



# Sensitivity Analysis of Ambient NO<sub>2</sub> Concentration to Primary Emission Sources in Alberta, Canada using WRF/CMAQ Modeling

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# Outline

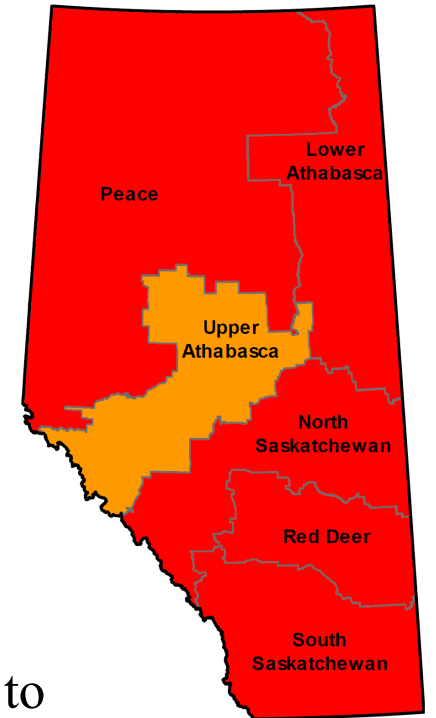




## Motivation

### Canadian Ambient Air Quality Standards (CAAQS)

- Alberta air zones have exceeded the 2020 NO<sub>2</sub> CAAQS<sup>3</sup>
- New and more stringent standards for NO<sub>2</sub> concentration will be in effect starting 2025
- Annual average NO<sub>2</sub> threshold will be reduced from 17 ppb to 12 ppb
- How can the integration of WRF/CMAQ modeling and data-driven models be employed to formulate impactful strategies for achieving the National Ambient Air Quality Standards (NAAQS) NO<sub>2</sub> goals?



**CAAQS Status**



# Study Area

- Area of 661,848 km<sup>2</sup> almost larger than any state in USA other than Texas and Alaska.
- Population 4.6 million;
- The 7th most livable city in the world, Calgary, is located in Alberta
- Alberta is home to the stunning Banff and Lake Louise.
- Alberta's oil sands has the fourth-largest proven oil reserves in the world.
- Alberta is the highest NO<sub>x</sub> emitter in Canada with 681 ktons/year

## Canada and Alberta

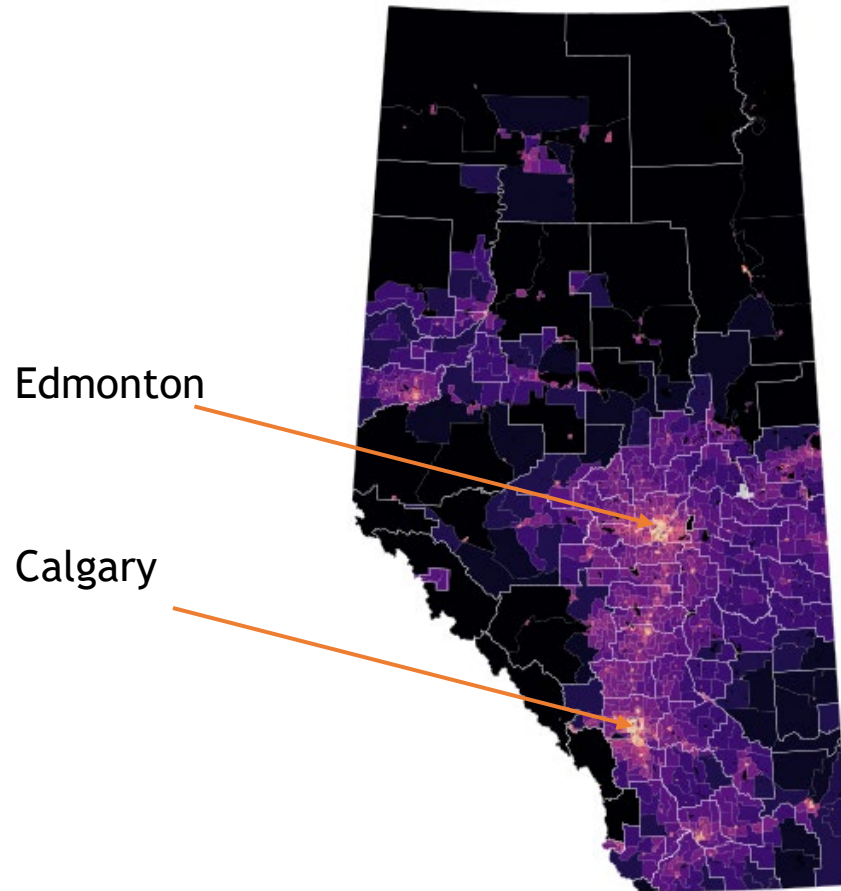


### References:

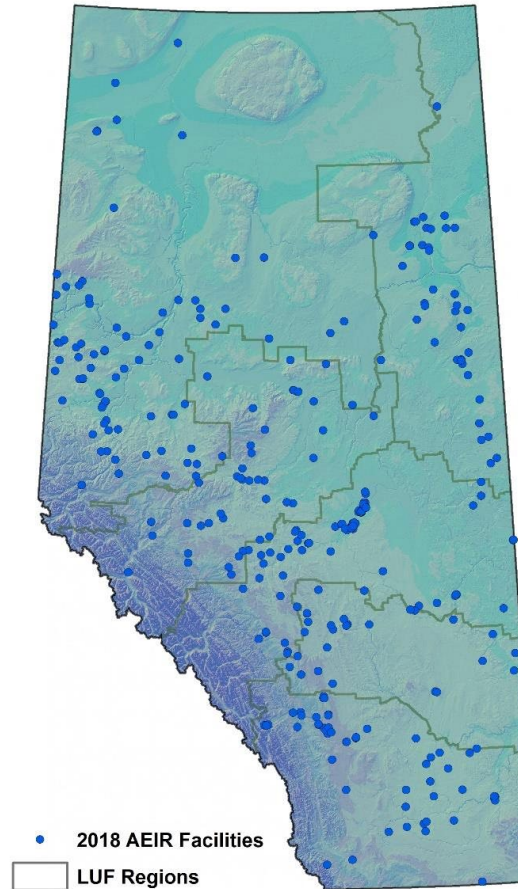
List of municipalities in Alberta. (2023, July 19). In Wikipedia.  
[www.alberta.ca](http://www.alberta.ca)



