



## 1 High-resolution quantification of atmospheric CO<sub>2</sub> mixing ratios in the Greater Toronto Area,

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- 3 Stephanie C. Pugliese<sup>1</sup>, Jennifer G. Murphy<sup>1\*</sup>, Felix R. Vogel<sup>2,4</sup>, Michael D. Moran<sup>3</sup>, Junhua Zhang<sup>3</sup>,
- 4 Qiong Zheng<sup>3</sup>, Craig A. Stroud<sup>3</sup>, Shuzhan Ren<sup>3</sup>, Douglas Worthy<sup>4</sup>, Gregoire Broquet<sup>2</sup>
- 5
- <sup>6</sup> <sup>1</sup>University of Toronto, Department of Chemistry, 80 St. George St, Toronto, ON, Canada M5S 3H6
- 7 <sup>2</sup> Laboratoire des Sciences du Climat et de L'Environnement, CEA-CNRS-UVSQ, Université de Paris-
- 8 Saclay, France
- 9 <sup>3</sup> Environment Canada, Air Quality Research Division, 4905 Dufferin St. Toronto, ON, Canada M3H
- 10 5T4
- <sup>4</sup> Environment Canada, Climate Research Division, 4905 Dufferin St. Toronto, ON, Canada M3H 5T4
- 12 \*Correspondence author. Email address: jmurphy@chem.utoronto.ca (J.G. Murphy)
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#### 14 Abstract

15 Many stakeholders are seeking methods to reduce carbon dioxide  $(CO_2)$  emissions in urban areas, however reliable, high-resolution inventories are required to guide these efforts. We present the 16 17 development of a high-resolution CO<sub>2</sub> inventory available for the Greater Toronto Area and surrounding region in southern Ontario, Canada (area of  $\sim 2.8 \times 10^5 \text{ km}^2$ , 26 % of the province of 18 19 Ontario). The new SOCE (Southern Ontario CO<sub>2</sub> Emissions) inventory is available at the 2.5 x 2.5 km 20 spatial and hourly temporal resolution and characterizes emissions from seven sectors: Area, 21 Residential natural gas combustion, Commercial natural gas combustion, Point, Marine, On-road and 22 Off-road. To assess the accuracy of the SOCE inventory, we developed an observation-model 23 framework using the GEM-MACH chemistry-transport model run on a high-resolution grid with 2.5 24 km grid spacing coupled to the Fossil Fuel Data Assimilation System (FFDAS) v2 inventories for 25 anthropogenic CO<sub>2</sub> emissions and the European Center for Medium-Range Weather Forecasts 26 (ECMWF) land carbon model C-TESSEL for biogenic fluxes. A run using FFDAS v2 for the southern 27 Ontario region was compared to a run in which its emissions were replaced by the SOCE inventory. 28 Simulated CO<sub>2</sub> mixing ratios were compared against in situ measurements made at four sites in 29 southern Ontario, Downsview, Hanlan's Point, Egbert and Turkey Point, in three winter months, 30 January-March, 2016. Model simulations had better agreement with measurements when using the 31 SOCE inventory emissions versus other inventories, quantified using a variety of statistics such as 32 correlation coefficient, root mean square error and mean bias. Furthermore, when run with the SOCE 33 inventory, the model had improved ability to capture the typical diurnal pattern of  $CO_2$  mixing ratios, particularly at the Downsview, Hanlan's Point and Egbert sites. In addition to improved model-34 35 measurement agreement, the SOCE inventory offers a sectoral breakdown of emissions, allowing estimation of average time-of-day and day-of-week contributions of different sectors. Our results 36 37 show that at night, emissions from Residential and Commercial natural gas combustion and other





- Area sources can contribute > 80 % of the CO<sub>2</sub> enhancement while during the day emissions from the
- 39 On-road sector dominate, accounting for >70 % of the enhancement.

## 40 1.0 Introduction

41 Urban areas are sites of dense population and the intensity of human activities (such as 42 transportation, industry and residential and commercial development) makes them hot-spots for anthropogenic carbon dioxide  $(CO_2)$  emissions. While occupying only 3 % of the total land area, urban 43 44 areas are locations of residence for 54 % of the global population and are the source of 53 – 87 % of anthropogenic CO<sub>2</sub> emissions globally (IPCC-WG3, 2014; WHO, 2015). When considering Canada 45 alone, the urban population accounts for an even larger fraction of the total (81% in 2011) (Statistics 46 47 Canada, 2011) while urban areas cover only 0.25 % of the land area (Statistics Canada, 2009). Recognizing their influence on the global carbon budget, many urban areas are seeking methods to 48 49 reduce their anthropogenic  $CO_2$  emissions. The Greater Toronto Area (GTA) in southeastern Canada, for example, has committed to the Change is in the Air initiative as well as being a part of the C40 Cities 50 51 *Climate Leadership Group*, both of which call to reduce CO<sub>2</sub> emissions 30 % below 1990 levels by 2020 52 (C40 Cities, 2016; Framework for Public Review and Engagement, 2007). However, in order to 53 effectively guide anthropogenic  $CO_2$  mitigation strategies, reliable inventories are needed, 54 particularly at high spatial and temporal resolution, to gain a better understanding of the carbon 55 cycle (Gurney et al., 2009; Patarasuk et al., 2016). To our knowledge, the only spatially disaggregated 56 CO<sub>2</sub> inventories available for use in the GTA are the EDGAR v.4.2 (Emission Database for Global 57 Atmospheric Research) CO<sub>2</sub> inventory (available at annual, 0.1° x 0.1° resolution) (EDGAR, 2010) and the FFDAS v2 (Fossil Fuel Data Assimilation System) CO<sub>2</sub> inventory (available at hourly, 0.1° x 0.1° 58 59 resolution) (FFDAS, 2010), both which are limited in their spatial and/or temporal resolution and therefore are not well-suited for the quantification and understanding of CO<sub>2</sub> emissions at the urban 60





 $\,$  scale. The Canadian national CO<sub>2</sub> inventory, on the other hand, is only available at the provincial level

62 (Environment Canada, 2012).

