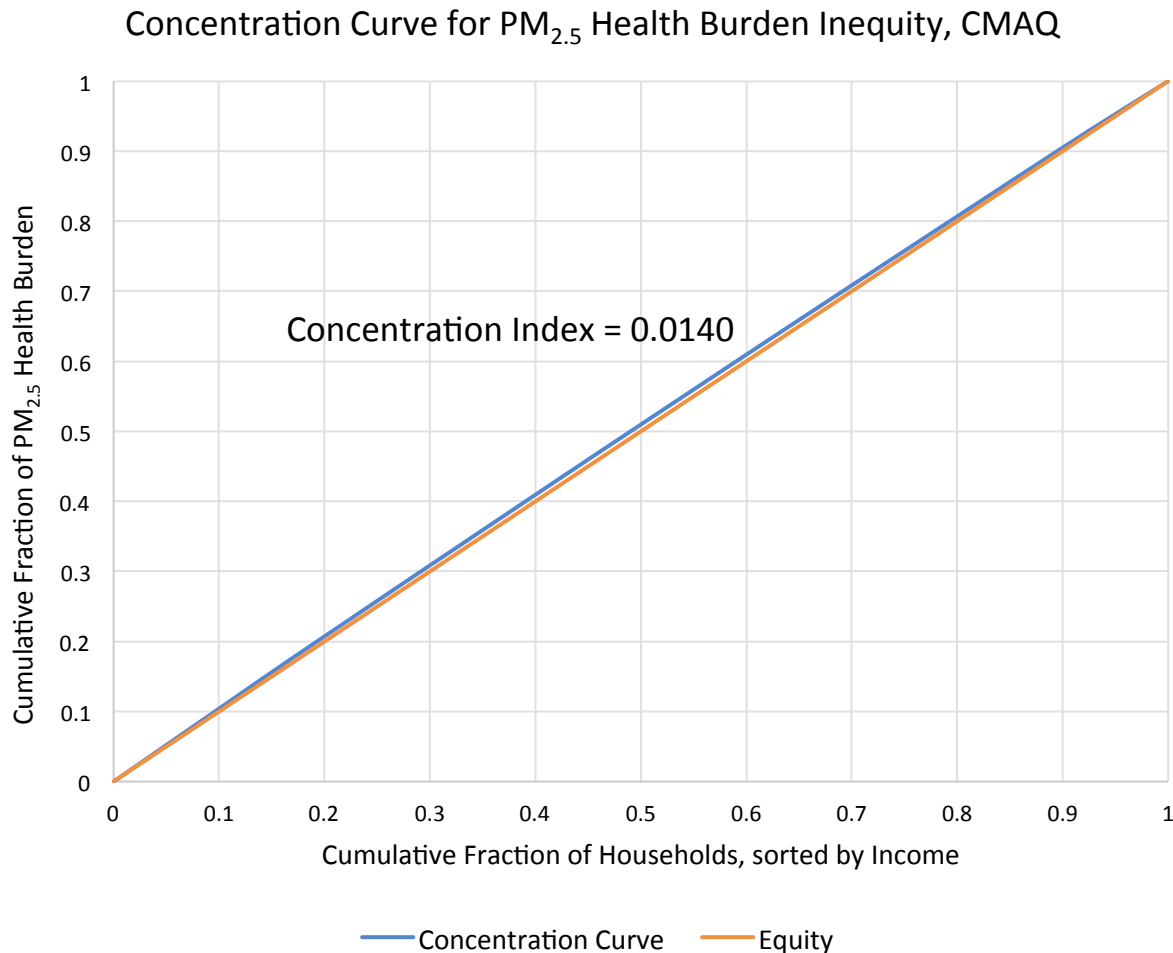
- Annual health benefits experienced across the region
- For a reduction of primary PM emissions by 1 tonne/year at that location
- Highly sensitive to population



2 3 4 5 6 7 8 9

\$1,000,000/(tonne/year)

