

# Mortality due to Air Pollution at Low levels of Exposure (MAPLE)

Michael Brauer



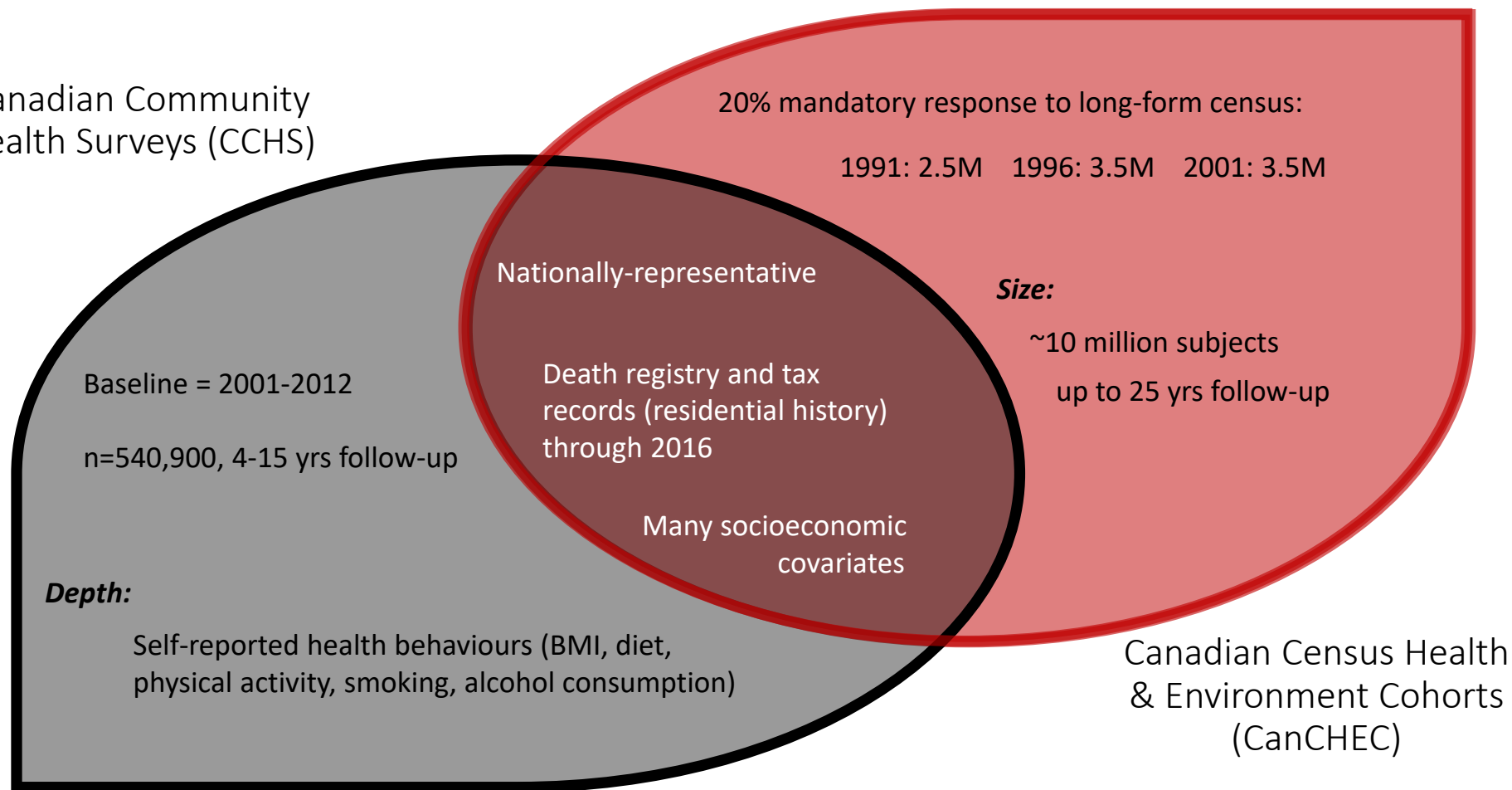
School of Population and Public Health



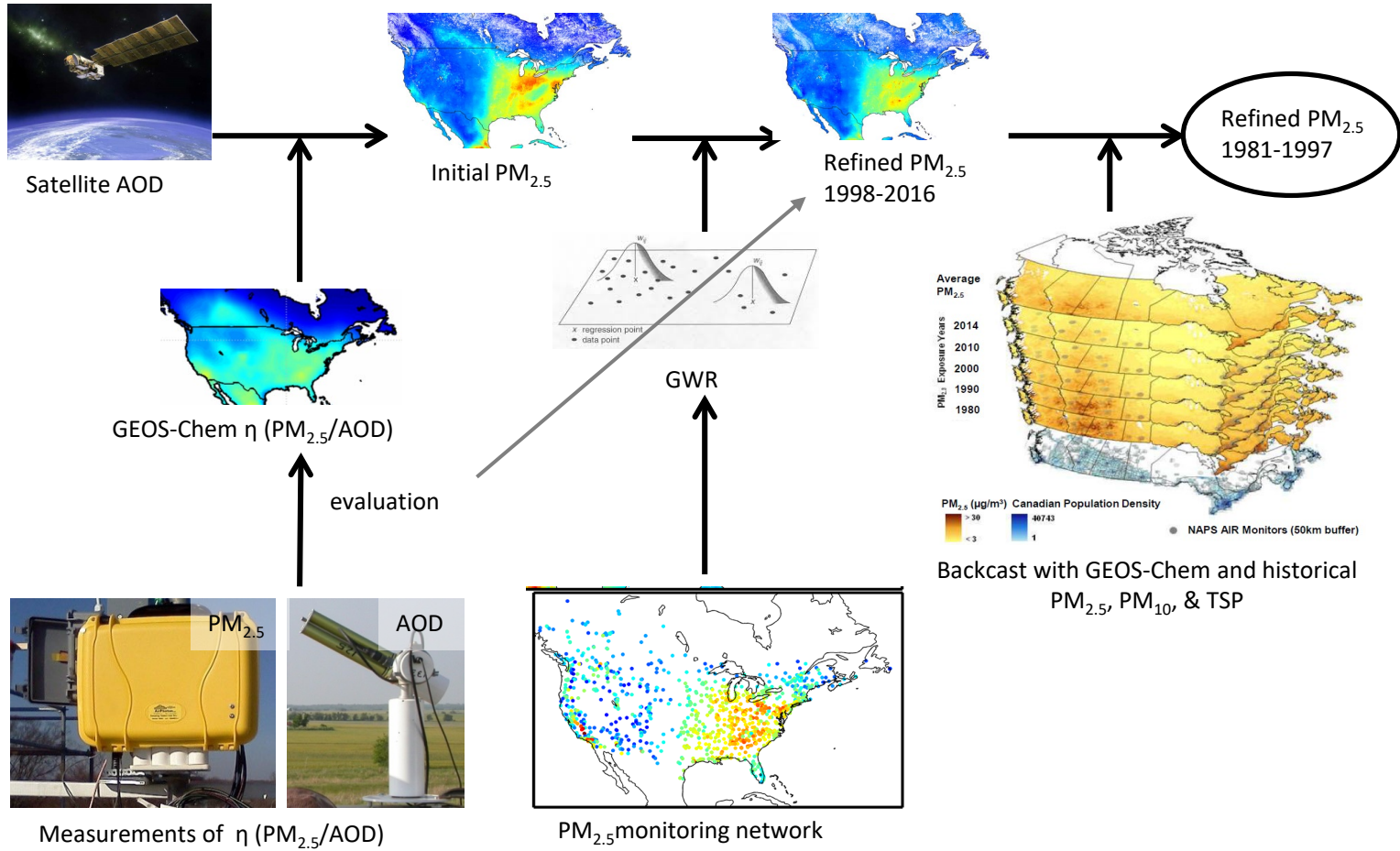
THE UNIVERSITY  
OF BRITISH COLUMBIA

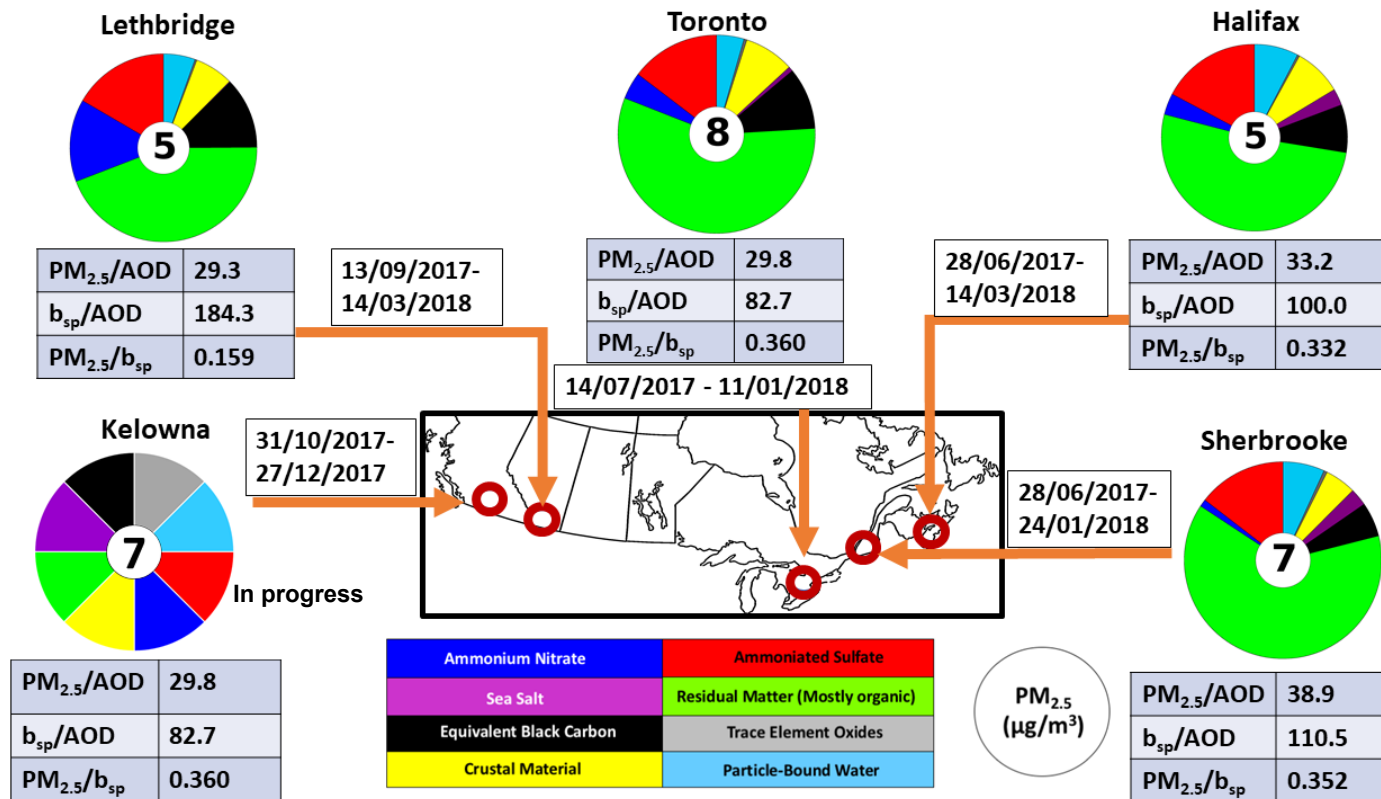
*HEI/ERS/WHO, January 21, 2020. Brussels*