63 Efforts to develop emission inventories at the fine spatial and temporal resolution required 64 for urban-scale understanding of CO<sub>2</sub> emissions has been driven both by policy- and science-related questions (Gurney et al., 2009; Patarasuk et al., 2016). From a policy perspective, improving  $CO_2$ 65 66 emission quantification is essential to independently evaluate whether anthropogenic mitigation 67 regulations are being effectively implemented. From a scientific perspective, gaining information about anthropogenic CO<sub>2</sub> emissions from urban areas has been primarily motivated by atmospheric 68 69  $CO_2$  inversions, which are used to better understand the global carbon cycle (Gurney et al., 2009; Patarasuk et al., 2016). Regardless of the motivation, quantification of CO<sub>2</sub> source/sink processes 70 71 currently uses two techniques: the bottom-up approach and the top-down approach. In the bottom-72 up approach, local-scale activity level information is combined with appropriate emission factors to infer emission rates. This method has been used widely to develop many inventories (EDGAR, 2010; 73 74 FFDAS, 2010; Gurney et al., 2009) but is limited by the accuracy of the input parameters. Conversely, 75 in the top-down approach, inverse modelling is used to exploit the variability in atmospheric mixing 76 ratios of  $CO_2$  to identify the source/sink distributions and magnitudes; this method is limited by 77 insufficient mixing ratio data and uncertainties in simulating atmospheric transport (Pillai et al., 78 2011). Given current policy needs, a strategy using solely bottom-up or top-down approaches is likely 79 insufficient to evaluate  $CO_2$  emissions but rather a synthesis of the two methodologies is required 80 (Miller and Michalak, 2016). Successful examples of high-resolution CO<sub>2</sub> inventory development are 81 available on the urban scale, such as the Airparif inventory in Ile-de-France (publicly available at http://www.airparif.asso.fr/en/index/index) and in Indianapolis, Los Angeles, Salt Lake City and 82 83 Phoenix through the Hestia project (Gurney et al., 2012), on the national scale, such as in China (Zhao 84 et al., 2012), and on the global scale (Wang et al., 2013). However, to our knowledge, there are





 $currently no studies that have quantified Canadian <math>CO_2$  emissions at the fine spatial and temporal

86 resolution required for urban analyses in Canada.

In an effort to address this gap, this study was focused on quantifying  $CO_2$  emissions at a fine 87 88 spatial and temporal resolution in the GTA and southern Ontario (we expanded the inventory beyond the urban area of the GTA so we could exploit information on CO<sub>2</sub> mixing ratios collected at rural 89 90 areas in central and south-western Ontario, proving additional sites for inventory validation). We 91 present the new high-resolution Southern Ontario CO<sub>2</sub> Emissions (SOCE) inventory, which quantifies CO<sub>2</sub> emissions from seven source sectors (On-road, Off-road, Area, Point, Marine, Residential, and 92 93 Commercial natural gas combustion) at 2.5 km x 2.5 km spatial and hourly temporal resolution for an area covering  $\sim 26$  % of the province of Ontario ( $\sim 2.8 \times 10^5$  km<sup>2</sup>). The SOCE inventory was used in 94 95 combination with the Environment and Climate Change Canada (ECCC) GEM-MACH chemistry-96 transport model to simulate CO<sub>2</sub> mixing ratios in a domain including south-eastern Canada and the 97 northeastern USA (hereafter referred to as the "PanAm domain") for comparison with in situ measurements made by the Southern Ontario Greenhouse Gas Network. Until now, estimates of 98 anthropogenic CO<sub>2</sub> emissions in the GTA were available only from the EDGAR v.4.2 (EDGAR, 2010) 99 100 and the FFDAS v2 (FFDAS, 2010) inventories, which have very different annual totals for this region 101  $(1.36 \times 10^8 \text{ vs. } 1.05 \times 10^8 \text{ tonnes CO}_2$ , respectively). Therefore, we expect the results of this work will 102 improve our ability to quantify the emissions of  $CO_2$  in the entire domain as well as the relative 103 contributions of different sectors, providing a more detailed characterization of the carbon budget in 104 the GTA.

105 2.0 Methods

106 *2.1 Geographic Domain* 

The geographic focus of this study was the GTA in southern Ontario, Canada. The GTA is the largest
urban area in Canada; it comprises five municipalities, Toronto, Halton, Durham, Peel and York,





109 which together have a population exceeding 6 million (Statistics Canada., 2012b). Although the GTA 110 comprises only 0.07 % of Canadian land area, it represents over 17 % of the total population as a 111 result of rapid urbanization over the past few decades (Statistics Canada., 2012b). Therefore, high-112 resolution characterization of CO<sub>2</sub> emissions can help integrate climate policy with urban planning. This region is home to a network of measurement sites providing long-term, publicly available 113 114 datasets of atmospheric CO<sub>2</sub> mixing ratio measurements, Sect. 2.2 (Environment Canada, 2011) which can be used to evaluate model outputs and inventory estimates. In 2016 the government of Ontario 115 116 released a Climate Change Action Plan, which includes an endowment given to the Toronto Atmospheric Fund of \$17 million to invest in strategies to reduce greenhouse gas pollution in the 117 GTA (Ontario, 2016). Therefore this research can provide timely information on the carbon budget 118 119 in the GTA and help to implement effective reduction strategies.