# Study Area



Population Density in Alberta



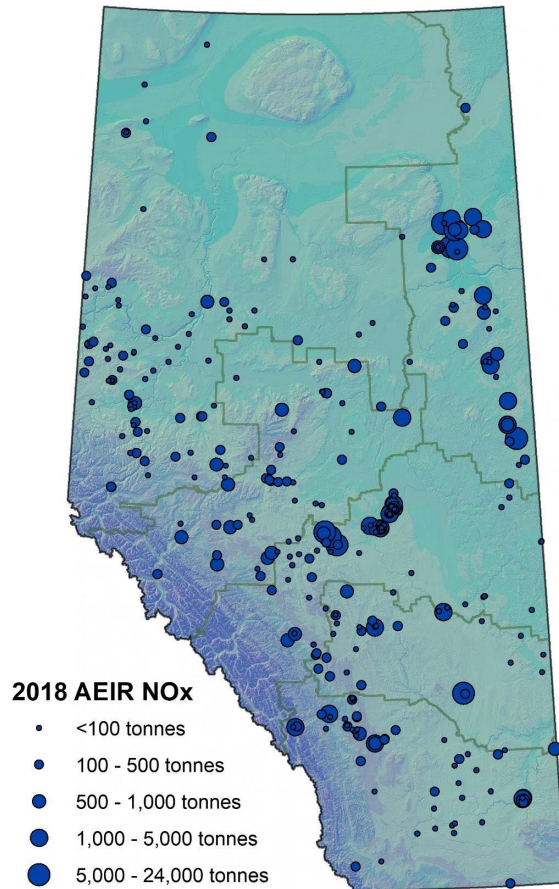
Spatial Distribution of 2018 AEIR Facilities  
AEIR: Annual Emissions Inventory Reporting

**References:**

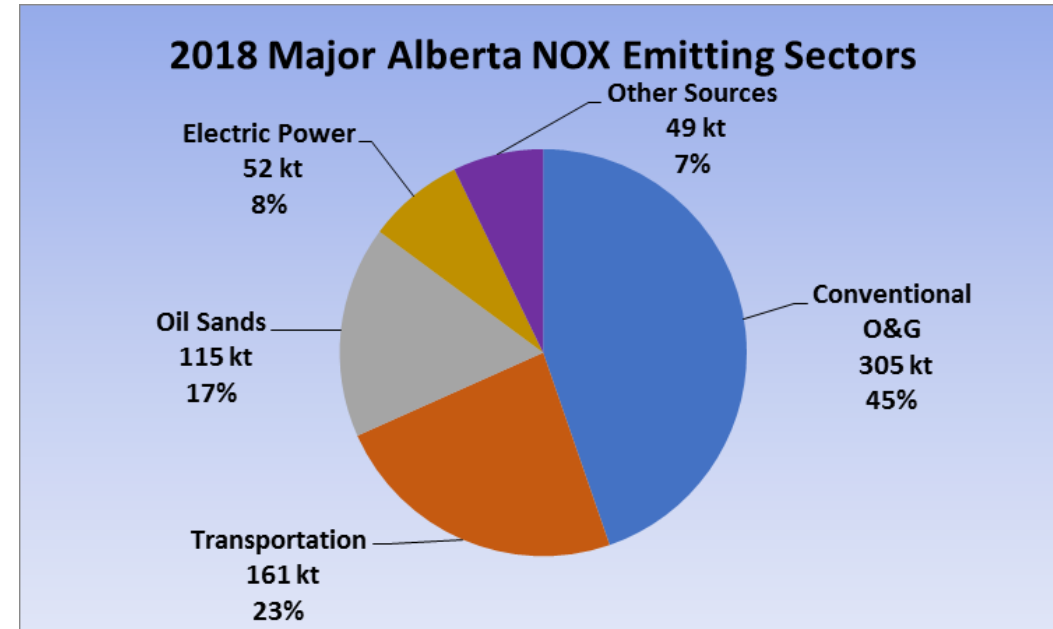
Results of the Alberta Annual Emissions Inventory Reporting Program: 2018 Inventory Year Demographics of Alberta. (2023, July 7). In Wikipedia.