# Current State of Environmental Equity



## Concentration Index:

CMAQ = 0.0140

LUR = 0.0122 – 0.0152

## Typical values:

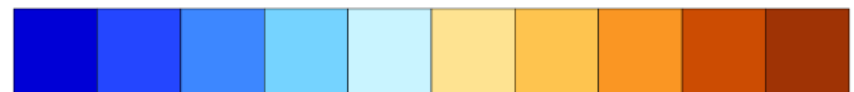
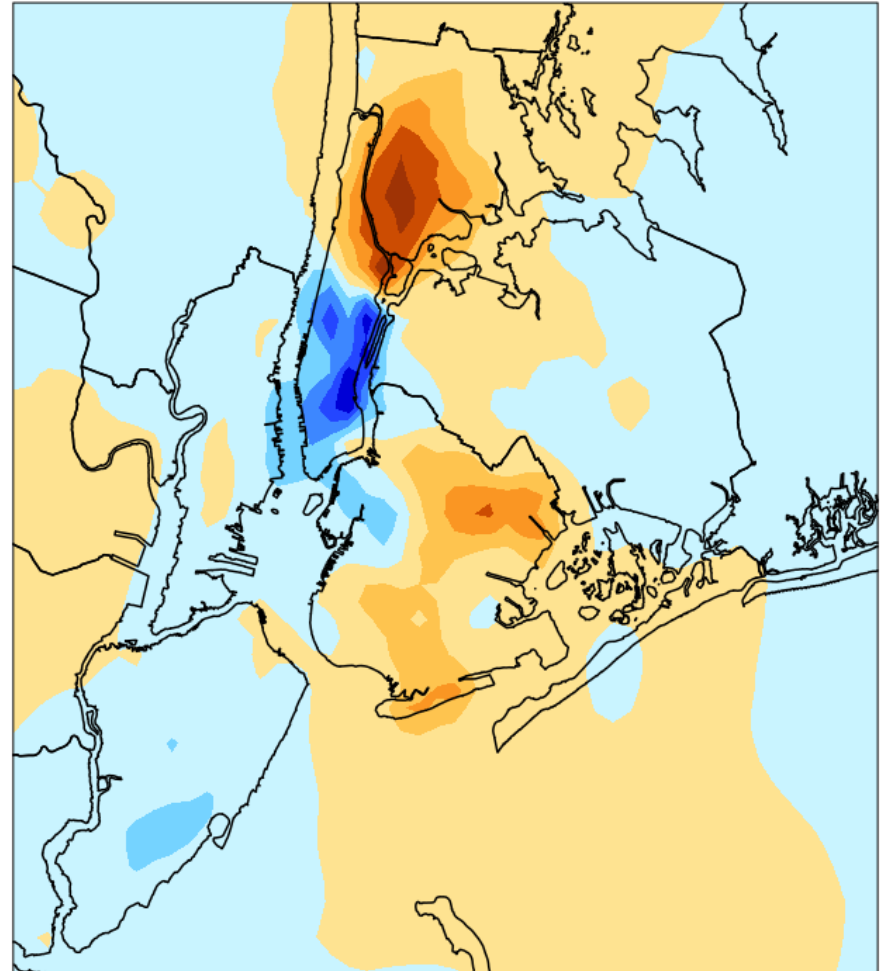
Los Angeles = 0.020 – 0.031  
(Su et al., 2009)

Detroit = 0.010 – 0.067  
(Martenies et al., 2017)

## Percent Reduction in PM<sub>2.5</sub> Health Burden Inequity from Primary PM Emissions

### Sensitivity of Health Burden Inequity

- Positive sensitivity = a reduction in emissions reduces inequity
  - Biggest positive sensitivities occur in areas with a high proportion of low-income people
- Negative sensitivity = a reduction in emissions aggravates inequity
  - Biggest negative sensitivities occur in areas with a high proportion of high-income people