120 2.2 The Southern Ontario Greenhouse Gas Network

121 Measurements of ambient CO<sub>2</sub> dry air mixing ratios began in 2005 in southern Ontario at the Egbert station followed by the Downsview station (2007), Turkey Point station (2012) and Hanlan's Point 122 123 station (2014), Figure 1. Egbert is located ~75 km north-northwest of Toronto in a rural area, 124 Downsview is located ~20 km north of downtown core of the city of Toronto in a populated suburban 125 area, Turkey Point is located to the south-west of the GTA in a rural area on the north shore of Lake Erie, and Hanlan's Point is located on Toronto Island, just south of the city of Toronto on the shore of 126 127 Lake Ontario. Site details and instrument types used can be found in Table 1. CO<sub>2</sub> measurements are 128 collected as a part of ECCC's Greenhouse Gas Observational Program. The measurement procedure 129 follows a set of established principles and protocols outlined by a number of international agencies 130 through recommendations of the Meeting on Carbon Dioxide, Other Greenhouse Gases, and Related Measurement Techniques, coordinated by the World Meteorological Organization (WMO) every 2 131 132 years.





133 The atmospheric CO<sub>2</sub> observational program Egbert is based on non-dispersive infrared 134 (NDIR) methodology and fine-tuned for high precision measurements (Worthy et al., 2005). A 135 detailed description of the NDIR observational system can be found in Worthy et al. (2005). The 136 atmospheric CO<sub>2</sub> observational programs at Turkey Point, Downsview, and Hanlan's Point are based on Cavity Ring-Down Spectrometer (CRDS). Each Picarro CRDS system is calibrated in the ECCC 137 central calibration facility in Toronto before deployment to the field. The response function of the 138 analyzer is determined against 3 calibrated standards tanks (Low, Mid, High). The working (W) and 139 140 target (T) tanks assigned to the system are also included in the injection sequence and calibrated. At each site, ambient measurements are made using two sample lines placed at the same level. Each 141 142 sample line has separate dedicated sample pumps and driers (~ -30°C). Pressurized aluminum 30 L 143 gas cylinders are used for the working and target tanks. The sample flow rate of the ambient and 144 standard tank gases is set at ~300 cc/min. The injection sequence consists of a target and working 145 tanks sequentially passed through the analyzer for 10 minutes each every 2 days. The ambient data 146 from line1 is passed through the analyzer for 18 hours followed by Line2 for 6 hours. The Line1/Line2 sequence repeats one time before the target and working tanks are again passed 147 through the system. The working and target tanks are calibrated on site at least once per year against 148 a single transfer standard transported between the sites and the central laboratory facility in 149 Toronto. The CO<sub>2</sub> measurements from both the NDIR and CRDS analytical systems have a precision 150 of around 0.1 ppm based on one-minute averages and are accurate to within 0.2 ppm. 151

152 2.3 GEM-MACH chemistry- transport model

In this project, we used the GEM-MACH (Global Environmental Multi-scale–Modelling Air quality and
CHemistry) chemistry–transport model (CTM) (Gong et al., 2015; Moran et al., 2013; Pavlovic et al.,
2016; Talbot et al., 2008) to link surface emission estimates and atmospheric mixing ratios. GEMMACH is an on–line CTM embedded within the Canadian weather forecast model GEM (Côté et al.,





157	1998a; Côté et al., 1998b). The configuration of GEM-MACH used in our study has 62 vertical levels
158	from the surface to $\sim$ 1.45 hPa on a terrain-following staggered vertical grid for a log-hydrostatic
159	pressure coordinate. The thickness of the lowest layer was 40 m. The PanAm domain used in our
160	simulations, which includes central and southern Ontario, as well as western Quebec and the
161	northeastern USA, is shown in Figure 1. The PanAm domain has 524 x 424 grid cells in the horizontal
162	on a rotated latitude-longitude grid with 2.5-km grid spacing and covers an area of approximately
163	1310 km x 1060 km (total domain area is 1.39 x $10^6$ km <sup>2</sup> ). A 24-hour forecasting period was used
164	with a 60-second time step for each integration cycle. Meteorological fields (wind, temperature,
165	humidity, etc.) were re-initialized every 24 hours (i.e., after each model integration cycle); chemical
166	fields were carried forward from the previous integration cycle (i.e., perpetual forecast). Hourly
167	meteorological and chemical boundary conditions were provided by the ECCC operational 10-km
168	GEM-MACH air quality forecast model (Moran et al., 2015).