# Cohorts



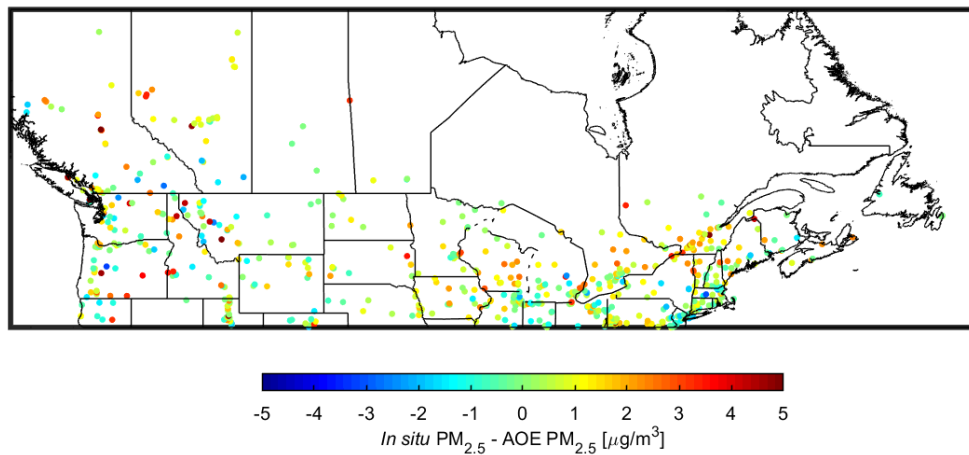
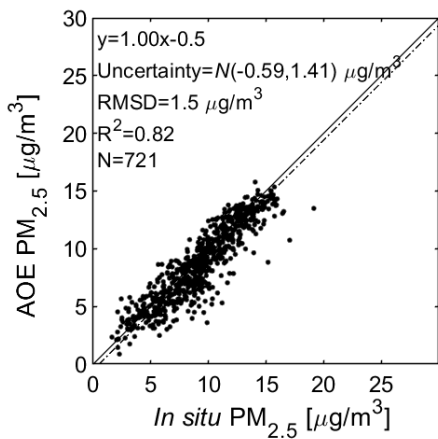
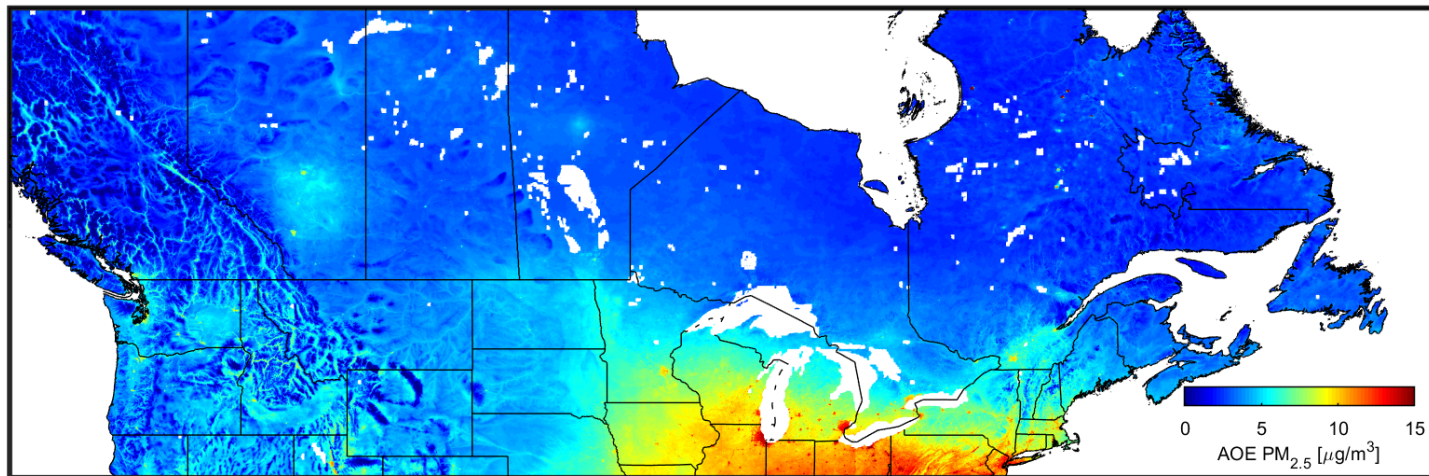
# Exposure estimation





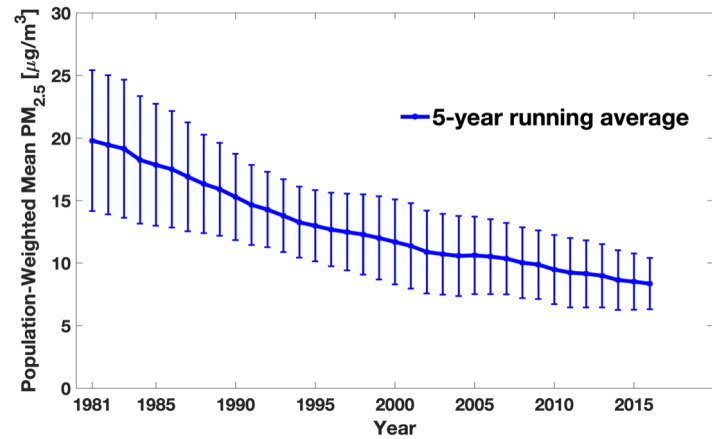
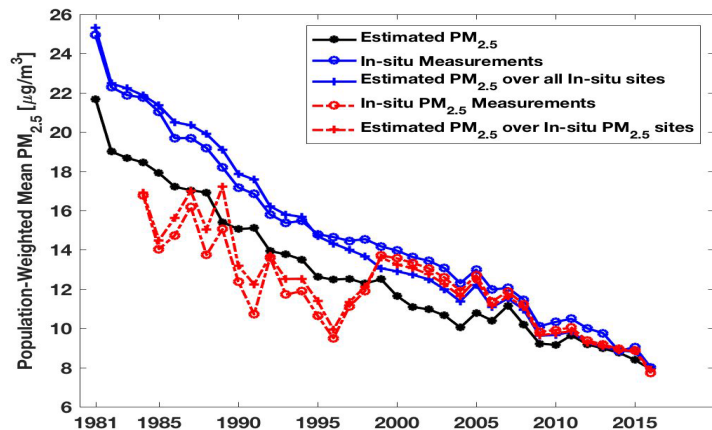
Not final results

# Exposure estimation





# Exposure backcasting (1981 – 1997)



Backcasting with historical ground-based measurements of  $PM_{2.5}$ ,  $PM_{10}$ , and TSP, remote sensing, chemical transport model, and elevation data

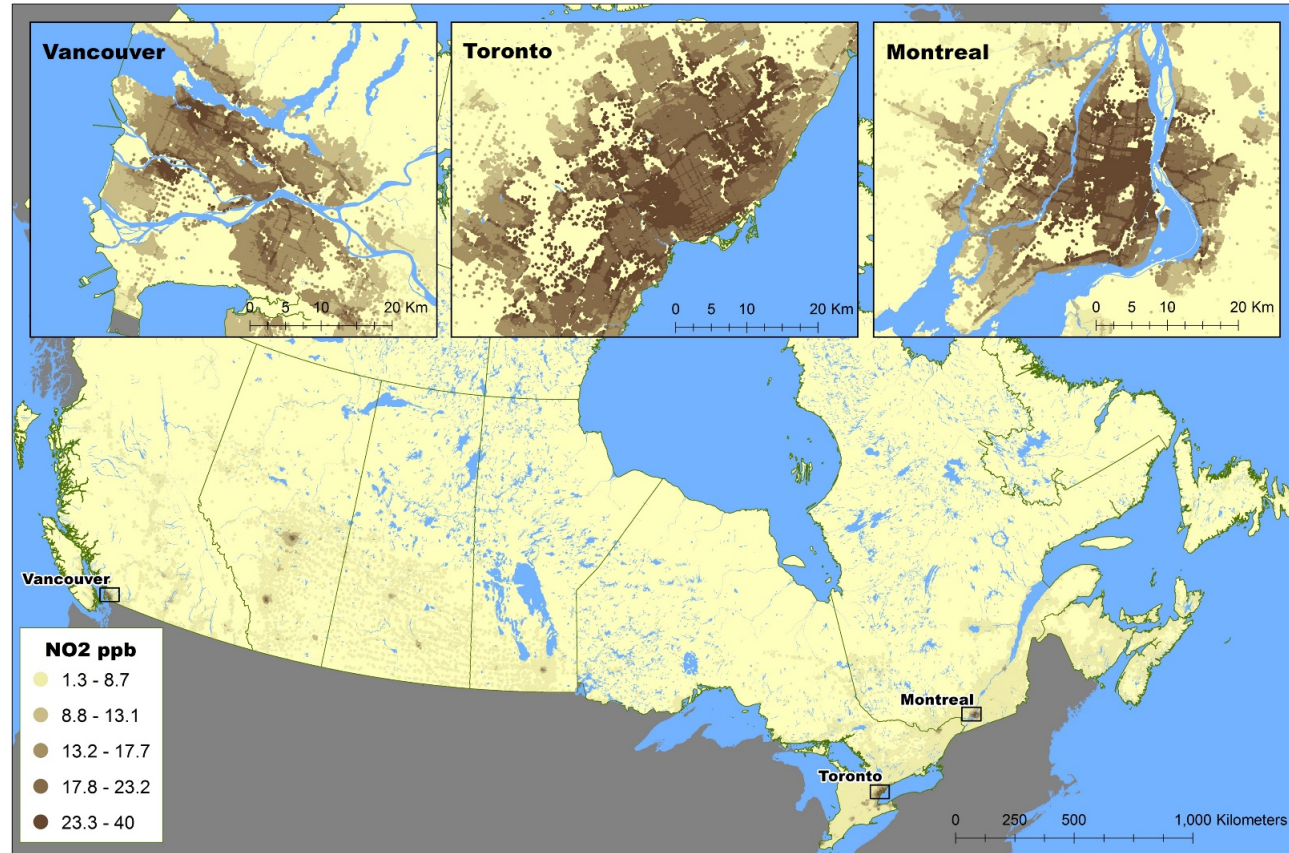
Captures temporal & spatial changes in concentrations over time