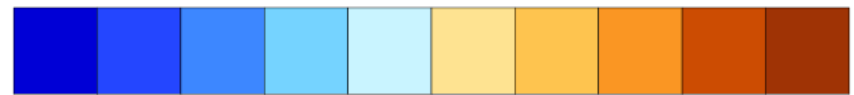
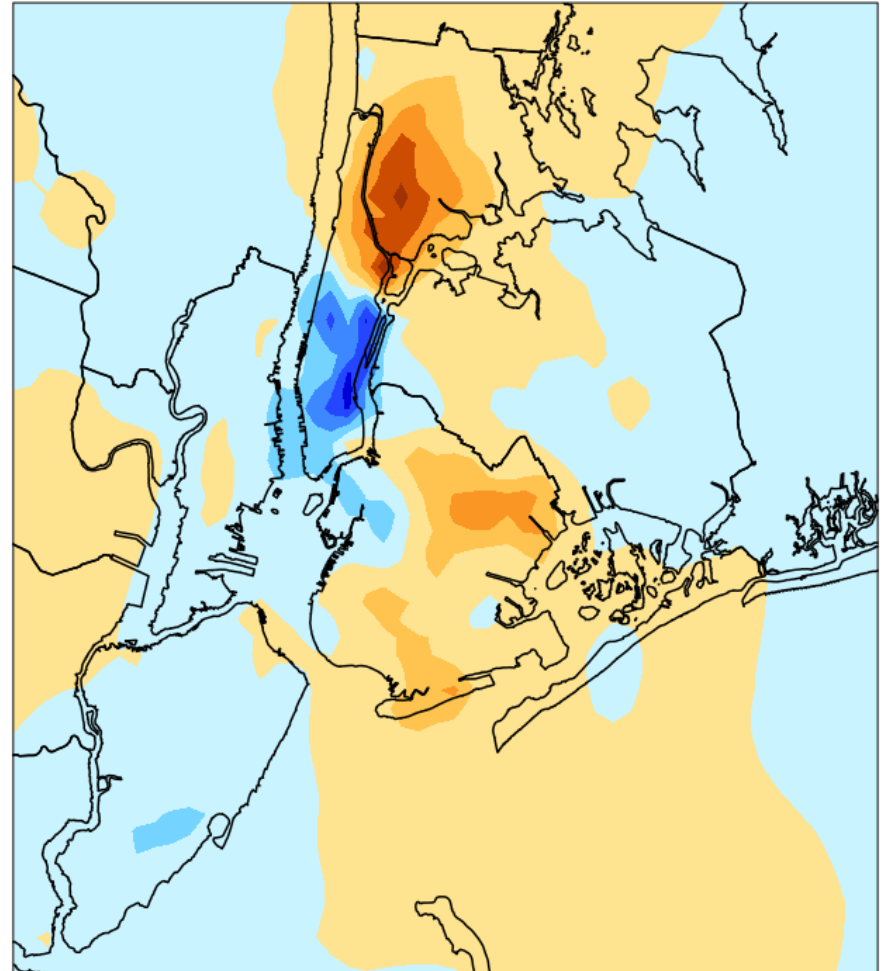
-0.4 -0.3 -0.2 -0.1 0 0.1 0.2 0.3 0.4

% reduction in inequity/(tonne/year)

## Monetized value of Reducing PM<sub>2.5</sub> Inequity from Primary PM Emissions

### Monetized Health Burden Inequity

- Represents the amount of money that would need to be added to the system to create an equivalent reduction in inequity
- Equivalent to reducing 1 tonne/year of Primary PM at that location.