169 In our study, we simulated two scenarios of  $CO_2$  surface fluxes, indicated by the sum of the following:

- Anthropogenic fossil fuel CO<sub>2</sub> emissions within the province of Ontario estimated by the SOCE
   inventory, available at 2.5 km x 2.5 km spatial and hourly temporal resolution, as described
   in *Sect. 2.4*
- Anthropogenic fossil fuel CO<sub>2</sub> emissions estimated by the FFDAS v2 inventory (FFDAS, 2010)
   outside of the province of Ontario (province of Quebec and USA), available at 0.1° x 0.1°
   spatial and hourly temporal resolution
- Biogenic CO<sub>2</sub> fluxes from the C-TESSEL land surface model, as described in *Sect. 2.5*
- 178

<sup>170</sup> Scenario 1:





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Scenario 2:

- 181 Anthropogenic fossil fuel CO<sub>2</sub> emissions estimated by the FFDAS v2 inventory (FFDAS, 2010) 182 for the entire domain, available at 0.1° x 0.1° spatial and hourly temporal resolution 183 Biogenic CO<sub>2</sub> fluxes from the C-TESSEL land surface model, as described in Sect. 2.5 ٠ CO<sub>2</sub> is not a usual chemical species considered by GEM-MACH but a set of special inert tracer fields 184 185 were added to GEM-MACH for this project to account for CO<sub>2</sub> concentration fields associated with difference source sectors and the lateral boundaries. The CO<sub>2</sub> boundary conditions set at the lateral 186 and top edges of the domain were obtained from the Monitoring Atmospheric Composition and 187 188 Climate (MACC) global inversion, v.10.2 (http://www.copernicus-atmosphere.eu/). Model simulated 189 specific humidity (q, kg/kg) was used to convert estimated  $CO_2$  mixing ratios to dry air mixing ratios. 190  $CO_2$  dry air mixing ratios are hereafter referred to  $CO_2$  mixing ratios.
- 191 2.4 High-Resolution SOCE inventory development

192 The high-resolution SOCE inventory was constructed primarily from a pre-existing carbon monoxide (CO) inventory developed by the Pollutant Inventories and Reporting Division (PIRD) of ECCC as part 193 194 of the 2010 Canadian Air Pollutant Emissions Inventory (APEI). The CO inventory is a comprehensive 195 national anthropogenic inventory that includes emissions from area sources, point sources, on-road mobile sources and off-road mobile sources, including aircraft, locomotive and marine emissions for 196 197 base year 2010 (Moran et al., 2015). This annual inventory at the provincial level compiled by PIRD 198 was transformed into model-ready emissions files using the Sparse Matrix Operator Kernel 199 Emissions (SMOKE, https://www.cmascenter.org/smoke/) emissions processing system for spatial allocation (distribution of non-point source emissions to 2.5 km x 2.5 km (roughly 0.02° x 0.02° 200 201 resolution) using spatial surrogate fields) and temporal allocation (conversion of inventory annual emission rates into hourly values) (Moran et al., 2015). More detailed information about the CO 202





inventory compilation and subsequent processing has been provided elsewhere (Environment
Canada, 2013; Moran et al., 2015; PIRD, 2016).

The objective of our work was to calculate  $CO_2$  emissions based on this processed, modelready CO inventory for Ontario grid cells using sector-specific emission ratios estimated by the Canadian National Inventory Report (NIR) (Environment Canada, 2012). Emission sources within each sector of the CO inventory are classified by SCC (Source Classification Code) and were converted to NFR (Nomenclature for Reporting) for accurate cross-reference with the NIR  $CO_2$  and COestimates. Provincial totals for  $CO_2$  and CO are estimated based on the NFR sources that are included in the sector, producing the following sector-averaged  $CO_2$ :CO ratio:

212 
$$CO_{2(sector,kt)} = CO_{(sector,kt)} * \frac{CO_{2(Ontario\ total,kt)}}{CO_{(Ontario\ total,kt)}} \qquad \text{Eq. (1)}$$

This sector-averaged CO<sub>2</sub>:CO ratio is used to convert the APEI-based CO model-ready gridded emissions fields into CO<sub>2</sub> emissions fields at the same spatial and temporal resolution. A detailed outline of this conversion is presented for each sector in the following subsections. Unless otherwise noted, temporal allocation of emissions in each sector is based on estimates made available by SMOKE.

## 218 2.4.1 Area emissions

Area emissions are mostly small stationary sources that represent diffuse emissions that are not inventoried at the facility level. In the APEI CO inventory, the major emission sources in the Area sector include emissions from public electricity and heat production (1A1a), residential and commercial plants (1A4a and 1A4b), stationary agriculture/forestry/fishing (1A4c), iron and steel production (2C1), and pulp and paper (2D1). The NIR estimates an Ontario total from these (and other minor sources) of 23,455 kt CO<sub>2</sub> and 218.8 kt CO, producing a CO<sub>2</sub>:CO ratio of 107.2 kt CO<sub>2</sub>/kt





- 225 CO. This ratio was applied to every Area sector grid cell belonging to Ontario in the domain to convert
- sector CO emissions to  $CO_2$  emissions.
- 227 2.4.2 Point emissions

228 Point emissions are stationary sources in which emissions exit through a stack or identified exhaust. In the APEI CO inventory, the major emission sources in the Point sector include public electricity 229 230 and heat production (1A1a), stationary combustion in manufacturing industries and construction 231 (1A2f), chemical industry (2B5a), pulp and paper (2D1), iron and steel production (2C1) and other 232 metal production (2C5). Unlike the Area sector, we found that applying a single  $CO_2$ :CO ratio to every 233 facility did not produce realistic CO<sub>2</sub> emissions due to the significant variability in combustion efficiency (and thus CO2:CO ratio). Therefore, we used ECCC Facility Reported Data (Environment 234 Canada, 2015) to identify the geocoded location and annual average CO<sub>2</sub>:CO for 48 individual facilities 235 in Ontario (Table S1) and applied the specific CO<sub>2</sub>:CO ratios to the grid cells where the facilities were 236 237 located. In addition, stack height of individual facilities were included in the emission model to optimize plume rise. All other point sources (minor facilities) were scaled by a sector average CO<sub>2</sub>:CO 238 239 ratio of 313.1 kt CO<sub>2</sub>/kt CO, calculated from Ontario total CO<sub>2</sub> and CO point-source emissions from 240 the NIR. Temporal allocation of emissions in the Point sector are based on facility level operating 241 schedule data collected by ECCC.