Estimates from nearest grid cell assigned to residential postal codes



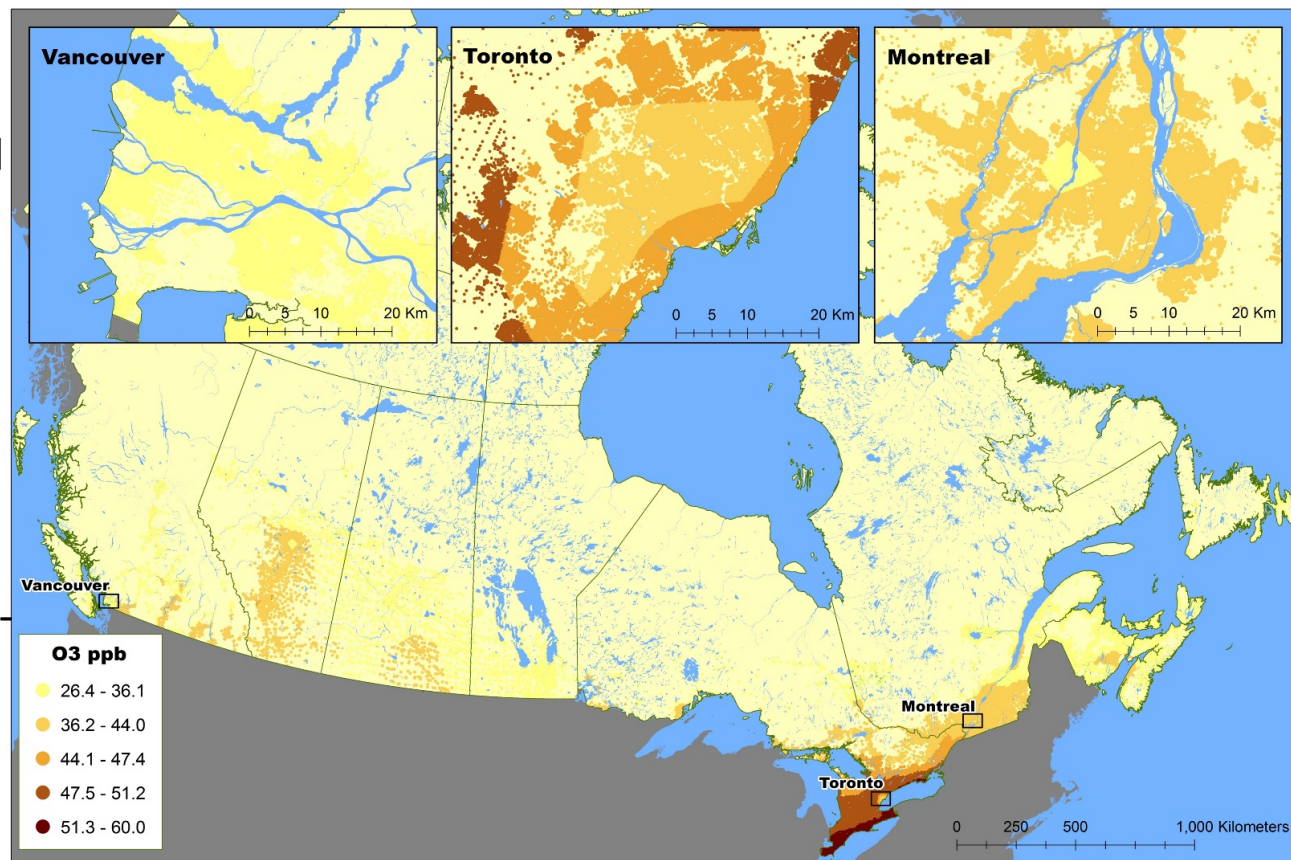
# NO<sub>2</sub> Estimation

- LUR model (satellite estimates, road length (10 km), area of industrial land use (2 km), mean summer rainfall)
- 2006 annual mean concentrations (~10 m)
- Year-adjusted using ground-based time-series measurements from 24 Census Divisions (1981 – 2016)



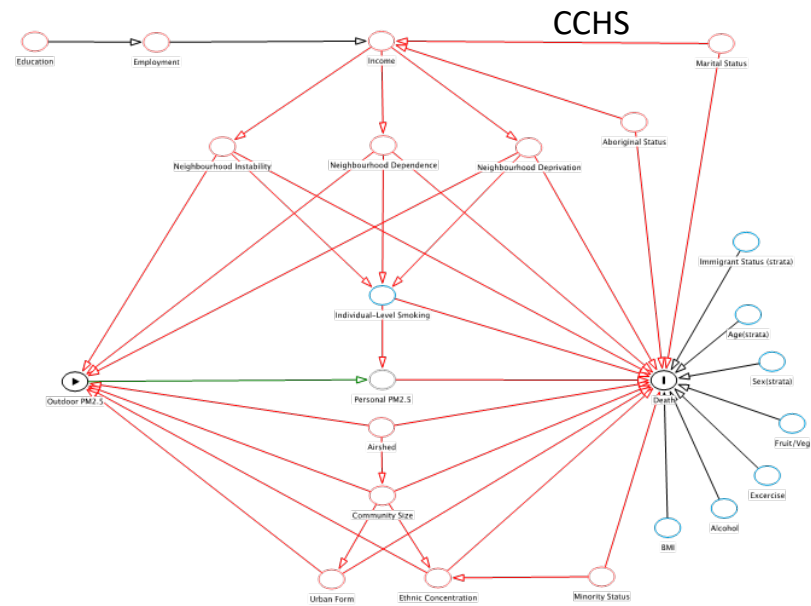
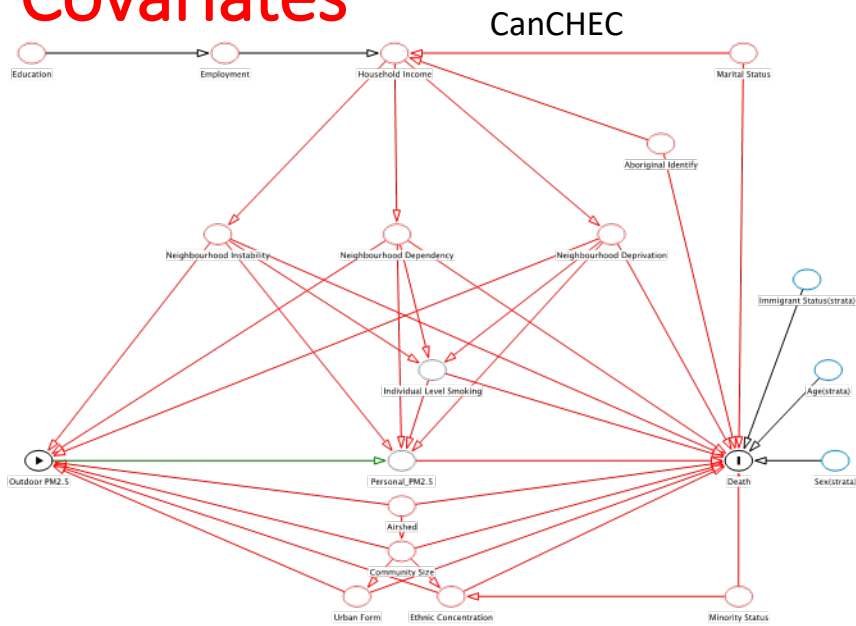
# O<sub>3</sub> Estimation

- Linear combination of hourly modelled (CTM forecast) ozone surface and ground-based observations
- Mean daily 8-hour max. warm season (1 May–31 October) concentration, 2002-16 (11 - 21 km)
- Year-adjusted using ground-based time-series measurements from 24 Census Divisions (1981 - 2016)





# Covariates



**DAG Model: Airshed, Community Size, Urban Form, (Ethnic Concentration, Dependency, Deprivation, Instability) + strata for age, sex, immigrant status (cohort)**

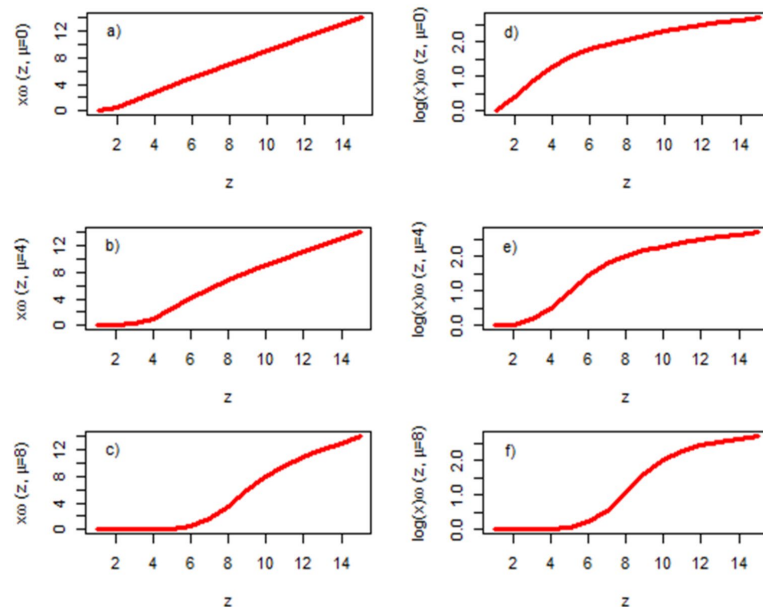
**Full model (+ available individual-level covariates)**

