

# The Implications of Carbon Pricing for Environmental Inequality

Evan Perry



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- Thank yous and apologies
- Revisions (based on feedback) since 2023-04-20:
  - ▶ Copyediting
  - ▶ Acknowledgements
  - ▶ 5.3 Results — expanded discussion of EI Gap
  - ▶ 5.4 Diagnostics & Limitations
- Slides & replication project available

## Research Question

Do carbon pricing policies exacerbate inequalities in air pollution concentrations?

**Background** Carbon pricing policies are big globally, more common domestically, and popular amongst economists—but little is known about *how* these policies affect the distribution of local air pollution

- Method** Study the effect of a carbon price on electricity generation in California on air pollution disparities across the Western US
1. Model: Build a model of carbon pricing and environmental inequality
  2. Simulation: Use the model and data to estimate environmental inequalities under a range of carbon prices

## Results

- Concentration of nitrous oxide emissions increases by in disadvantaged communities, but decreases by in non-disadvantaged communities
- Sulfur dioxide & particulate matter concentration disparities do not meaningfully change
- Effects are driven by differences in coverage under the regulation

## Implications

- Exposes potential flaw of ex-post analyses that look exclusively at the regulated geography
- Warrants additional research on combined cap-and-trade + localized pollution control policies

## **Introduction & Motivation**

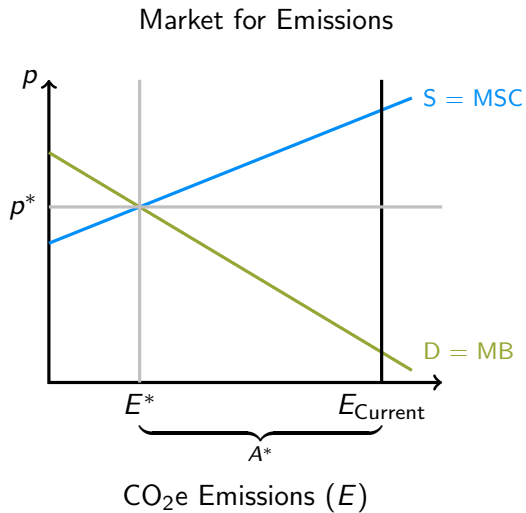
Modeling Carbon Pricing & Environmental Inequality

Empirical Strategy & Data

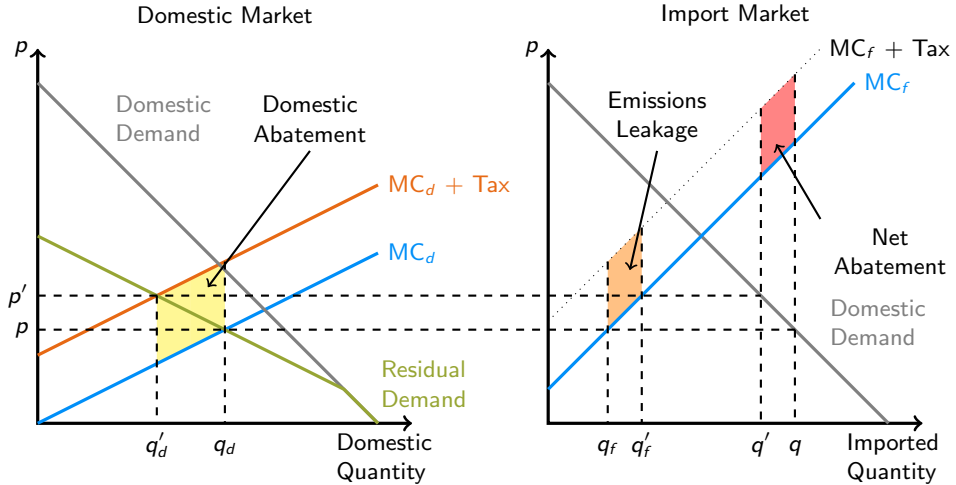
Simulation Results

Takeaways & Discussion

# Carbon Pricing



# Emissions Leakage



# Gobal Air Pollution v. Local Air Pollution

## Global Air Pollutants

- Carbon dioxide ( $\text{CO}_2$ ), Methane ( $\text{CH}_4$ ), Nitrous oxide ( $\text{N}_2\text{O}$ )
- Primarily long-run consequences
- Location does not matter

## Local Air Pollutants

- Nitrogen oxides ( $\text{NO}_x$ ), Sulfur dioxide ( $\text{SO}_2$ ), Particulate matter ( $\text{PM}_{2.5}$ )
- Mix of long- and short-run consequences
- Location does matter



- CARB Cap-and-Trade FAQ Page
- Descriptive Analysis: Yes, California's cap-and-trade program increased disparities (Cushing et al., 2018; Pastor et al., 2022)
- Causal Analysis: No, California's cap-and-trade program decreased disparities (Hernández-Cortés and Meng, 2023)