# Emission inventory of Alberta Province



Locations and Proportional Tonnages of 2018 NOx Emitting AEIR Facilities

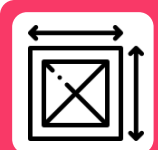


2018 APEI Alberta Major Emitting Anthropogenic Sectors

APEI: Air Pollutant Emissions Inventory

**References:**

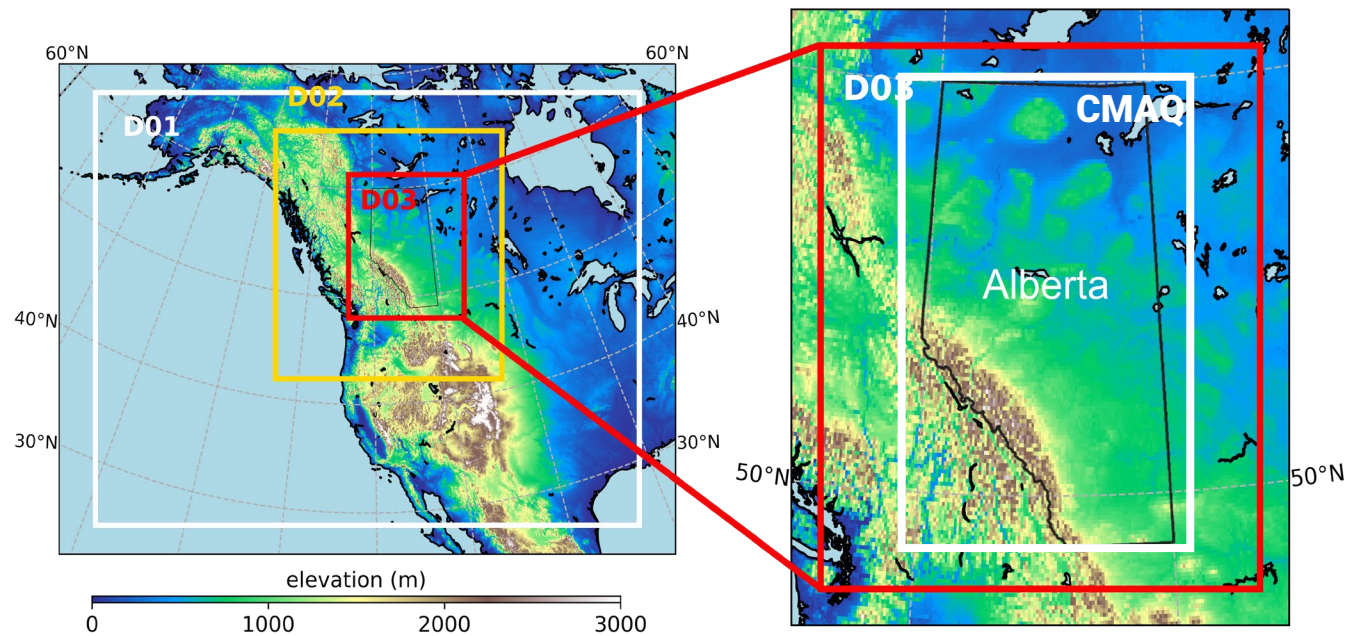
Results of the Alberta Annual Emissions Inventory Reporting Program: 2018 Inventory Year



# Computational Domain

## Details of domains

Domain	Horizontal Grid (i x j)	Horizontal grid size (km x km)	Vertical Layer	Total # of Elements
WRF_D1	157 x 121	36 x 36	32	607,904
WRF_D2	196 x 208	12 x 12	32	1,304,576
WRF_D3	301 x 361	4 x 4	32	3,477,152
CMAQ	201 x 306	4 x 4	32	1,968,192



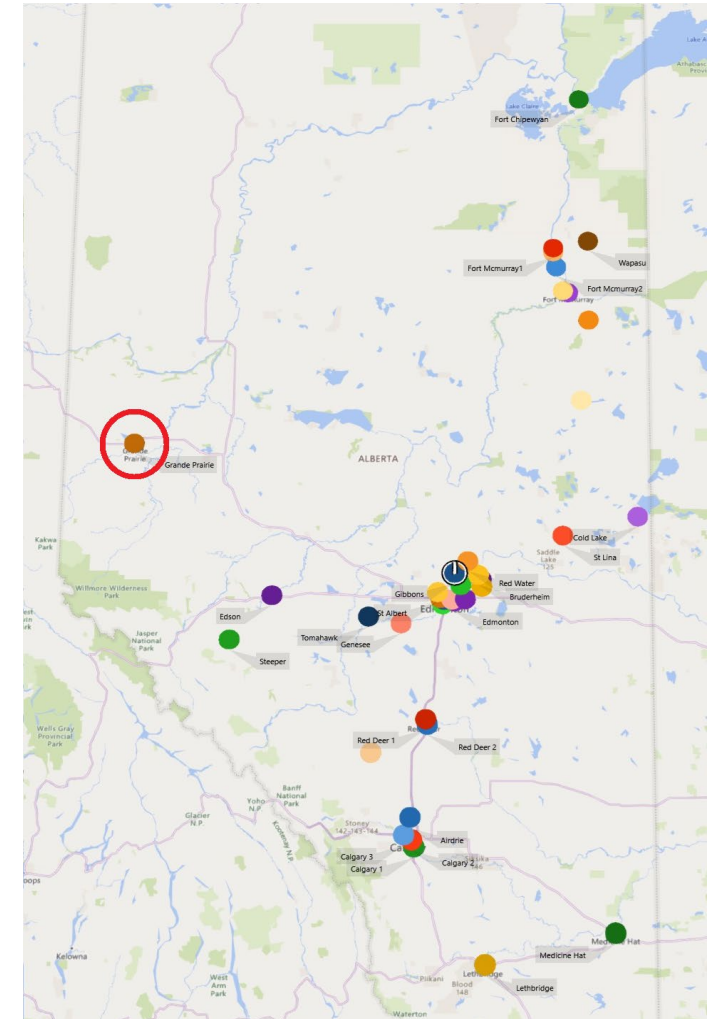


# Validation

- Observation data from 40 NAPS program stations
- Ground level hourly averaged observation data were compared to the modeling results

## Parameter used for validation process

Model	Validation Parameter
WRF	2 (m) Temperature
	10 (m) Wind Speed
CMAQ	NO <sub>2</sub>
	O <sub>3</sub>