CanCHEC: income, education, marital status, indigenous identity, employment status, occupational class, visible minority status, and years since immigrating to Canada

**CCHS: + fruit and vegetable consumption, leisure exercise frequency, alcohol consumption, smoking, BMI**

# Analysis

- Cox Proportional Hazards
- Non-accidental deaths
- Primary exposure time-window is a 3-year moving average with 1-year lag
  - (e.g. exposure for person-year in 2001 = mean of 1998, 1999, 2000)
- Evaluate shape with restricted cubic splines (RC) (15 knots) and Shape Constrained Health Impact Function (SCHIF)
- Evaluate sensitivity of associations to:
  - Exposure time-windows (1 – 8 yrs)
  - Spatial scales (1-km<sup>2</sup> vs 10-km<sup>2</sup>)
  - Sub-populations (e.g. immigrant status)
  - Co-pollutants



Nasari et al. Air Qual Atmos Health. A class of non-linear exposure-response models suitable for health impact assessment applicable to large cohort studies of ambient air pollution. 2016; 9(8): 961–972. doi: [10.1007/s11869-016-0398-z](https://doi.org/10.1007/s11869-016-0398-z)

# Results: CCHS

- One of largest analyses of PM<sub>2.5</sub> and mortality including individual-level behavioural risk factors (4.4 million person-years)
- Over 50k deaths from non-accidental causes; up to 15 years follow-up
- Annual average PM<sub>2.5</sub> concentration: 5.9 µg/m<sup>3</sup> (s.d. 2.0)

Full (CanCHEC) model: [individual-level SES and contextual (e.g. city size, marginalization) covariates

**HR per 10 µg/m<sup>3</sup> PM<sub>2.5</sub>**

**1.13 (1.06-1.21)**

+ behavioural covariates (fruit and vegetable consumption, leisure exercise frequency, alcohol consumption, and smoking behaviours)

**1.11 (1.04-1.18)**

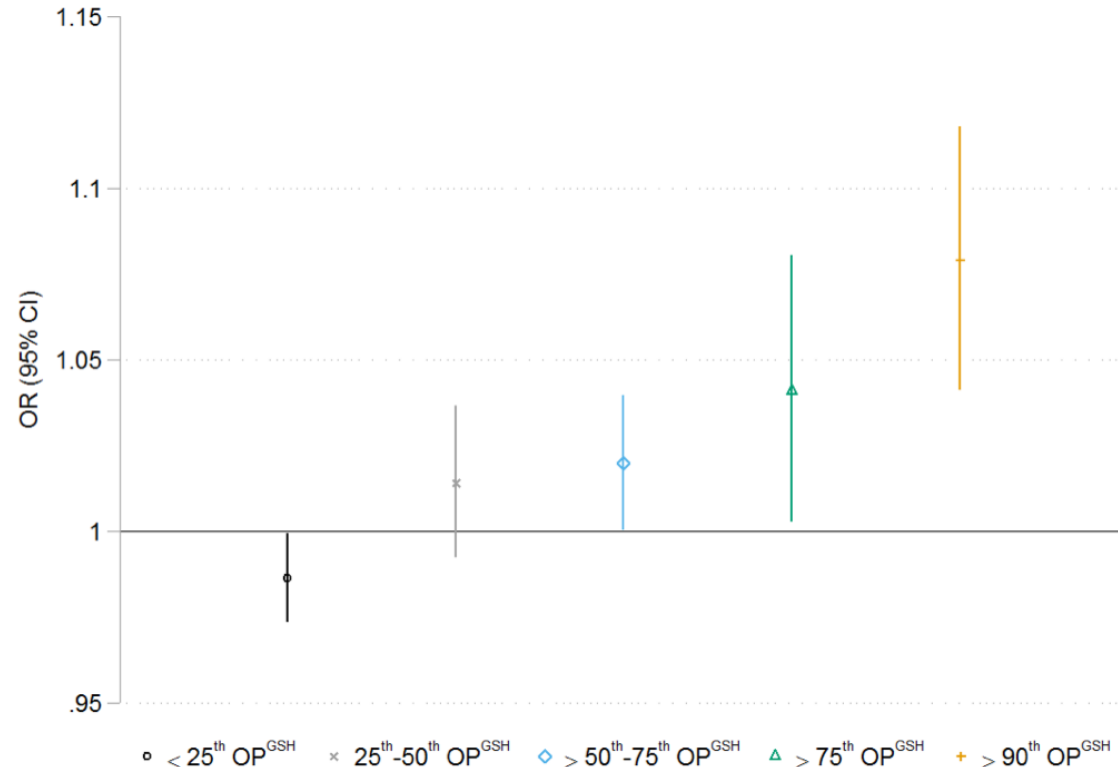
# Results: CanCHEC

- ~8.5 million individuals (151 million person-years)
- ~1.5 million deaths; up to 25 years of follow-up
- Annual average PM<sub>2.5</sub> concentration: 7.4 µg/m<sup>3</sup> (s.d. 2.9)

	HR per 10 µg/m <sup>3</sup> PM <sub>2.5</sub>
DAG model: contextual (e.g. city size, marginalization) covariates	<b>1.044 (1.031 – 1.056)</b>
Full (CanCHEC) model: [individual-level SES and contextual (e.g. city size, marginalization) covariates	<b>1.053 (1.041 – 1.065)</b>
+ NO <sub>2</sub>	<b>1.043 (1.030 – 1.056)</b>
+ O <sub>3</sub>	<b>0.982 (0.970 – 0.994)</b>
+ O <sub>x</sub>	<b>0.955 (0.943 – 0.968)</b>



## ER Visits: Myocardial Infarction (per 5 ug/m<sup>3</sup>)



*Between-City  
Differences in PM<sub>2.5</sub> OP  
Modify Risk of Acute MI*

Weichenthal et al. *Environmental Health* (2016) 15:46  
DOI 10.1186/s12940-016-0129-9

Environmental Health

RESEARCH

Open Access

Ambient PM<sub>2.5</sub> and risk of emergency room visits for myocardial infarction: impact of regional PM<sub>2.5</sub> oxidative potential: a case-crossover study

Scott Weichenthal<sup>1\*</sup>, Eric Lavigne<sup>1</sup>, Greg Evans<sup>2</sup>, Krystal Pollitt<sup>3</sup> and Rick T. Burnett<sup>1</sup>



## ER Visits: Myocardial Infarction (per 5 $\mu\text{g}/\text{m}^3$ )

Percentile of 3-day mean $\text{O}_x^{\text{wt}}$	Percentile of Regional $\text{OP}^{\text{GSH}}$			
	$\leq 50^{\text{th}}$	$> 50^{\text{th}}$	$> 75^{\text{th}}$	$> 90^{\text{th}}$
$\leq 50^{\text{th}}$	-2.0 (-5.0, 1.0)	0.57 (-4.0, 5.0)	2.9 (-1.2, 7.2)	6.0 (0.0, 13)
$> 50^{\text{th}}$	1.5 (-0.6, 3.6)	5.5 (3.0, 8.0)	6.4 (2.0, 11)	10 (7.5, 13)
$> 75^{\text{th}}$	1.5 (-1.3, 4.4)	5.7 (2.5, 9.1)	6.7 (1.8, 12)	13 (6.8, 19)
$> 90^{\text{th}}$	1.4 (-4.6, 7.8)	9.0 (3.5, 15)	9.2 (0.46, 19)	29 (26, 33)

Risk estimates reflect a 5  $\mu\text{g}/\text{m}^3$  change in  $\text{PM}_{2.5}$ . All models are adjusted for 3-day mean ambient temperature and relative humidity (cubic splines)

*The largest risk is observed in regions with high  $\text{PM}_{2.5}$  OP and high  $\text{O}_x$*

Weichenthal et al. *Environmental Health* (2016) 15:46  
DOI 10.1186/s12940-016-0129-9

Environmental Health

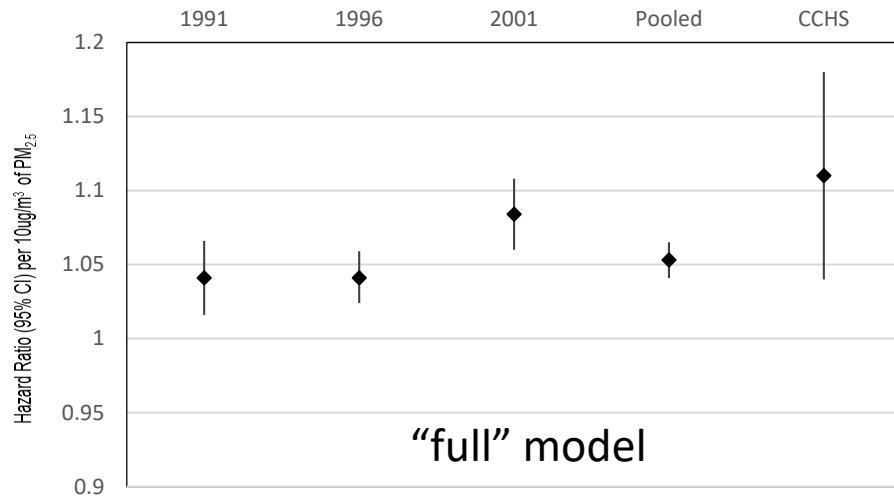
RESEARCH

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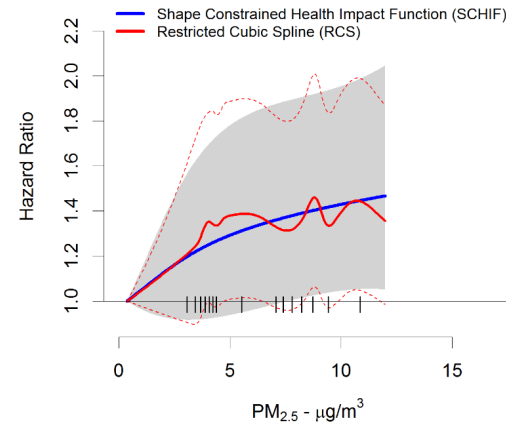
Ambient  $\text{PM}_{2.5}$  and risk of emergency room visits for myocardial infarction: impact of regional  $\text{PM}_{2.5}$  oxidative potential: a case-crossover study



