# Quantifying Co-benefits of CO<sub>2</sub> Emission Reductions in Canada and the United States: An Adjoint Sensitivity Analysis

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### Introduction

- Co-benefits due to reduced emissions of criteria pollutants (or their precursors)
  - Air pollution impact on human health (PM, O<sub>3</sub>, and NO<sub>2</sub>)
    - Not considering the climate feedback on air quality
- CO<sub>2</sub> reduction co-benefit or coincident health air pollution damage: dependent on the policy measure
  - Sectoral
  - Spatial
- Co-benefits due to reduced chronic exposure mortality
  - Reduced NO<sub>X</sub> emissions  $\rightarrow$  reduced O<sub>3</sub>/NO<sub>2</sub> health impacts (presented before)
  - Reduced primary (e.g., EC, OC) and precursor (SO<sub>2</sub>, NH<sub>3</sub>, NO<sub>x</sub>) emissions
  - $\rightarrow$  reduced PM<sub>2.5</sub>, health impacts

# Methodology



- Adjoint-based marginal benefits (MBs or benefit-per-ton) based on Pappin et al. (2013)
- Concentration response functions (CRFs):
  - Canada
    - PM, O3, NO2 from Crouse et al. (2015)
    - Nonlinear CRF for PM and NO<sub>2</sub>; Pappin et al. (2016)
  - U.S.
    - O3 from Bell et al. (2004)
    - PM based on Krewski et al. (2009)

### Marginal Benefit Estimation: Adjoint model



- Influences on nationwide mortality are traced back to individual sources (Pappin and Hakami, 2013)
- Full CMAQ-Adjoint (gas-phase for O<sub>3</sub>/NO<sub>2</sub> simulations)
- 36 km CONUS domain
- 34 vertical layers
- O3/NO<sub>2</sub> Modeled over ozone season of May-September 2007 (153 days)
- PM<sub>2.5</sub> is modeled over 1 month (April) of 2008 (30 days)

# Adjoint-based MBs

- Full CMAQ adjoint
- Adjoint of aerosol processes is working (finally!) and seems stable
  - Currently undergoing further evaluation

#### NO<sub>X</sub> Marginal Benefit (no PM): Surface Sources

USA



Canada



### PM<sub>2.5</sub> Marginal Benefit: Surface Sources

USA





Canada

#### PEC Marginal Benefit: Surface Sources

USA





### NH3 Marginal Benefit: Surface Sources

USA





Canada



### SO<sub>2</sub> Marginal Benefit: Surface Sources





Canada





#### SO<sub>2</sub> Marginal Benefit: Surface vs. Point Sources









### NO<sub>X</sub>/CO<sub>2</sub> Emission Ratio: Mobile On-road



# Major sectors

NO <sub>x</sub>	PM <sub>2.5</sub>	SO <sub>2</sub>	NH <sub>3</sub>	CO <sub>2</sub>
1.Mobile-DH	1.Fires	1.EGUs (coal)	1.Agriculture	1.EGUs (coal)
2.Mobile-GL	2.Dust	2.Industrial boiler	2.Fires	2.Mobile-GL
3.EGUs (coal)	3.EGUs (coal)	3.Industrial processes	3.Mobile-GL	3.Mobile-DL

Three sectors associated with the highest pollutant and CO<sub>2</sub> emissions

# MBs in comparison with literature

	Primary PM (PEC + POC) MBs, Mobile (\$/ton)			
Urban Area	Fann et al. (2009)	This work		
Atlanta	\$590,000	\$1,000,000		
Chicago	\$580,000	\$3,460,000		
Dallas	\$790,000	\$290,000		
Denver	\$450,000	\$1,270,000		
NY/Phi	\$710,000	\$7,920,000		
Phoenix	\$1,700,000	\$2,410,000		
Seattle	\$570,000	\$2,330,000		

# Results - I Mobile On-road

#### **Emissions Data Sources - Mobile Sector**



 NO<sub>X</sub>, PM<sub>2.5</sub>, NH<sub>3</sub>, SO<sub>2</sub> and CO<sub>2</sub> from 2011 NEI

 County-level data gridded to 36-km resolution



- Criteria pollutants:
  Environment & Climate
  Change Canada. Air
  Pollutant Emission
  Inventory Online Data
  Query (APEIODQ)
- CO<sub>2</sub>: Canadian national inventory reports(2011)

### NO<sub>X</sub> Co-benefit (O<sub>3</sub>): Mobile On-road

#### Gasoline Light Duty





### PM<sub>2.5</sub> Co-benefit (primary): Mobile On-road

#### Gasoline Light Duty



0.5 1 5 10 50 100 500 \$/ton CO2



#### Total Co-benefit: Mobile On-road

#### Gasoline Light Duty





#### Total Co-benefit: Mobile On-road

#### Gasoline Light Duty



\$/ton CO2





#### Total Co-benefit : Mobile On-road



#### Total Co-benefit : Mobile On-road



# Results - II Point Sources

#### **Emissions Data Sources – EGUs**

#### USA

- For SO<sub>2</sub>,NO<sub>X</sub> and CO<sub>2</sub>: Air Markets Program Data (AMPD)
- For PM<sub>2.5</sub> and NH<sub>3</sub>: EPA Google fusion tables and maps
- For CO<sub>2</sub>: EPA Facility Level GHG emission Data (Flight)

#### Canada

- For SO<sub>2</sub>, NO<sub>x</sub>, and CO<sub>2</sub>: National Pollutant Release Inventory (NPRI)
- For CO<sub>2</sub>: Canada's GHG emission inventory

 Cross-reference between NPR ID and GHGRP ID

#### Total Co-benefit: EGUs

USA





### Total Co-benefit : EGUs



#### Total Co-benefit: Oil & Gas





### Policy Relevance Example: Clean Power Plan

#### EGUs along the Ohio River Valley have total cobenefits ranging \$80-5000.

- Adjoint-based co-benefits provide an opportunity for coordinating climate and air quality policies.
- A grand plan to reduce CO<sub>2</sub> emissions from EGUs without consideration of co-benefits and exploiting their wide range is likely to miss a great opportunity for synergistic cost-effectiveness.

# Policy Relevance Example: Electrification of Transportation

#### MBs for New York City mobile sources are: LDGV: \$1350 HDDV: \$3300

- Targeted electrification can be far more beneficial than previous studies have indicated.
  - Would require more thorough examination (LCA, demand constraints, transmission, etc).
- Due to the wide range of co-benefits across various locations, targeted electrification seems more beneficial than across-the-board measures.
  - Adjoint, due to its source specificity, is particularly suitable for guiding targeted electrification.

#### Discussion

- Co-benefit values are comparable to those found previously in scenario-based studies (e.g. Nemet et al., 2010), but significantly larger at specific locations.
- Estimated co-benefits are larger than the price of carbon or its social cost.
- Co-benefits provide a great opportunity for coordinating climate and air quality policies in a cost-effective manner.
  - Such coordination would benefit from uniform criteria pollutant and GHG modelling tools – how can SMOKE model GHGs?

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