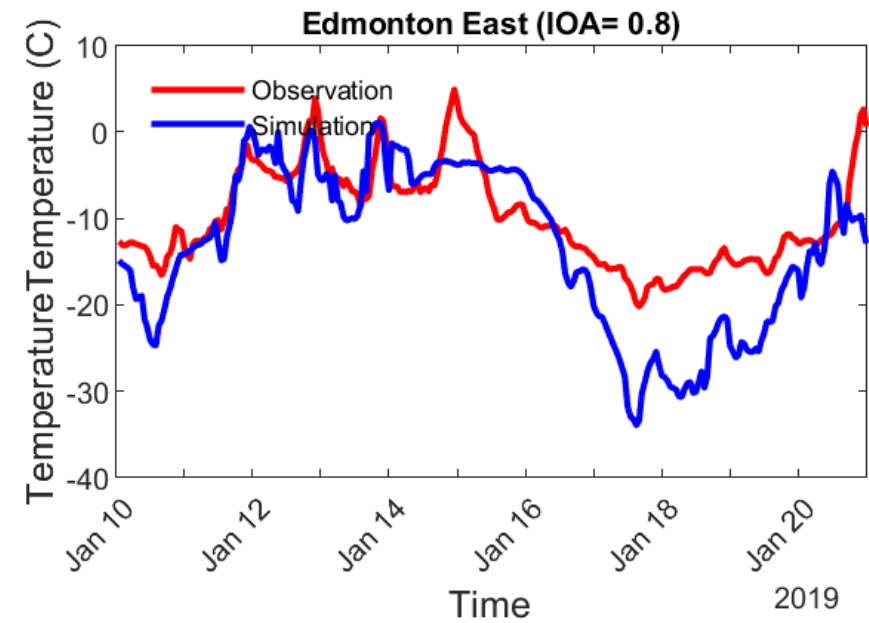
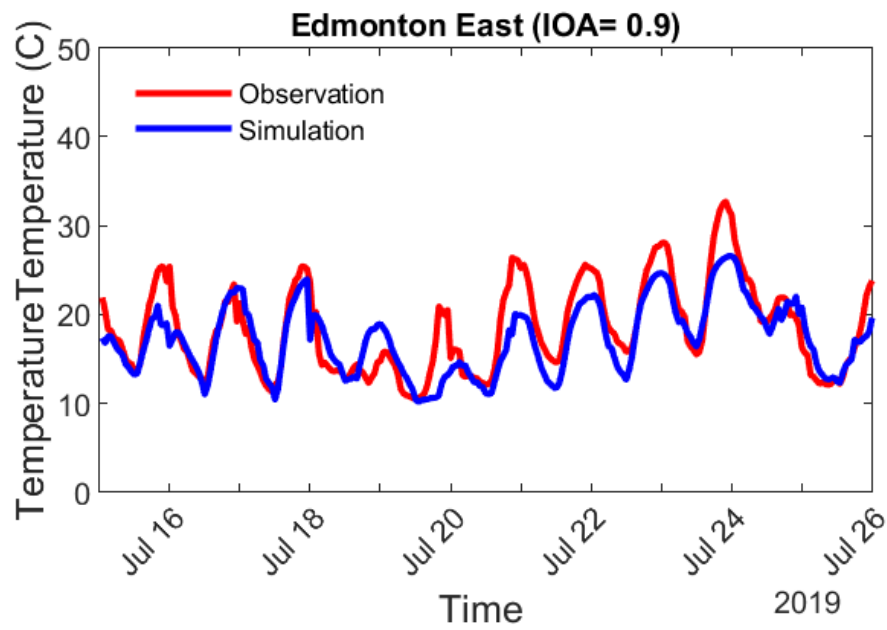