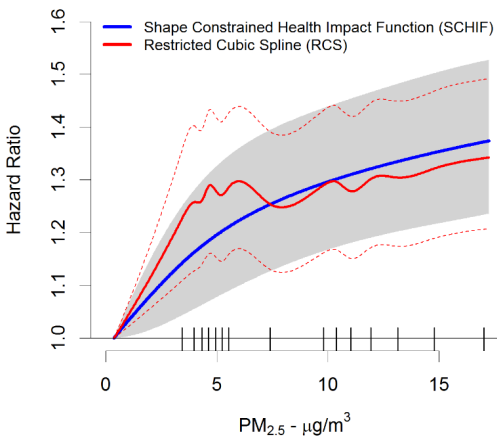
Scott Weichenthal<sup>1\*</sup>, Eric Lavigne<sup>1</sup>, Greg Evans<sup>2</sup>, Krystal Pollitt<sup>3</sup> and Rick T. Burnett<sup>1</sup>



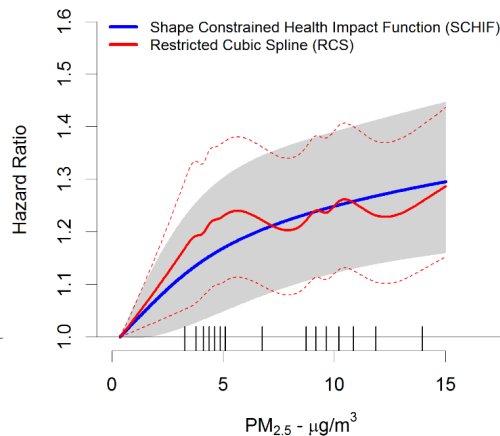
## Canadian Community Health Survey



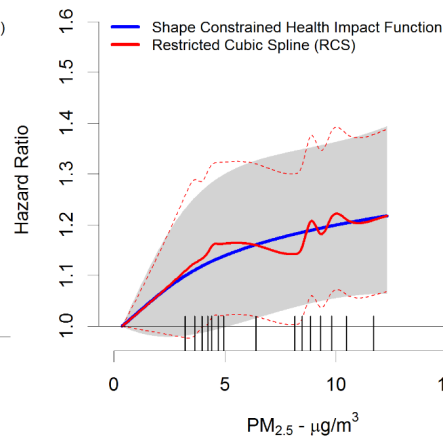
## 1991 CanCHEC



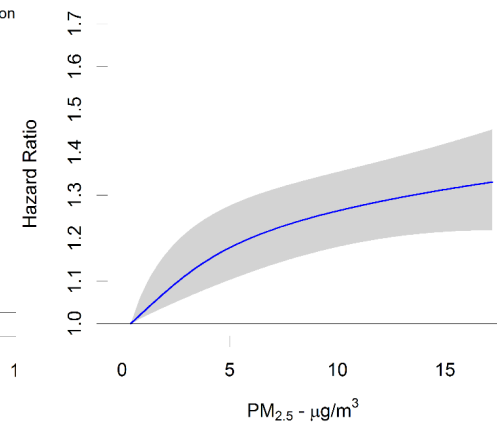
## 1996 CanCHEC



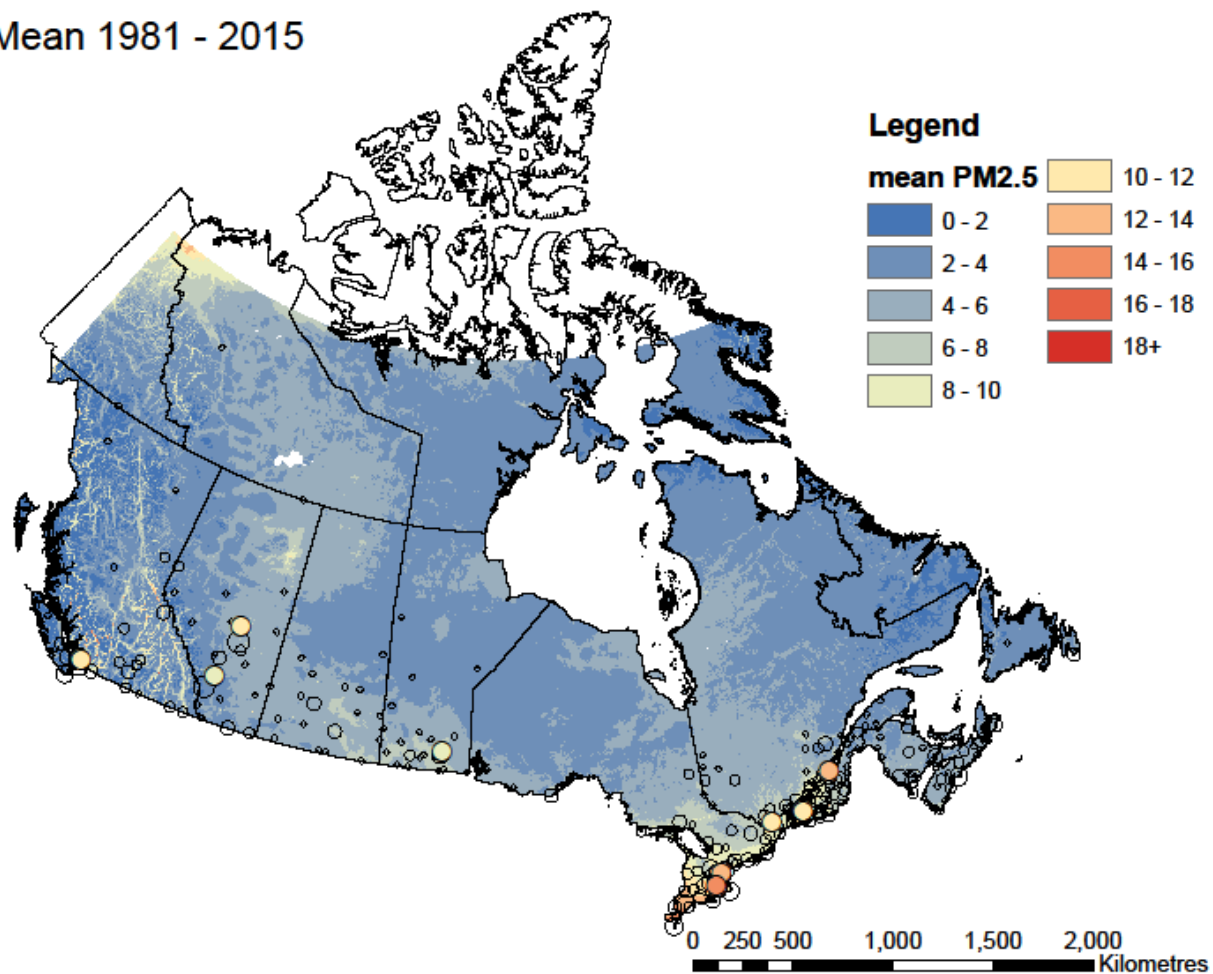
## 2001 CanCHEC



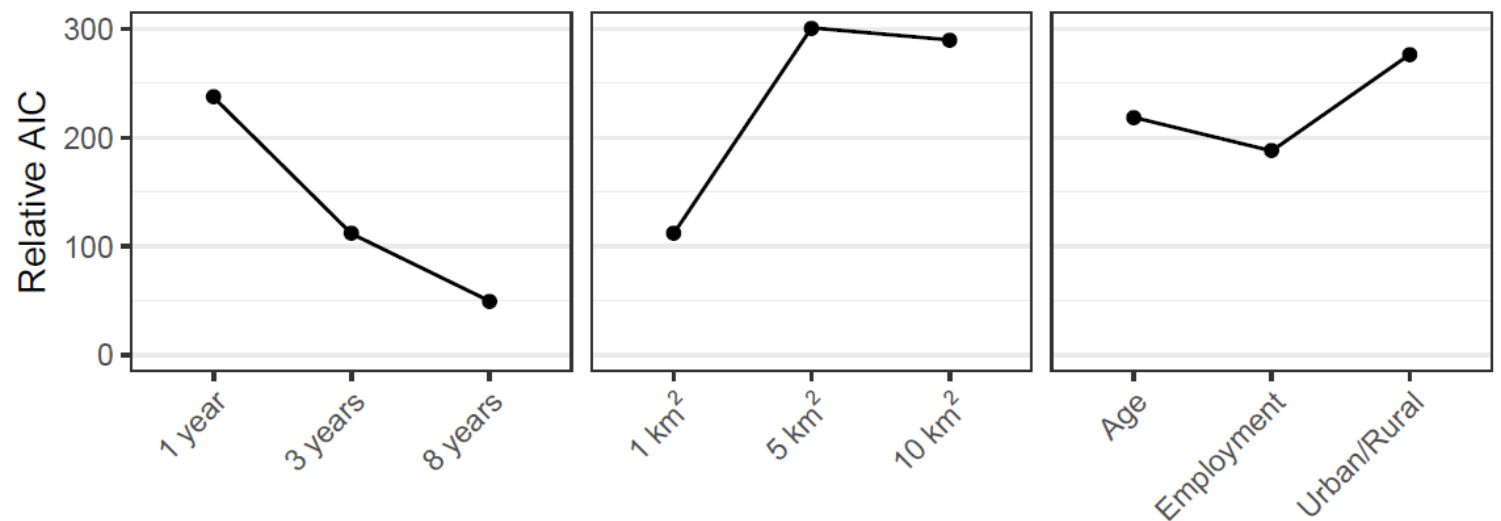
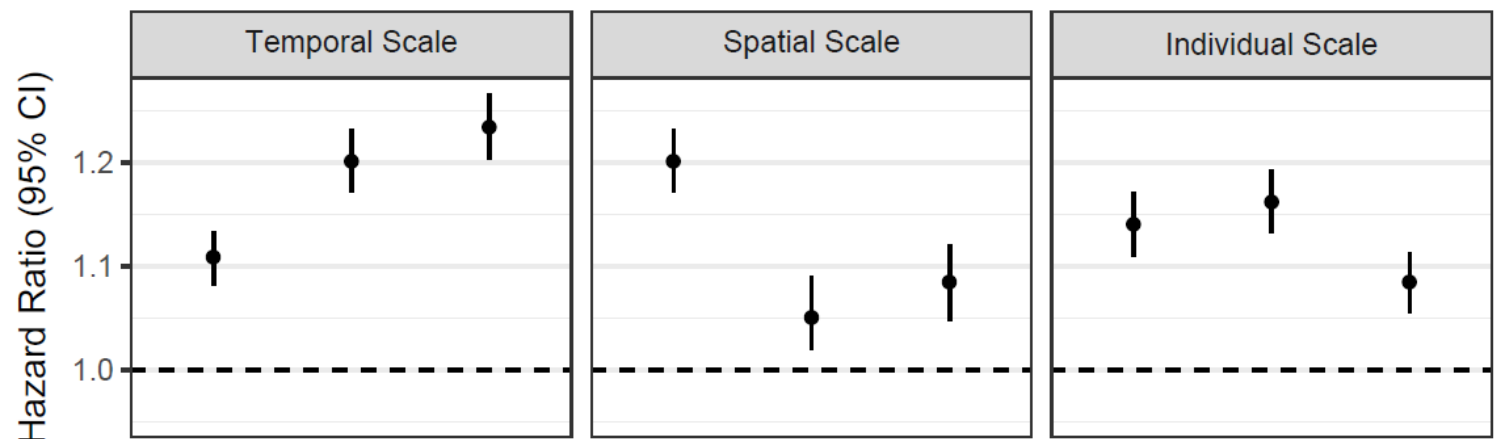
## Pooled SCHIF