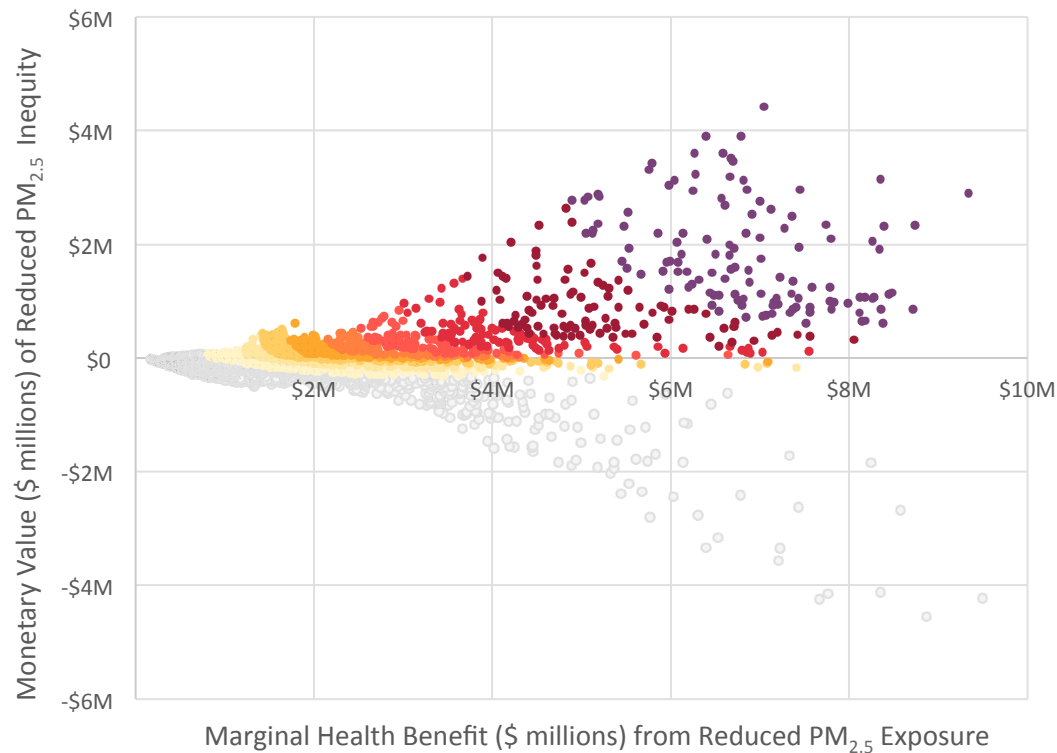


-4 -3 -2 -1 0 1 2 3 4

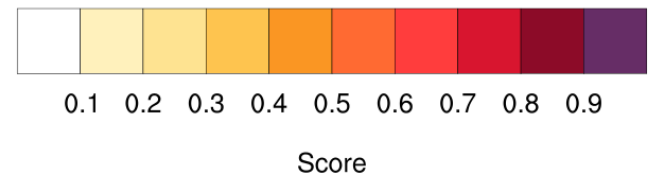
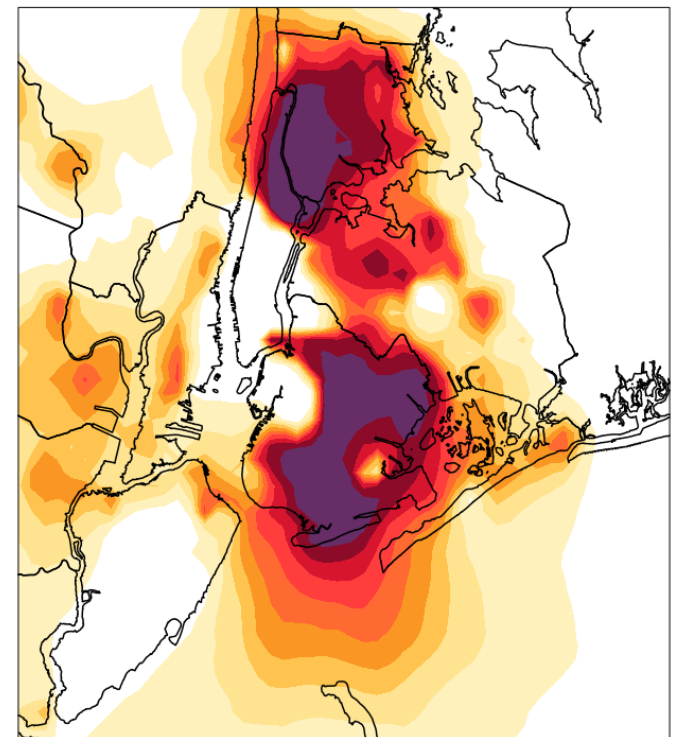
\$1,000,000/(tonne/year)