*NAPS monitoring stations*





# Validation-WRF

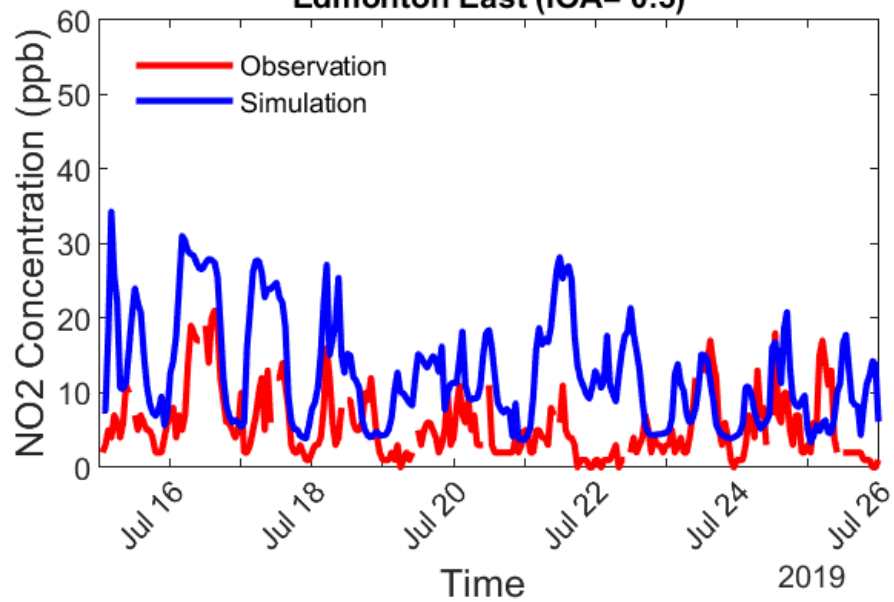




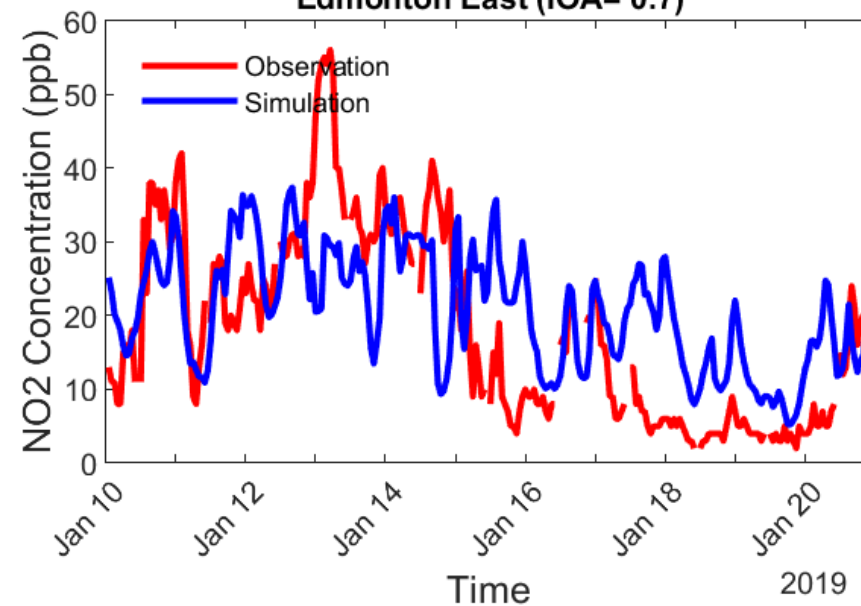
# Validation-CMAQ



Edmonton East (IOA= 0.5)

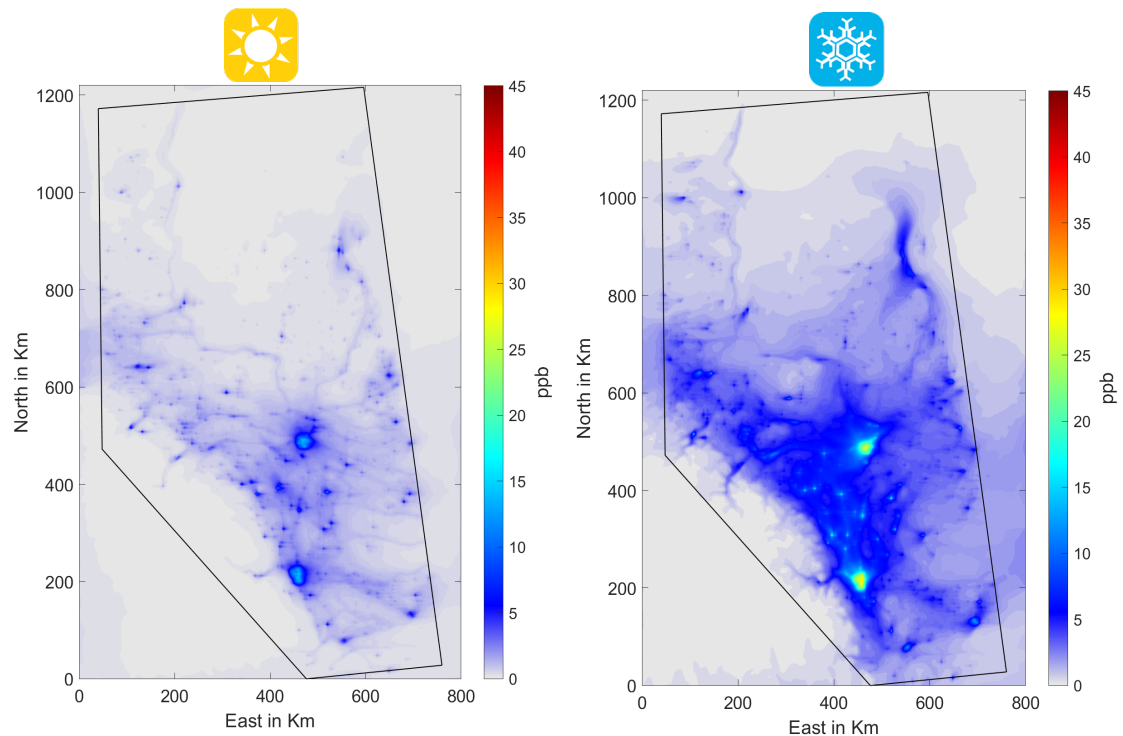


Edmonton East (IOA= 0.7)