Mean 1981 - 2015







## In progress

- 🍁 (further) Refined exposure estimates
- 🍁 Specific causes of death
- 🍁 Restricted exposure analyses (12, 10, 8, or 6  $\mu\text{g}/\text{m}^3$ )

## Summary points

- In both cohorts, supra-linear association between  $\text{PM}_{2.5}$  and non-accidental mortality (to concentrations as low as  $5 \mu\text{g}/\text{m}^3$  or lower)
- No evidence of threshold or sub-linear association
- Associations not affected substantially by adjustment for smoking or other health behaviours

# Publications



- **Latimer and Martin.** Interpretation of measured aerosol mass scattering efficiency over North America using a chemical transport model. Atmos. Chem. Phys. 2019
- **Meng et al.** Estimated long-term (1981-2016) concentrations of ambient fine particulate matter across North America from chemical transport modeling, satellite remote sensing and ground-based measurements. Environ Sci Technol. 2019
- **Erickson et al.** Evaluation of a method to indirectly adjust for unmeasured covariates in the association between fine particulate matter and mortality. Environ Res. 2019
- **Crouse et al.** Evaluating the sensitivity of PM<sub>2.5</sub>-mortality associations to the spatial and temporal scale of exposure assessment at low particle mass concentrations. Epidemiology. 2019
- **Christidis et al.** Low concentrations of fine particle air pollution and mortality in the Canadian Community Health Survey cohort. Environmental Health. 2019
- **Pappin et al.** Nonlinear associations between low levels of fine particulate matter and mortality across three cycles of the Canadian Census Health and Environment Cohort. EHP. 2019
- **Erickson et al.** Disease assimilation: the mortality impacts of fine particulate matter on immigrants to Canada. Health Reports. 2020
- **Pinault et al.** Diabetes status and susceptibility to the effects of PM<sub>2.5</sub> exposure on cardiovascular mortality in a national Canadian cohort. Epidemiology. 2018
- **Pinault et al.** Associations between fine particulate matter and mortality in the 2001 Canadian Census Health and Environment Cohort. Environ Res. 2017