242 2.4.3 On-road mobile emissions

On-road emissions include the emissions from any on-road vehicles (quantified by the Statistics
Canada Canadian Vehicle Survey) (Environment Canada, 2013). In the APEI CO inventory, the major
emission sources in the On-road sector includes gasoline and diesel-powered light- and heavy-duty
vehicles (1A3b). The NIR estimates an Ontario total from these (and other minor on-road sources) of
44,458 kt CO<sub>2</sub> and 1508.3 kt CO, producing a CO<sub>2</sub>:CO ratio of 29.5 kt CO<sub>2</sub>/kt CO. This ratio was applied
to every On-road grid cell belonging to Ontario in the domain to convert sector CO emissions to CO<sub>2</sub>.





249 Temporal allocation of emissions in the On-road sector is estimated using data collected in the FEVER

250 (Fast Evolution of Vehicle Emissions from Roadways) campaign in 2010 (Gordon et al., 2012a;

251 Gordon et al., 2012b; Zhang et al., 2012).

252 2.4.4 Off-road mobile emissions

253 Off-road emissions include the emissions from any off-road vehicles that do not travel on designated roadways, including aircraft, all off-road engines, and locomotives. In the APEI CO inventory, the 254 255 major emission sources in the Off-road sector include civil aviation (1A3a), railways (1A3c), and 256 agriculture/forestry/fishing: off-road vehicles and other machinery (1A4c). Similar to the Point 257 sector, we found that applying a single  $CO_2$ :CO ratio to every grid cell did not produce realistic  $CO_2$ 258 emissions for the two airports in the GTA, Pearson International Airport (PIA) and Billy Bishop Toronto City Airport (BBTCA). Therefore, we used air quality assessment reports compiled for each 259 airport (RWDI AIR Inc., 2009; RWDI AIR Inc., 2013) to identify the geocoded location and facility-260 261 specific annual average CO<sub>2</sub>:CO ratio. Sources of emissions from each airport include aircraft (landing and take-off cycles), auxiliary power units, ground support equipment, roadways, airside vehicles, 262 263 parking lots, stationary sources and training fires; note that emissions from aircrafts in-transit 264 between airports, which are injected in the free troposphere, have not been included in this inventory (Moran et al., 2015; RWDI AIR Inc., 2009). Based on these two reports, we applied a ratio 265 of 175 kt CO<sub>2</sub>/kt CO to the grid cell containing PIA and a ratio of 20 kt CO<sub>2</sub>/kt CO to the grid cell 266 containing BBTCA. All other off-road sources belonging to Ontario grid cells were scaled by a sector 267 268 average CO2:CO ratio of 7.2 kt CO2/kt CO, calculated from NIR-reported Ontario total CO2 and CO 269 emissions.

270 2.4.5 Marine emissions

Commercial marine emissions include the emissions from any marine vessels travelling on the Great
Lakes (quantified by the Statistics Canada *Shipping in Canada*) (Environment Canada, 2013). In the





- APEI CO inventory, the major emission source in the Marine sector is national navigation (1A3d). The
- $\label{eq:274} NIR \mbox{ estimates an Ontario total from this source of 729.2 CO_2 \mbox{ and } 0.86 \mbox{ kt CO, producing a CO}_2:CO \mbox{ ratio}$
- $of \, 844.2 \, kt \, CO_2/kt \, CO. \, This \, ratio \, was \, applied \, to \, every \, marine \, grid \, cell \, in \, the \, domain \, to \, convert \, sector \,$
- $276 \qquad CO\ emissions\ to\ CO_2.$
- 277 2.4.6 Residential and commercial emissions

Residential and commercial CO<sub>2</sub> emissions reflect on-site combustion of natural gas for electricity 278 279 and heating, a source that we found was not included in the APEI CO inventory because of the high 280 efficiency of the furnaces and resulting low CO emissions. To include the CO<sub>2</sub> emissions from these 281 on-site furnaces, we used the Statistics Canada 2012 Report on Energy Supply and Demand to 282 quantify the amount of natural gas consumed by residential and commercial buildings in Ontario, 7969.6 gigalitres (GI) and 4895.7 Gl respectively (Statistics Canada, 2012a). We used an emission 283 factor of 1879 g  $CO_2/m^3$  natural gas combustion (Environment Canada, 2012) to estimate  $CO_2$ 284 285 emissions from residential and commercial on-site furnaces in Ontario to be 1.5 x 107 tonnes and 9.2 x 10<sup>6</sup> tonnes, respectively. These two emission totals were spatially allocated using a "capped-total 286 287 dwelling" spatial surrogate developed by ECCC and temporally allocated using the SMOKE emissions 288 processing system (Moran et al., 2015).