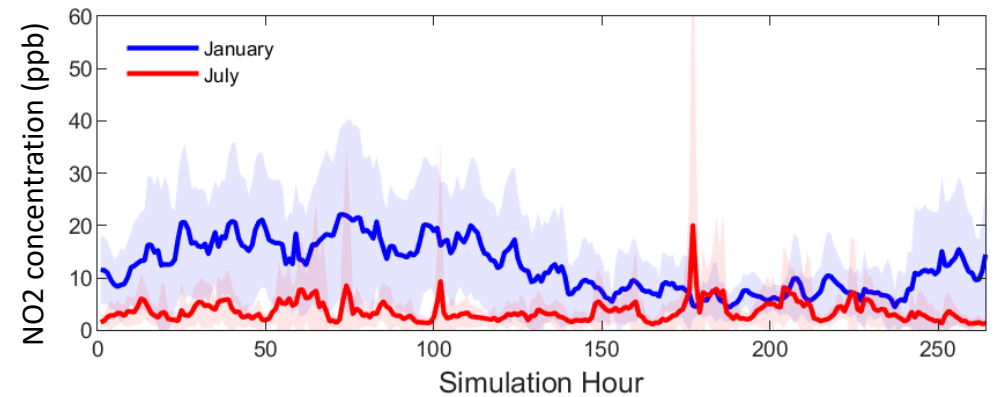




# Base case outputs – No emission changes



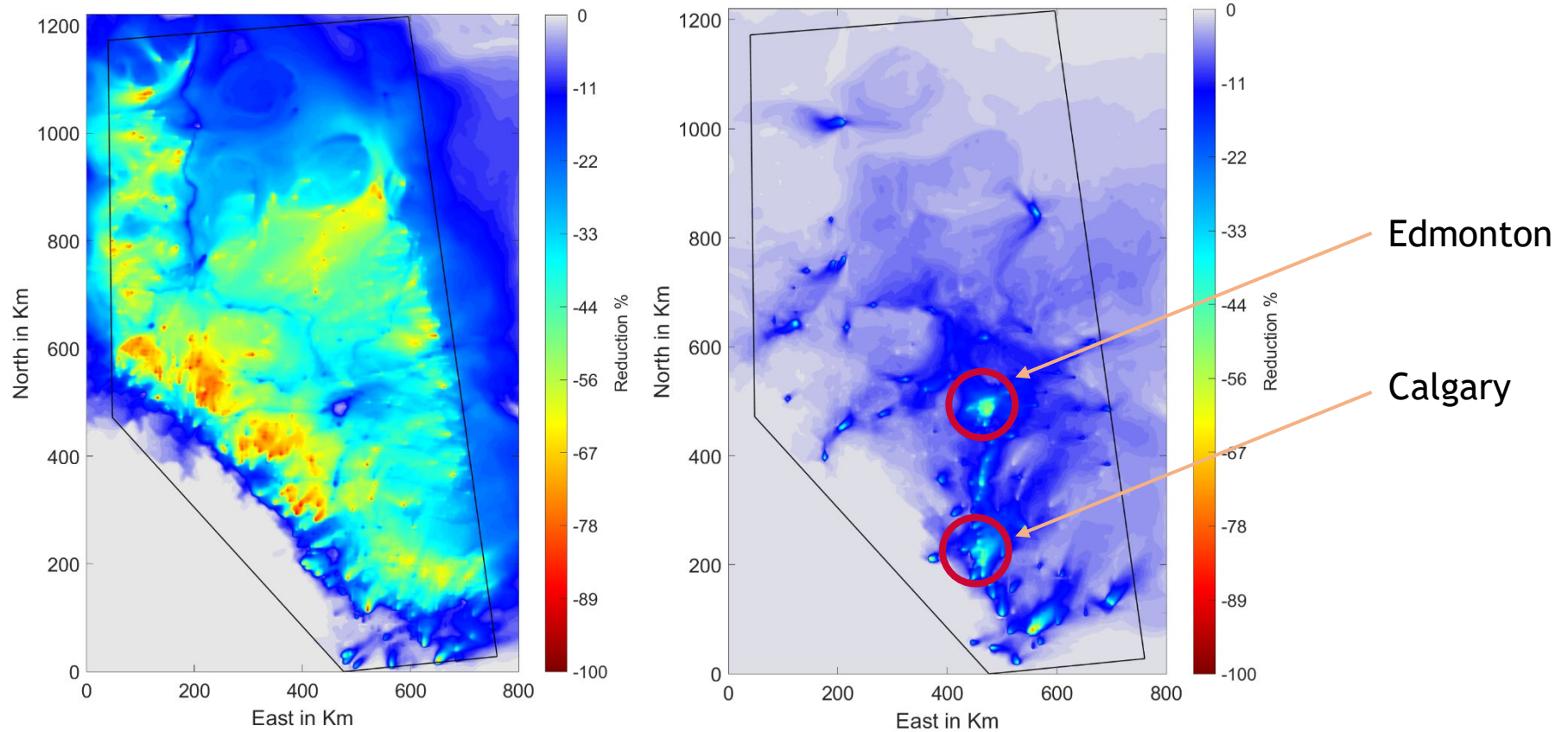
*NO<sub>2</sub> concentration*





# Brute force sensitivity analysis

Average NO<sub>2</sub> Reduction by removal of each primary emission source





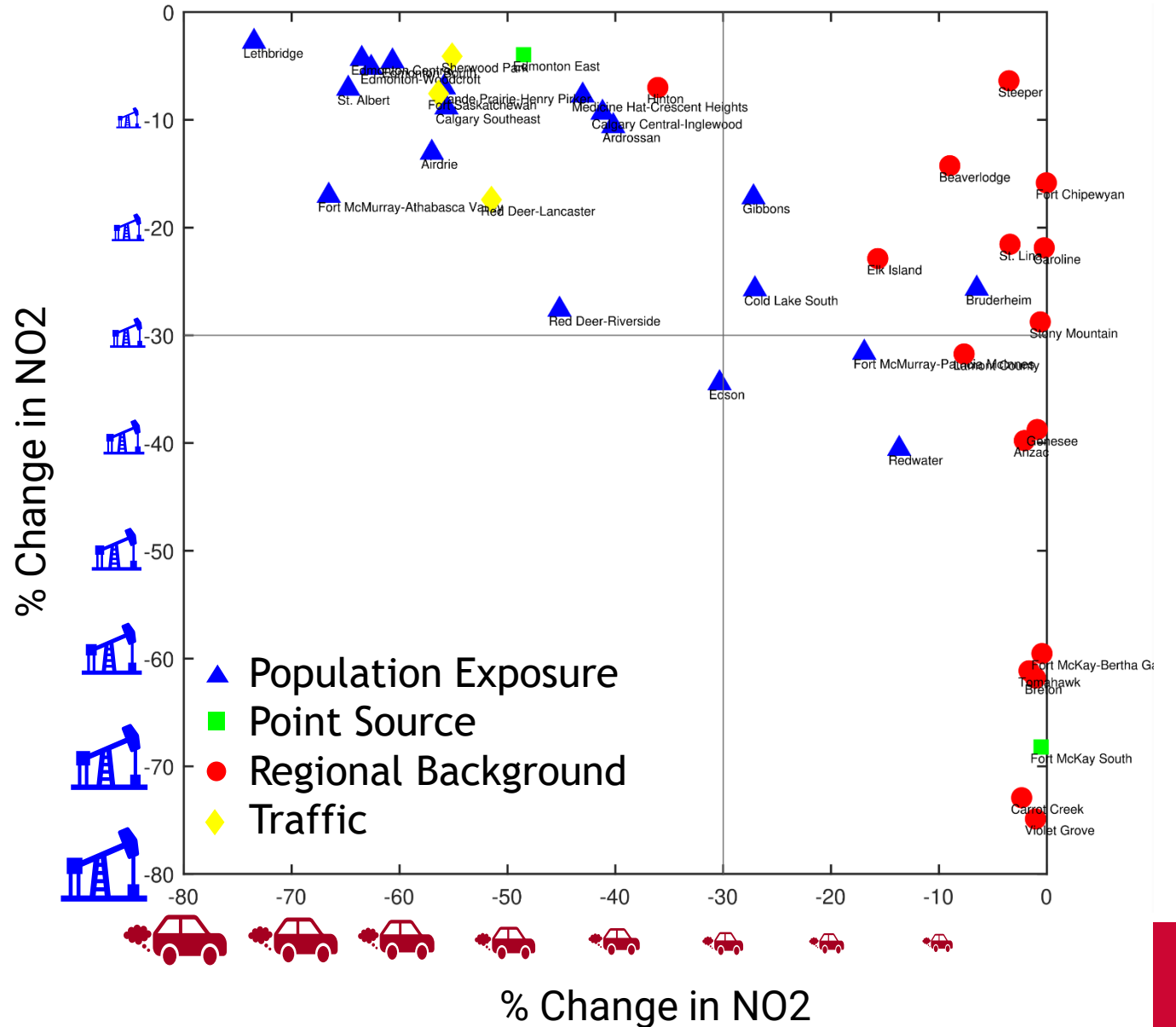
# Results

## Zero-out Scenario:

- Different response of each category of AQMs is observed.
- PE stations are more affected by zeroing out the mobile sources.
- RB stations are more affected by zeroing out the UOG sources.