- Ex-ante model to anticipate changes in air pollution disparities
- *How* do carbon pricing policies shift local air pollution across jurisdictions?
- Weber (2021) creates a similar model, but does not:
  1. Formally model disparities in air pollution concentrations
  2. Consider leakage and the redistribution outside of California

Introduction & Motivation

## **Modeling Carbon Pricing & Environmental Inequality**

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# Model Overview

**Agents**  $N$  fossil fuel power plants

**Environ.**

- Geography:  $R$  regions, each with its own wholesale market for electricity
- Constraints: Demand, (Capacity,) Transmission
- Markets: Perfectly competitive

**Actions**

1. Initial investment decision
2. Hourly generation decisions

**Behavior** Maximize discounted sum of future profits

**Equilibrium** Minimize total investment and generation costs  $\rightarrow$  Generation outcomes  $\rightarrow$  Air pollution disparity outcomes



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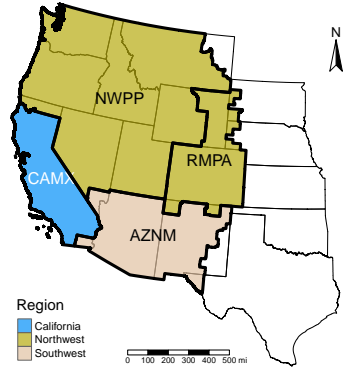
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# Empirical Strategy: Simulation

- Simulate generation across the Western US power grid (Western Interconnection)
- Focus only on fossil fuel generation: coal, (natural) gas, oil



# Empirical Strategy: Policy Scenarios

- Border Carbon Adjustments (BCAs): “Carbon tariff” on electricity California imports from elsewhere
- Nine policy scenarios with a combination of BCAs and carbon prices

Scenario	BCA?	Tax (\$/tonne)
A	No	0
B	No	20
C	No	40
D	No	60
E	No	80
F	Yes	20
G	Yes	40
H	Yes	60
I	Yes	80



# Empirical Strategy: $k$ -Means Clustering

- Problem: Constrained optimization problems are too large
- Generation Problem
  - ▶ Simplify  $N$ :  $k$ -means cluster power plants into thirty groups
- Investment Problem
  - ▶ Simplify  $T$ :  $k$ -means cluster electricity demand into a “representative day”
  - ▶ Simplify  $N$ :  $k$ -means cluster generation clusters into four clusters

## Empirical Strategy: Generation $\rightarrow$ Pollutant Concentrations

- 2019 Emissions & Generation Resource Integrated Database (eGRID) from the EPA
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## Data: Disadvantaged Communities

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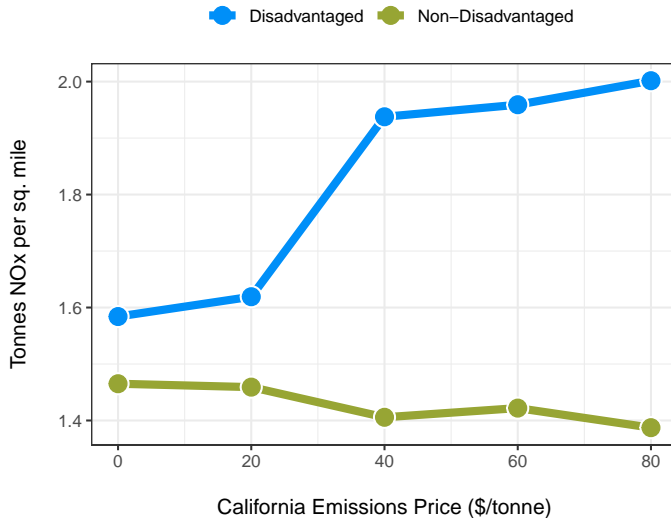


# Greenhouse Gas Emissions





# The EI Gap



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- Cushing, Lara, Dan Blaustein-Rejto, Madeline Wander, Manuel Pastor, James Sadd, Allen Zhu, and Rachel Morello-Frosch.** 2018. "Carbon trading, co-pollutants, and environmental equity: Evidence from California's cap-and-trade program (2011–2015)." *PLoS medicine*, 15(7): e1002604.
- Hernández-Cortés, Danae, and Kyle Meng.** 2023. "Do environmental markets cause environmental injustice? Evidence from California's carbon market." *Journal of Public Economics*, 217: 104786.
- Pastor, Manuel, Michael Ash, Lara Cushing, Rachel Morello-Frosch, Edward-Michael Muña, and James Sadd.** 2022. "Up in the Air: Revisiting Equity Dimensions of California's Cap-and-Trade System." *USC Dornsife Equity Research Institute*.
- Weber, Paige.** 2021. "Dynamic responses to carbon pricing in the electricity sector." *Working paper, University of North Carolina at Chapel Hill*.