289 2.5 Biogenic flux

The net ecosystem exchange (NEE) fluxes used in our simulations were provided by the land surface component of the ECMWF forecasting system, C-TESSEL (Bousetta et al., 2013). Fluxes are extracted at the highest available resolutions,  $15 \times 15$  km and 3 hour for January and February 2016 and  $9 \times 9$ km and 3 hour for March. These data are interpolated in space and time to be consistent with our model resolution. With our main priority being understanding anthropogenic emissions in the GTA, we chose to analyze a period where the biogenic  $CO_2$  flux is minimized and therefore this paper focuses on three winter months in 2016, January to March inclusive.





## 297 **3.0 Results and Discussion**

#### 298 3.1 The SOCE inventory

Figure 1 displays the PanAm domain total anthropogenic CO<sub>2</sub> emissions estimated by the SOCE inventory for the province of Ontario portion (~0.02° x 0.02°) and by the FFDAS v2 inventory (0.1° x 0.1°) (FFDAS, 2010) for the remainder of the domain. Regions of high emissions typically correspond to population centers, for example the GTA in Ontario, Montreal and Quebec City in Quebec, and Chicago, Boston and New York City (amongst others) in the USA. Emissions from highways and major roadways are only clear in the province of Ontario (at higher spatial resolution) but industrial and large scale area sources are evident across the entire domain.

306 The total  $CO_2$  emissions can be separated into contributions from the seven sectors in the 307 province of Ontario described in Sect. 2.4. Figure 2 shows the anthropogenic CO<sub>2</sub> contributions from 308 the Area sector, Residential and Commercial sector, Point sector, Marine sector, On-road sector and 309 Off-road sector, focused on southern Ontario and the GTA. If we consider emissions from a domain 310 including the area solely around the GTA (indicated by the black-box in Figure 2a), the total  $CO_2$ 311 emissions estimated by the SOCE inventory is 94.8 Mt CO<sub>2</sub> per year, Table 2. Figures 2a and b display the CO<sub>2</sub> emissions from the Area sector and from Residential and Commercial natural gas combustion 312 313 in southern Ontario. These two sectors combined represent the largest source of CO<sub>2</sub> in the blackbox area (41.6 Mt  $CO_2$ /year, contributing 43.9 % of the total). The majority of these emissions are 314 concentrated in the GTA and surrounding urban areas as a result of a significant portion of the 315 population (64 %) being reliant on natural gas for heat production (Statistics Canada, 2007; Statistics 316 317 Canada, 2012a). Figure 2c represents emissions from the Point sector, contributing 24.4 Mt CO<sub>2</sub>/year, 25.7 % of the total. The largest point source emitters are located on the western shore of Lake Ontario 318 319 (Hamilton and surrounding areas) as this area is one of the most industrialized regions of the country 320 with intensive metal production activities. Figures 2d, e and f display CO<sub>2</sub> emissions from various





321 transportation sectors, Marine, On-road, and Off-road respectively, which together contribute more

322 than 30 % of total CO<sub>2</sub> emissions in the area within the black box. While emissions from marine

activity are minimal, those from On-road and Off-road sources are significant (25.0 % and 5.3 %,

324 respectively), concentrating on the major highways connecting the various population centres of the

325 GTA to the downtown core, as well as at PIA located within the city.

326 3.2 Comparison of the SOCE inventory with other inventories

327 The EDGAR v4.2 inventory estimates  $CO_2$  emissions on an annual basis and by sector based on 328 Selected Nomenclature for Air Pollution (SNAP) sub-sectors while FFDAS v2 provides hourly mean 329 grid cell totals. Table 2 shows a comparison between the sectoral CO<sub>2</sub> estimates of the SOCE and 330 EDGAR v4.2 inventories (SNAP sectors were grouped to correspond to SOCE sectors, Table S2) as well as the domain total estimated by the FFDAS v2 inventory for the area surrounding the GTA (the 331 black-box area outlined in Figure 2a). There is a significant discrepancy between the CO<sub>2</sub> emissions 332 333 estimated by the SOCE and EDGAR v4.2, inventories both in the relative sectoral contributions as well as domain total (percent difference >35 %). The largest sectoral discrepancies are in the Point and 334 335 the On-road sectors, where the EDGAR v4.2 inventory estimates a contribution 1.9 and 1.7 times 336 larger than that of the SOCE inventory, respectively. Figure 3 shows a comparison of the spatial 337 distribution of the CO<sub>2</sub> inventory predicted by a) FFDAS v2, b) EDGAR v4.2, and c) SOCE (aggregated to 0.1° x 0.1° to match the resolution of EDGAR v4.2 and FFDAS v2) for the GTA area. Figure 3 reveals 338 that the largest differences between the SOCE inventory and the EDGAR v4.2 inventory is the CO<sub>2</sub> 339 340 emissions in the GTA; EDGAR v4.2 predicts much higher emissions in the GTA (in some grid cells, 341 differences are an order of magnitude), particularly in the downtown core relative to the SOCE 342 inventory.