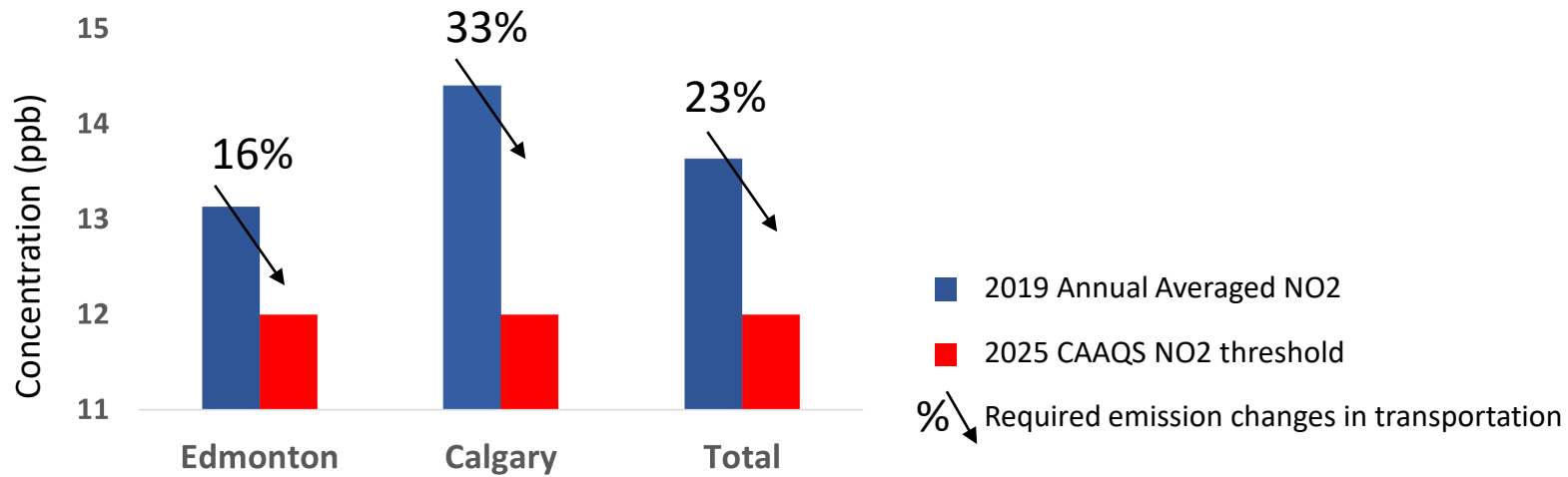
PE: Population exposure

RB: Regional background





# Results – Meeting CAAQS 2025 Objectives



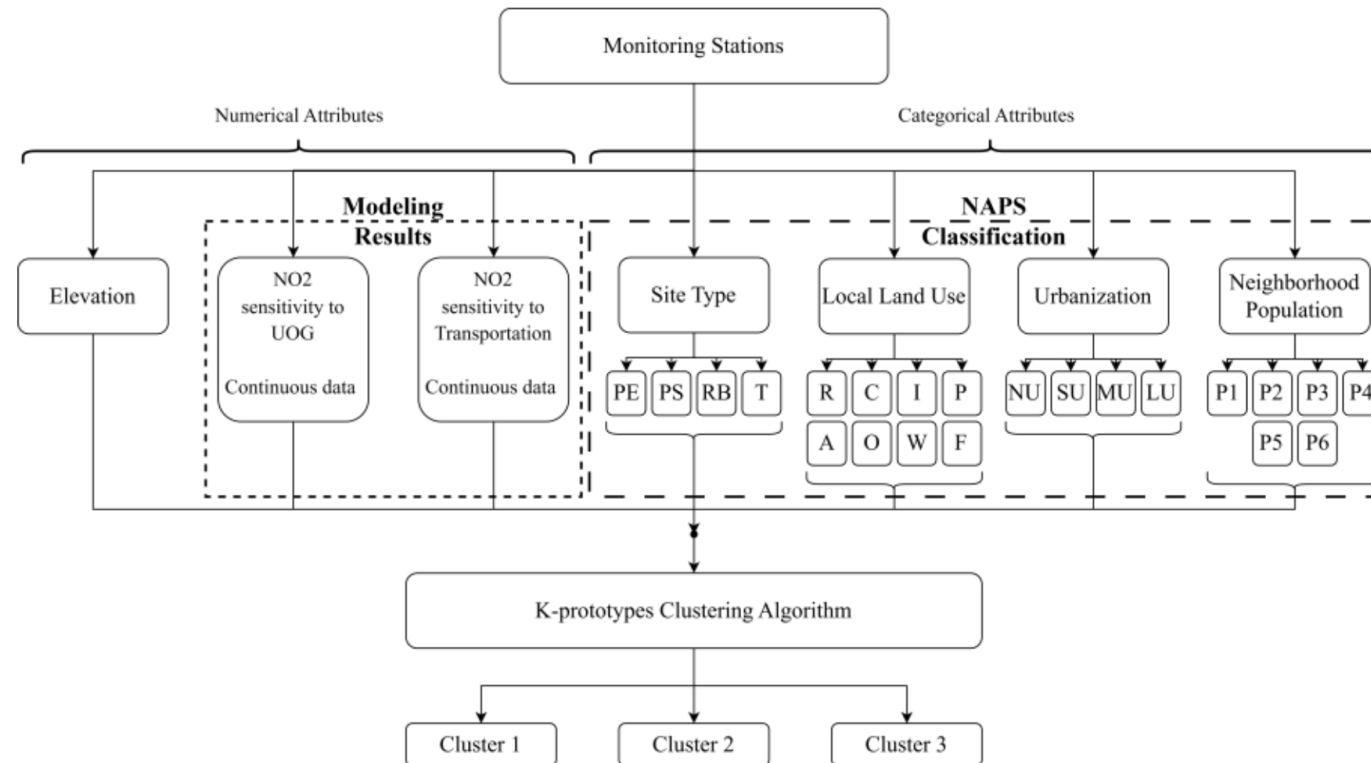
Canadian Ambient Air Quality Standards

Management Level	NO <sub>2</sub> annual (ppb)	
	2020	2025
Red (CAAQS)	> 17.0	> 12.0
Orange	7.1 to 17.0	7.1 to 12.0
Yellow	2.1 to 7.0	2.1 to 7.0
Green	≤ 2.0	≤ 2.0



# Re-Clustering Air Quality Monitoring Stations

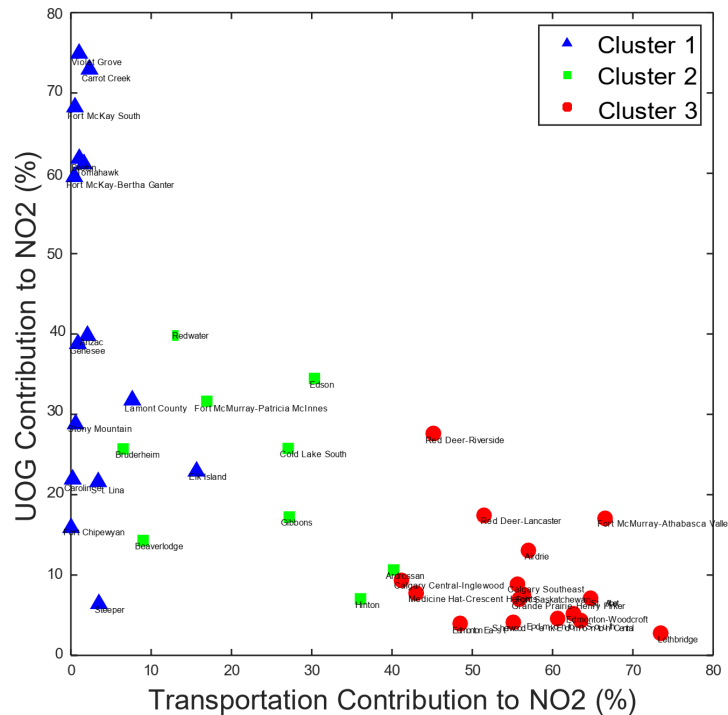
A classification approach using a k-prototypes algorithm is used to categorize AQM stations based on the impacts of primary NO<sub>2</sub> sources. The algorithm minimizes distances and mismatches between data points and attribute values. The approach is compared to the Site Type classification and analyzed using statistical tests.





# Re-Clustering Air Quality Monitoring Stations

- Most of the stations in Cluster 1 belong to the RB category and most of the stations in Cluster 3 belong to PE category.
- The spatial interpolation results shows stations in the area with blue color are affected by both UOG and mobile sources and can be categorized a a new category.







# Conclusion

01

Population exposure stations are sensitive to transportation emission, while regional background stations are sensitive to UOG emission.

02

Although UOG emitted 49% of total  $\text{NO}_x$  in AB, but its contribution to  $\text{NO}_2$  concentration in populated cities is less than 7%.

03

In warm season and cold season, more than 53% and 47% of  $\text{NO}_2$  concentration originated from transportation sector, respectively.

04

23% reduction in the emission of transportation sector is needed to meet 2025 CAAQS.



## Acknowledgment

- The support of the Alberta government (AB Parks and Protected Areas) in providing CMAQ-ready emission inputs is acknowledged;
- Funding support was provided by Environment and Climate Change Canada (ECCC) under for the project “Urban Transportation Emissions and GHGs; Technologies and Behavioral Shifts Towards Zero Emissions” under the Climate Action and Awareness Fund – Advancing Climate Change Science & Technology;

# Thank You for Your Attention

## Email

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