# MAPLE Team

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# THANK YOU

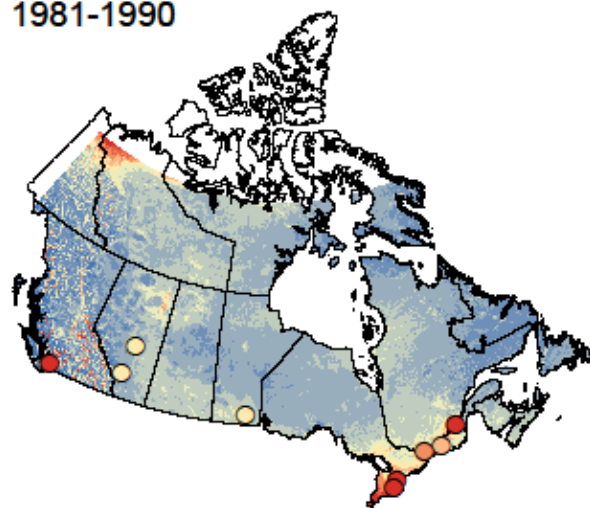




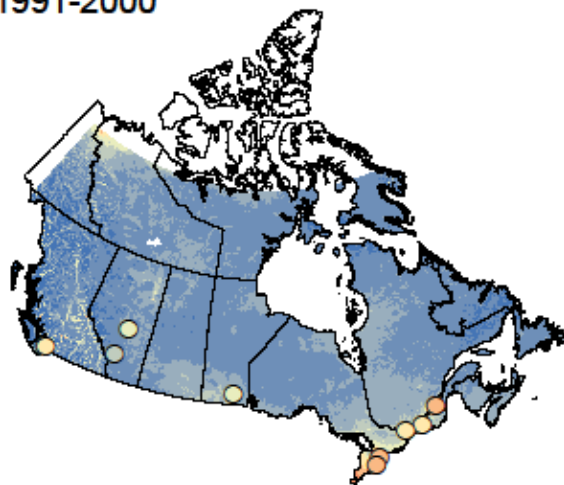
# EXTRA SLIDES



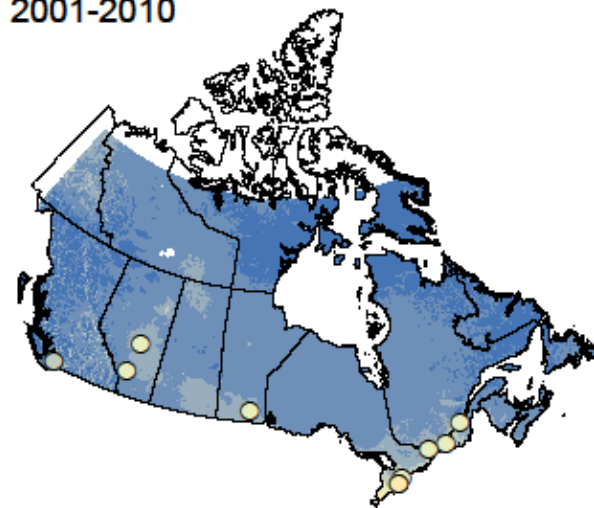
1981-1990



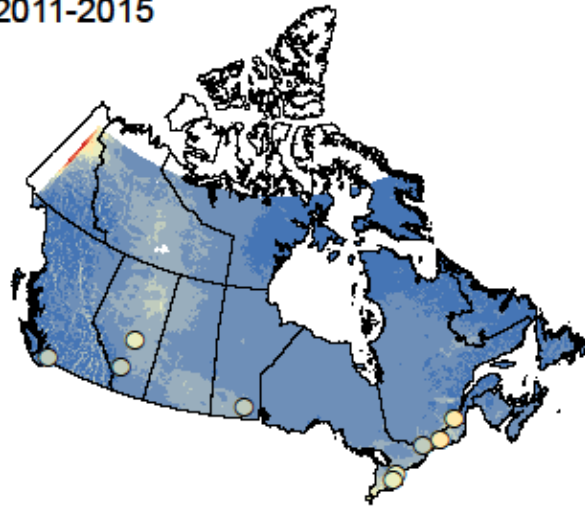
1991-2000



2001-2010

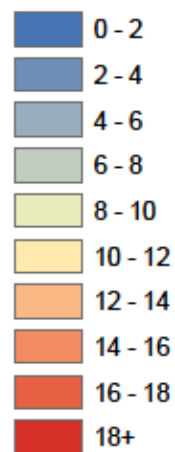


2011-2015

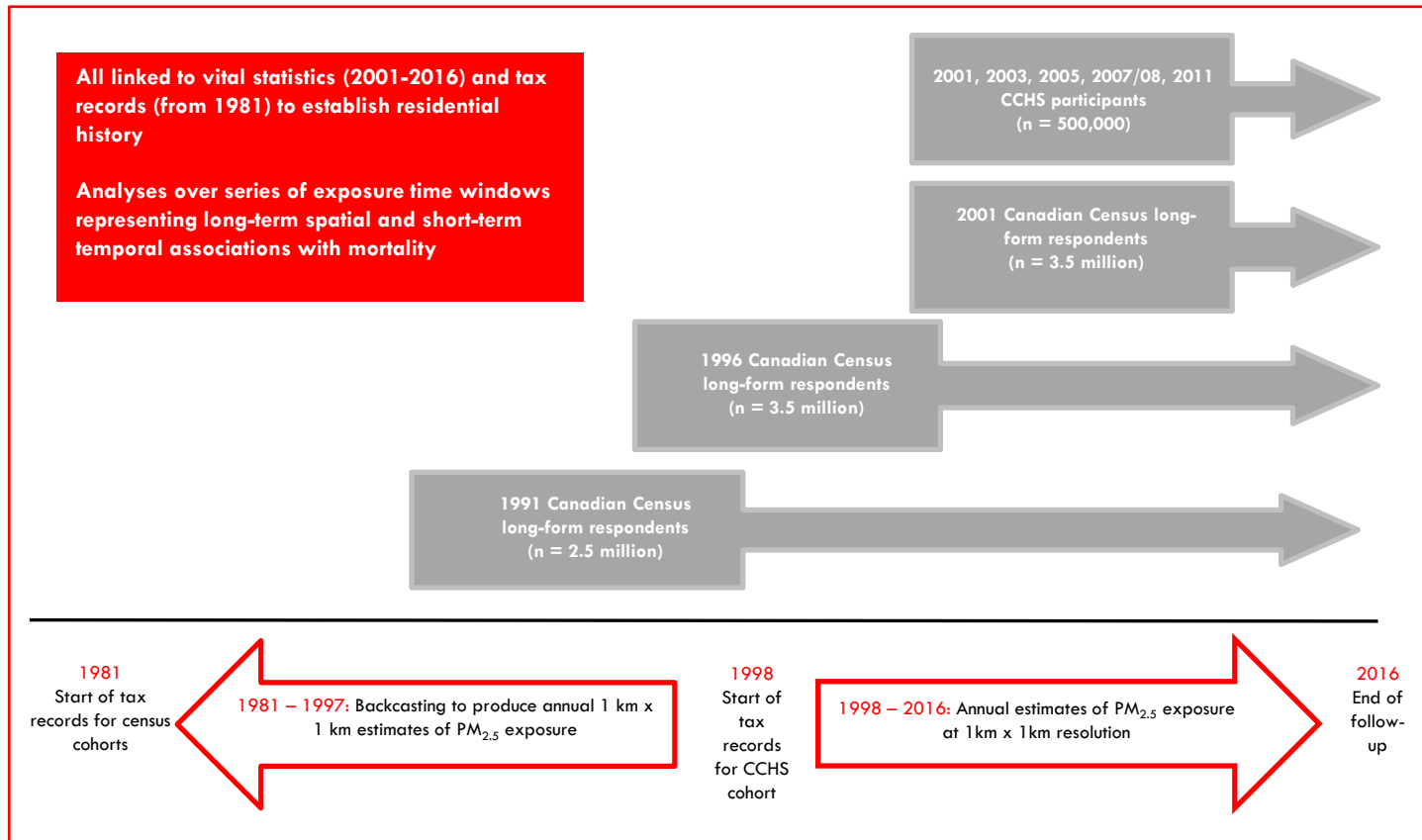


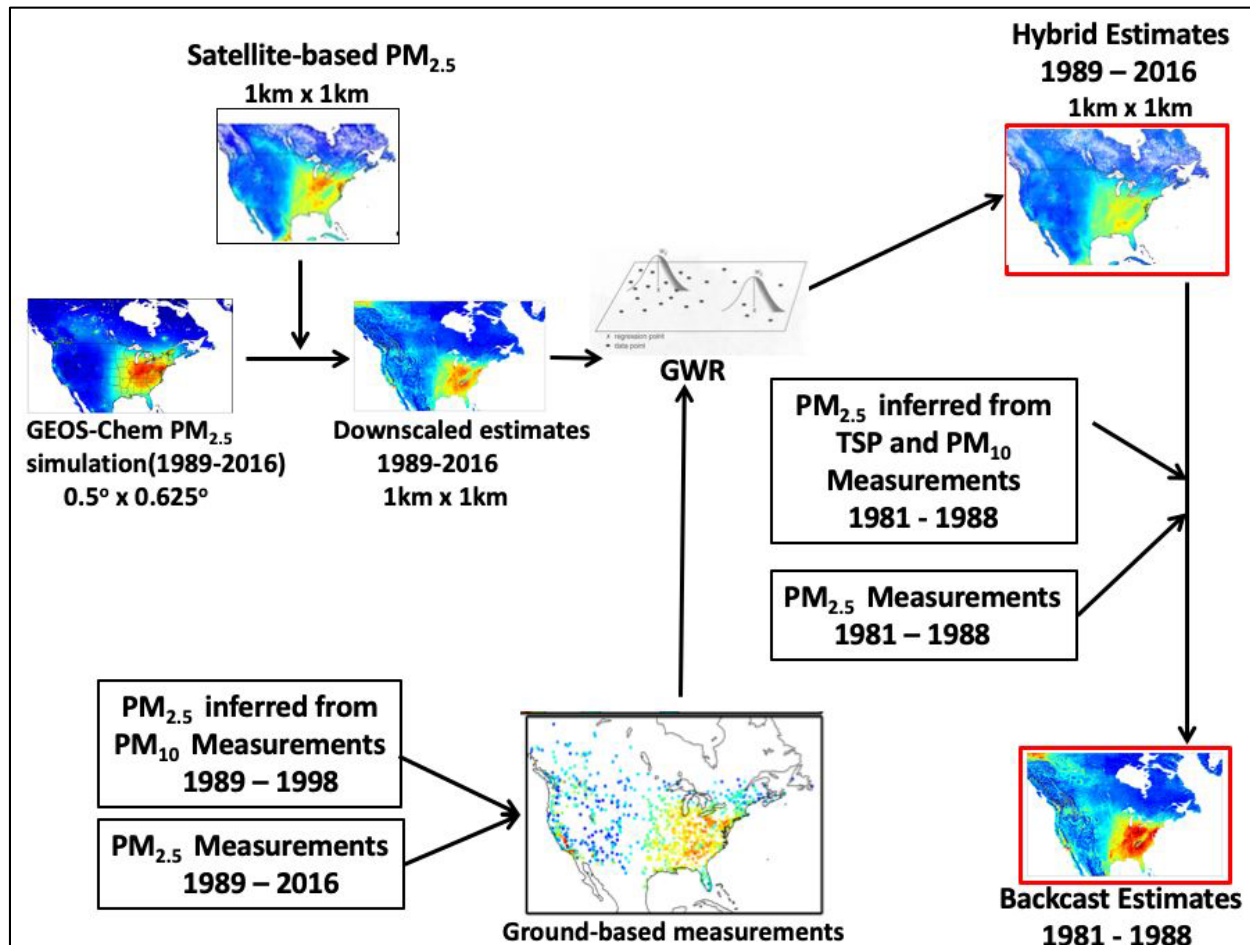
**Legend**

**PM2.5 estimate**

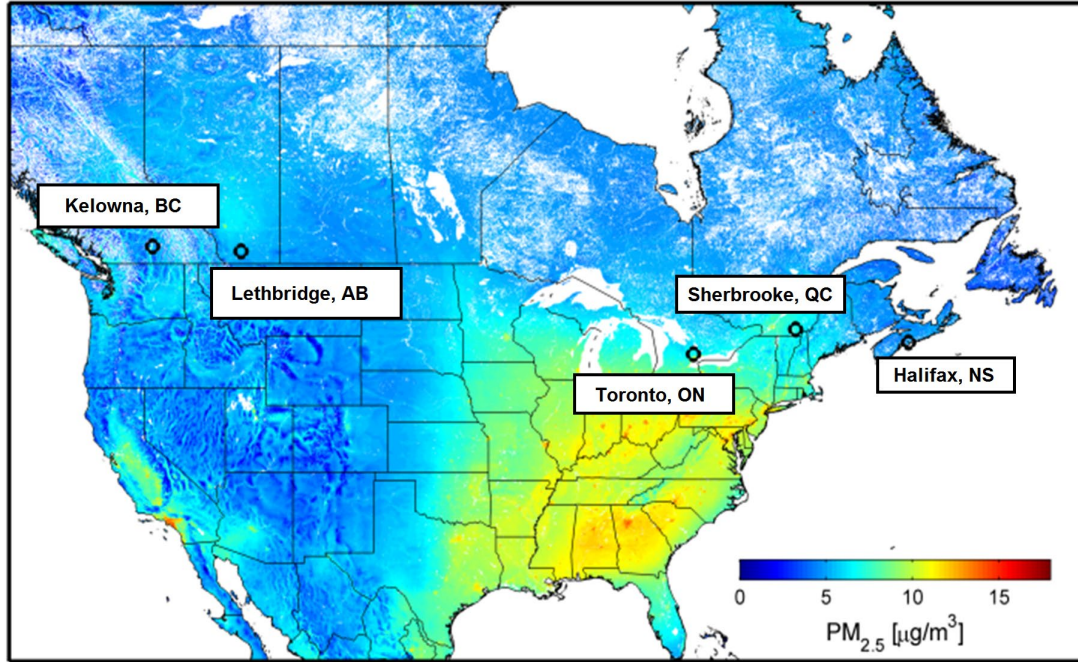


# Cohorts and follow-up





# SPARTAN network expansion



Sherbrooke



Measurements of  $\eta$  (PM<sub>2.5</sub>/AOD)

$$\eta = \frac{\text{PM}_{2.5}}{\text{AOD}} = \left( \frac{b_{sp, \text{overpass}}}{\text{AOD}_{\text{overpass}}} \right) \left( \frac{b_{sp, 24h}}{b_{sp, \text{overpass}}} \right) \left( \frac{\text{Mass Scattering Efficiency PM}_{2.5, 24h}}{b_{sp, 24h}} \right)$$

$b_{sp}$  = nephelometer measurements of aerosol scatter

overpass = satellite overpass time

## Geographic Identifiers & Contextual Covariates

## Regional airsheds

**Neighbourhood-level marginalization:**

- material deprivation
- residential instability
- dependency
- ethnic concentration