# Synergistic Emission Reductions on Equity and Health

Impact of 1 tonne/year Reduction in Primary PM Emissions at Each Location



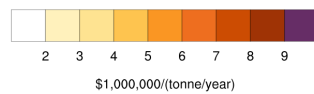
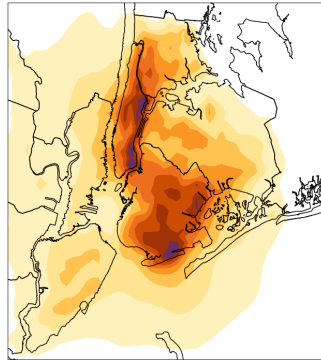
Synergistic Primary PM Emission Reductions on PM<sub>2.5</sub> Mortality and Health Burden Inequity



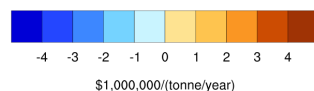
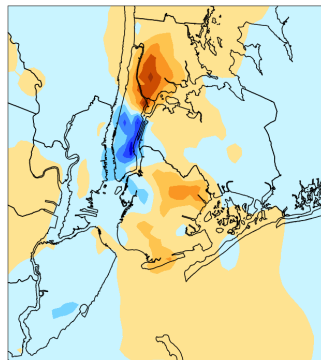


# Synergistic Emission Reductions on Equity and Health

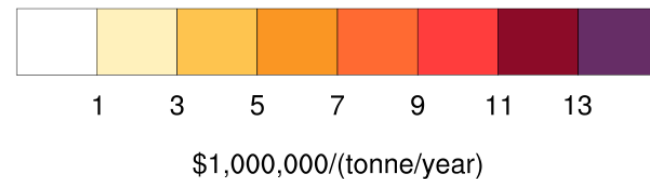
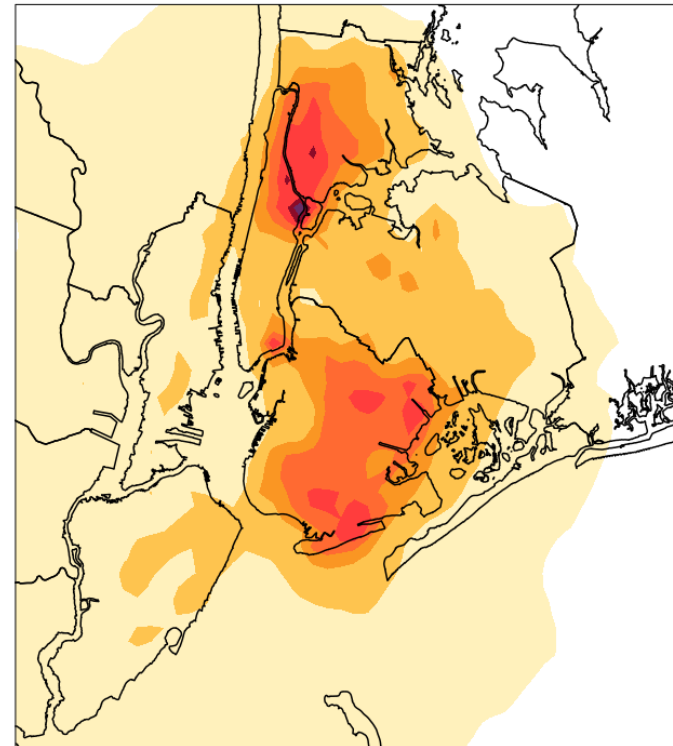
Marginal Health Benefit of Reduced  $PM_{2.5}$  Exposure  
from Primary PM Emissions