Although there is no sectoral breakdown in the FFDAS v2 inventory, the domain total around
the GTA can be compared to that of the SOCE inventory, Table 2. Unlike the comparison with the





345 EDGAR v4.2 inventory, there is a closer agreement between the FFDAS v2 inventory and the SOCE 346 inventory (difference of  $\sim 10$  %). The comparison plots in Figure 3 show a good agreement of the 347 spatial variability of emissions in the GTA between the FFDAS v2 and SOCE inventories; however, the 348 gradient between urban and rural areas is not as sharp in the SOCE inventory as it is in the FFDAS v2 349 inventory. Furthermore, emissions along the western shore of Lake Ontario (Hamilton and the surrounding areas) are predicted to be larger in the SOCE inventory relative to FFDAS v2. The FFDAS 350 v2 inventory was interpolated to 0.02 ° x 0.02° using a mass conservative interpolation scheme to 351 352 allow the production of a difference plot of the two inventories, SOCE minus FFDAS v2, shown in Figure S1. The difference plot reveals the largest divergence between the inventories occurs in the 353 354 GTA and Ottawa, with the FFDAS v2 inventory estimating >1000 g  $CO_2$ /second (~30 kt  $CO_2$ /year) 355 more than the SOCE inventory in some grid cells. In addition to similar spatial variability, the FFDAS 356 v2 and SOCE inventories also have similar temporal variability. Figure S2 shows the diurnal profile 357 of estimated emissions from January-March for both the FFDAS v2 and SOCE inventories for the 358 black-box area in the PanAm domain. Both inventories allocate the highest emissions between 08:00 and 18:00 and the lowest emission between 00:00 and 5:00, however the amplitude of the diel cycle 359 360 is higher in SOCE, and emissions in the morning are as high as in the afternoon. FFDAS allocates a relatively larger proportion of the emissions to the 15:00 – 19:00 period. 361

362 3.3 Preliminary analyses using the SOCE, FFDAS v2 and EDGAR v4.2 inventories with FLEXPART

To investigate the impact of the differing inventories on ambient mixing ratios, preliminary analyses were run with footprints generated by the FLEXPART driven by GEM meteorology and products were compared against the measured CO<sub>2</sub> gradient between the Downsview and TAO (43.7°N, 79.4°W, a temporary site decommissioned in January 2016) stations in the year 2014. Observed gradients ranged from +20 to -10 ppm. Figure S3 displays the measured and modelled CO<sub>2</sub> gradients. These results show that when the EDGAR v4.2 inventory was used, simulated CO<sub>2</sub> gradients were





369 consistently overestimated by  $\sim 10-60$  ppm relative to observations. Conversely, when the SOCE 370 inventory was used, a higher level of agreement was obtained between simulated mixing ratios and 371 measurements; however, none of the model simulations were able to capture times when the 372 gradient was negative ( $CO_{2,TAO} > CO_{2,Downsview}$ ), an effect we believe to be due to the TAO inlet being 373  $\sim$ 60 m above ground level and surrounded by many high-rise buildings creating canyon flows and turbulence which are not properly accounted for in GEM at this resolution. These factors contributed 374 375 to the decommissioning of TAO in January 2016. The poor performance of our model system when 376 using the EDGAR v4.2 inventory to simulate  $CO_2$  mixing ratios was also found by a study quantifying 377 on-road CO<sub>2</sub> emissions in Massachusetts, USA (Gately et al., 2013). In this study, EDGAR emission 378 estimates were found to be significantly larger than any other inventory by as much as 9.3 million 379 tons, or >33 %. The difference in estimates between the EDGAR v4.2 and the SOCE inventories is 380 likely explained by their underlying differences in methodology. Being a global product and not 381 specifically designed for mesoscale applications, the EDGAR v4.2 inventory estimates CO<sub>2</sub> emissions 382 based on country-specific activity data and emission factors, however the spatial proxies used to disaggregate the data are not always optimal. A study performed by McDonald et al. (2014) showed 383 384 that the use of road density as a spatial proxy for vehicle emissions in EDGAR v4.2 causes an overestimation of emissions in population centers (McDonald et al., 2014). Given the much larger 385 emission estimates for On-road  $CO_2$  from EDGAR v4.2 (Table 2), this also seems to be an issue in the 386 387 GTA. Based on this large discrepancy, the EDGAR v4.2 inventory was not further used in this study 388 and we focussed on the inventories developed for regional scale studies.

When similar preliminary analyses were run with FLEXPART footprints using the FFDAS v2 inventory, Figure S3, good agreement was observed with CO<sub>2</sub> gradients measured between the Downsview and TAO stations. We are confident that the enhanced measurement agreement between the FFDAS v2 and SOCE relative to EDGAR v4.2 is due to improved methodology; spatial allocation of emissions in FFDAS v2 is achieved through the use of satellite observations of nightlights from human





394 settlements from the U.S. Defense Meteorological Satellite Program Operational Linescan System

395 (DMSP-OLS).

Beyond the differences in methodology for estimating and allocating emissions, it is 396 important to note that the emissions reported in Table 2 by the FFDAS v2, SOCE and EDGAR v4.2 397 398 inventories also fundamentally differ in time period quantified. The emissions reported for both 399 FFDAS v2 and the SOCE are based on emissions from three winter months (January-March 2010) 400 extrapolated for the entire year. However, emissions from EDGAR v4.2 are annual averages of all twelve months of 2010. Since  $CO_2$  emissions in the GTA are higher in the winter months relative to 401 402 the summer months because of increased building and home heating, it is likely that the average 403 annual estimates of SOCE and FFDAS v2 are slightly overestimated. This does not affect the relative 404 agreement between SOCE and FFDAS v2 however it does further increase the divergence between 405 the EDGAR v4.2 and SOCE and FFDAS v2 inventories. Following this and the improved agreement with observations, the FFDAS v2 inventory was used with the SOCE inventory for all subsequent 406 407 modelling analyses.