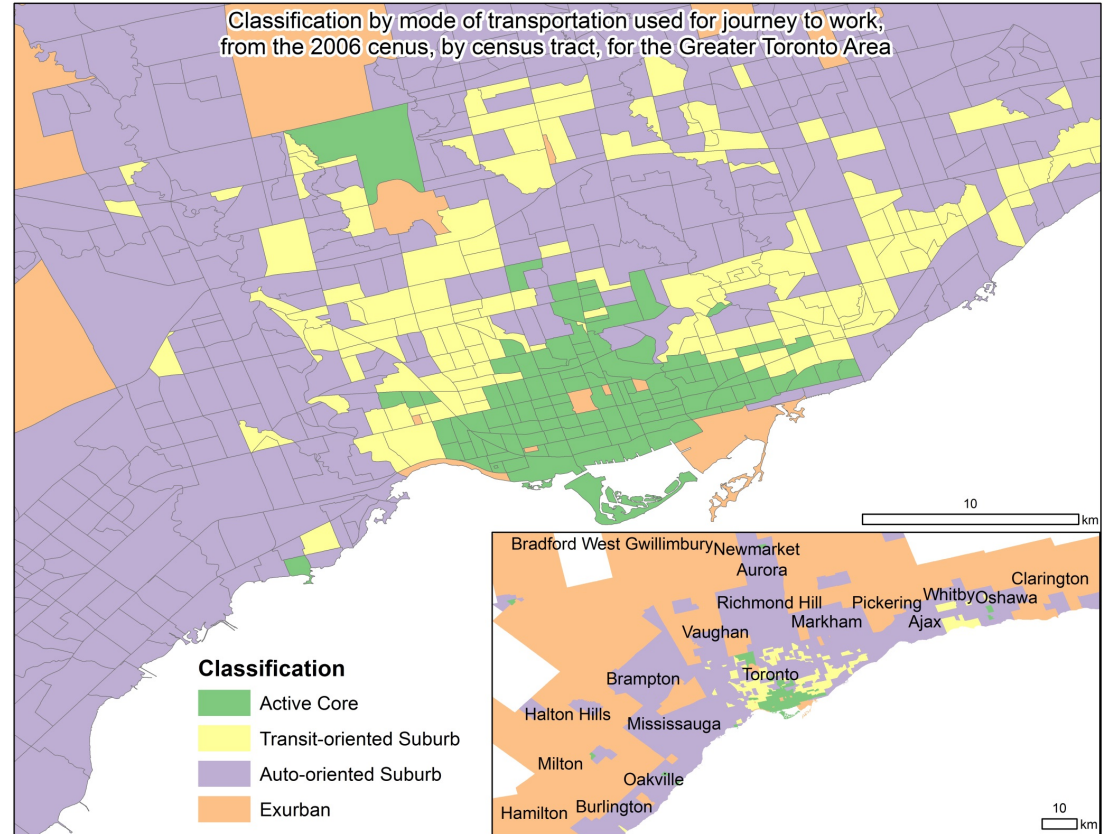
# Geographic Identifiers & Contextual Covariates

## Community size

(6 levels. small town → large city)

## Urbanization

(4 levels. transit reliant suburb → urban core,)



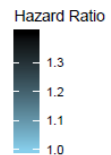
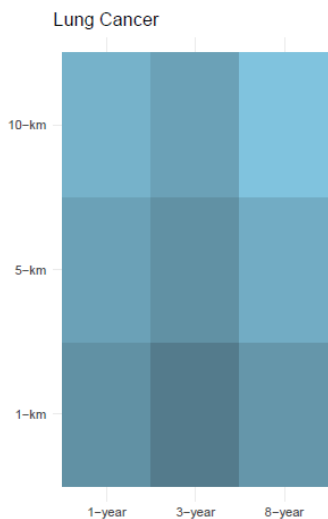
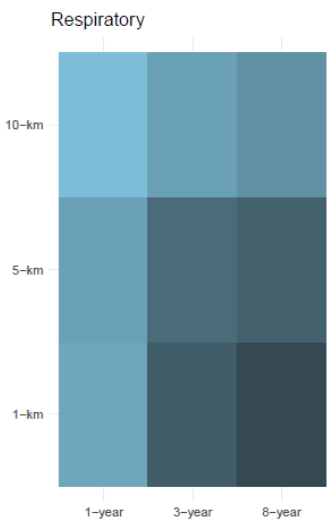
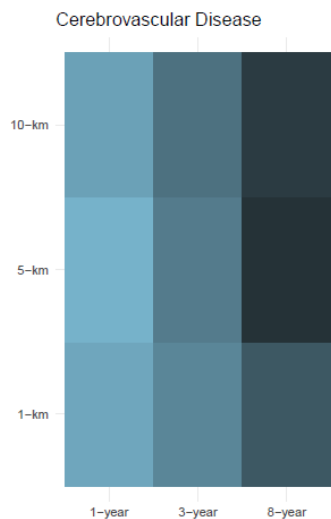
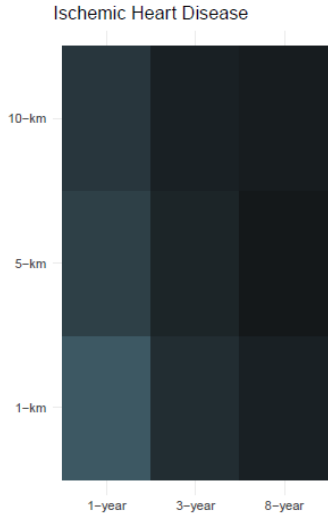
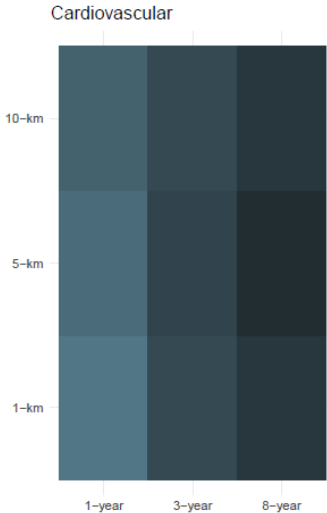
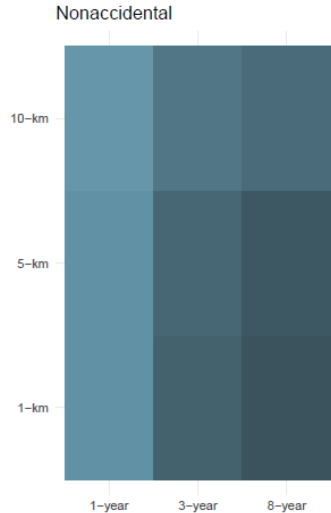
# Individual and contextual covariates

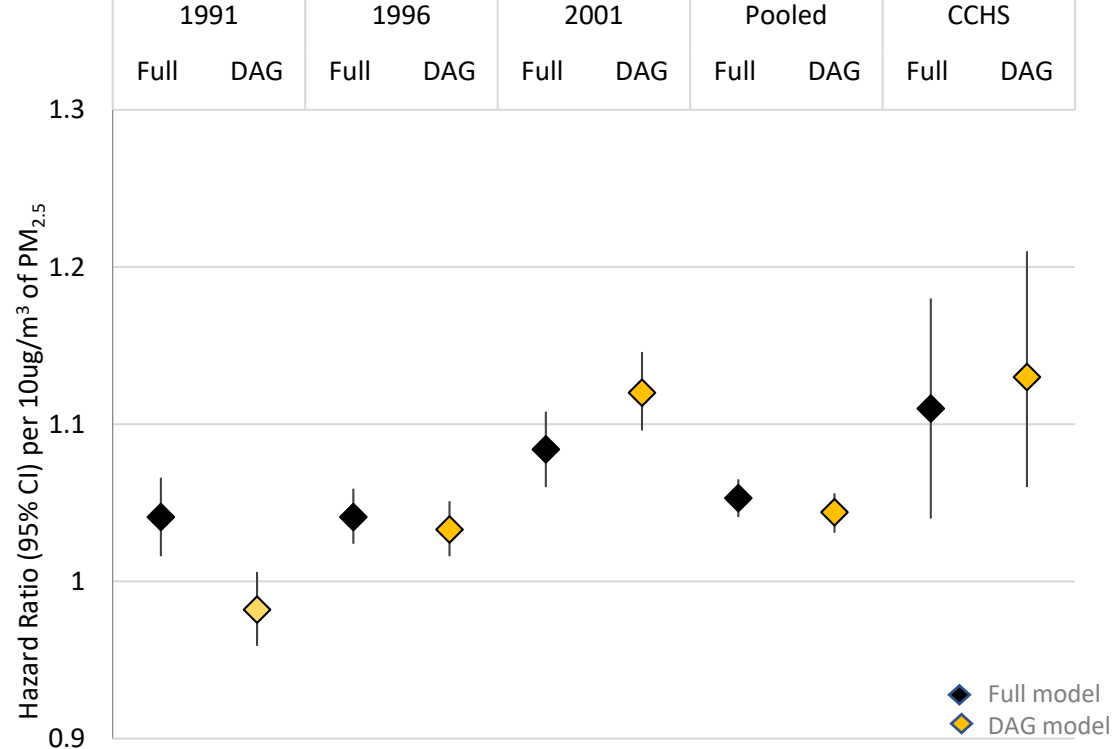
Individual Variables at Baseline	CanCHEC	CCHS
Income	X	X
Education	X	X
Occupation	X	some
Immigration (time, source region)	X	X
Ethnicity	X	X
Household composition (marital status, living arrangements)	X	X
Housing (type, tenure, repair)	X	X
Education	X	X
Aboriginal identity	X	X
Alcohol consumption		X
Smoking (current, former)		X
Fruit and vegetable consumption		X
Physical activity		X
Body mass index		X
Contextual Variables	Source	
% unemployed, % low income, % low education, % recent immigrants	Census	
Social deprivation (CanMARG)	Census-derived Index	
Population centre size, Airshed, Climate zone	Regional	

# Individual and contextual covariates

Individual Variables at Baseline	Harvard	CanCHE C	CCHS
Income	X (Medicaid eligible)	X	X
Education	(contextual)	X	X
Occupation		X	some
Immigration (time, source region)		X	X
Ethnicity	X	X	X
Household composition (marital status, living arrangements)		X	X
Housing (type, tenure, repair)	(contextual)	X	X
Education	(contextual)	X	X
Aboriginal identity	(contextual)	X	X
Alcohol consumption	(contextual, BRFSS)		X
Smoking (current, former)	(contextual, BRFSS)		X
Fruit and vegetable consumption	(contextual, BRFSS)		X
Physical activity	(contextual, LDL-C, A1C + other BRFSS)		X
Body mass index	(contextual, BRFSS)		X
Contextual Variables		Source	
% unemployed, % low income, % low education, % recent immigrants	Household Income, Home Value, Education Rate, Owner Occupied Housing, Hispanic/Black Population	Census	







**Figure 2.** Hazard Ratio estimates and 95% confidence intervals for the association between PM<sub>2.5</sub> and non-accidental mortality for Full and DAG-informed models