Monetized value of Reducing  $PM_{2.5}$  Inequity  
from Primary PM Emissions

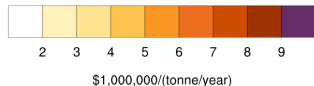
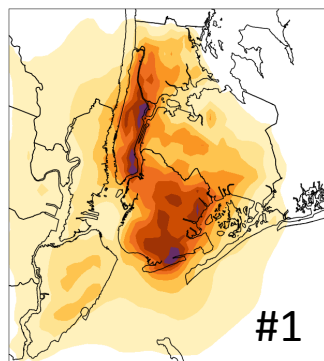


Monetized Value of Combined Reduction of  $PM_{2.5}$   
Inequity and Mortality from Primary PM Emissions

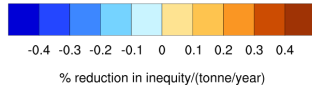
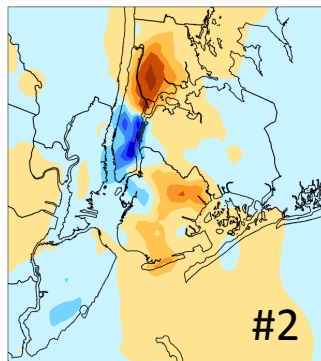


# Emission Reduction Case Study

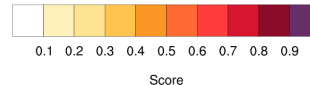
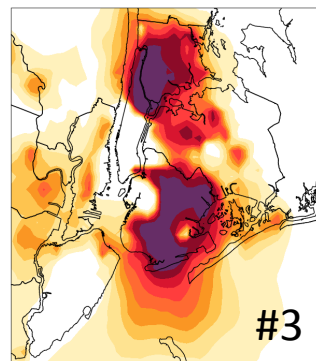
Marginal Health Benefit of Reduced PM<sub>2.5</sub> Exposure from Primary PM Emissions



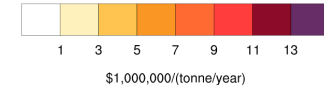
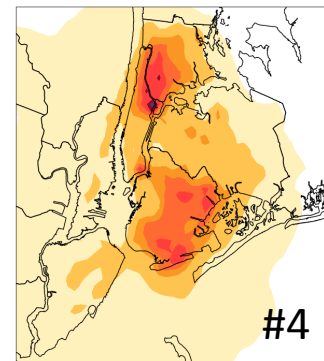
Percent Reduction in PM<sub>2.5</sub> Health Burden Inequity from Primary PM Emissions



Synergistic Primary PM Emission Reductions on PM<sub>2.5</sub> Mortality and Health Burden Inequity



Monetized Value of Combined Reduction of PM<sub>2.5</sub> Inequity and Mortality from Primary PM Emissions



Scenario	Health Benefits (\$ billion USD)	Equity Benefits (\$ billion USD)	Equity Benefits (% Reduction in Inequity)
#1: Prioritize Health	\$ 4.01	\$ 0.15	13.9 %
#2: Prioritize Equity	\$ 3.48	\$ 1.02	95.1 %
#3: Percentile Scores	\$ 3.65	\$ 0.98	91.4 %
#4: Combined Monetization	\$ 3.71	\$ 0.95	88.3 %

# Conclusion

- Considering synergistic emission reductions can lead to substantial benefits for both health and equity
  - This can provide policy-relevant information to better coordinate air quality policies that target various endpoints

# Adjoint vs. Reduced Form Models

- Development of an adjoint model is difficult
  - It's now done
- Adjoint simulations are computationally expensive
  - Quite affordable for medium size domains
  - May necessitate episodic simulation
- Preparing high resolution inputs is a demanding task
  - Also true for reduced form models
- Adjoint is as accurate as the underlying model
- All the results in a single run

# Acknowledgements

- Carleton Atmospheric Modelling Group
  - Burak Oztaner, Shunliu Zhao, Melanie Fillingham, Marjan Soltanzadeh, Angele Genereux, Sina Voshtani, Rabab Mashayekhi, Pedram Falsafi, Sahar Saeednooran, Matthew Russell, Amanda Pappin
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