408 3.4 Simulation of CO<sub>2</sub> mixing ratios in the Greater Toronto Area

We used the GEM-MACH CTM and the SOCE and FFDAS v2 inventories to simulate hourly CO<sub>2</sub> mixing 409 410 ratios in the PanAm domain. The model framework was evaluated for a continuous three-month 411 period, January-March 2016 using four sampling locations in the GTA, Figure 1 (note that measurements for the Hanlan's Point site were not available until January 14, 2016). Figure 4 412 displays afternoon (12:00-16:00 EST) measured and simulated CO<sub>2</sub> mixing ratios produced with the 413 SOCE and FFDAS v2 inventories for the two emissions scenarios described in Sect. 2.3 for the month 414 415 of February (Figures S4 and S5 show the same figure for other months). We chose to present only 416 afternoon data as this is the time of day when the mixed layer is likely to be the most well-developed; 417 nighttime and morning data showed largest variations in observations as a result of the shallow





boundary layer causing surface emissions to accumulate within the lowest atmospheric layers
(Breon et al., 2015; Chan et al., 2008; Gerbig et al., 2008). During the night, atmospheric mixing ratios
are most sensitive to vertical mixing, an atmospheric process that is difficult to model for stable
boundary layers.

422 The time series comparisons at all four sites demonstrate the model's general ability to 423 capture variability in observations of CO<sub>2</sub>, albeit with better skill for the Downsview and Egbert sites 424 (this is particularly clear when we look at model-measurement difference plots, Figure S6). The 425 model is able to capture many extreme events of mixing ratio increases and decreases, such as 426 February 11-14, 2016 at the Downsview site; however, some short time periods are poorly simulated, 427 such as January 21-23, 2016 at Hanlan's Point, when the model significantly overestimated measured 428 CO<sub>2</sub>. Generally, mixing ratios simulated by the FFDAS v2 inventory are similar or larger than those 429 produced when the SOCE inventory is used, with differences most noticeable at the Downsview and Hanlan's Point sites. This was expected as the difference plot shown in Figure S1 reveals that the 430 431 SOCE and FFDAS v2 inventories diverge the most in the GTA (where the Downsview and Hanlan's 432 Point sites are located) and are more similar in rural areas (where the Turkey Point and Egbert sites 433 are located).

434 Measured  $CO_2$  mixing ratios have a typical diurnal pattern, in which mixing ratios are higher at night and lower during the day, despite higher emissions during the day. This results from the daily 435 cycle of the mixed layer, which is shallow at night due to thermal stratification and deepens during 436 437 the day due to solar heating of the surface. Figure 5 displays the measured and modelled mean 438 diurnal profile of  $CO_2$  at the four sites in our network using data from January-March, 2016 (note 439 difference in y-axis scale for urban vs. rural sites). At all four sites, the shapes of the modelled and measured mixing ratios throughout the day agree very well, suggesting that the GEM meteorology in 440 441 our framework is capturing the diurnal variation in emissions and the boundary layer evolution. At





442 the Downsview site, there is a very strong agreement between the modelled and measured diurnal 443 profiles when using the SOCE inventory, whereas the FFDAS v2 simulated profile largely 444 overestimates mixing ratios, particularly at nighttime. This is consistent with the FFDAS inventory 445 having larger emissions than the SOCE inventory during the night (Fig S2). At the Hanlan's Point site, a difference of  $\sim$  5 ppm CO<sub>2</sub> is observed when using the SOCE inventory relative to measurements; 446 however, similar to the Downsview site, the FFDAS v2 simulated profile has a larger difference of 447 448  $\sim$ 10 ppm CO<sub>2</sub>. At both the Egbert and Turkey Point sites, the use of both inventories similarly 449 overestimates the diurnal pattern of  $CO_2$  mixing ratios by ~3-5 ppm, again likely a result of the similarities of these two inventories at these sites, Figure S1. At all four sites, it is possible that some 450 451 of the biases that are observed in simulated CO<sub>2</sub> mixing ratios may arise from inaccuracies in the 452 boundary CO<sub>2</sub> provided by MACC; this aspect was not, however, further explored in this study.

453 3.5 Quantifying model-measurement agreement

454 Figure 6 shows scatter plots of afternoon (12:00-16:00 EST) modelled versus measured CO<sub>2</sub> mixing ratios from January- March, 2016 at the four sites used in this study. The top row shows the 455 456 correlation between measured and modelled mixing ratios using the SOCE inventory and the bottom row shows the correlation using the FFDAS v2 inventory. It is immediately clear that there is a 457 458 stronger model-measurement correlation at the Downsview and Egbert sites (R > 0.75) relative to that of Hanlan's Point or Turkey Point (R < 0.53). The difficulty with accurately simulating CO<sub>2</sub> mixing 459 460 ratios at Hanlan's Point and Turkey Point may arise from their proximity to shorelines, Hanlan's Point 461 to Lake Ontario and Turkey Point to Lake Erie (see Figure 1). Differential heating of land versus water 462 near these lakes creates pressure gradients driving unique circulation patterns (Burrows, 1991; Sills 463 et al., 2011). These circulation patterns are difficult for models to capture and therefore may contribute to the relatively poor correlation observed at Hanlan's Point and Turkey Point. 464





465 It is also clear from Figure 6 that simulating  $CO_2$  mixing ratios at the Egbert and Turkey Point 466 sites using either the FFDAS v2 or the SOCE inventory results in similar performance, likely because 467 the emissions estimated by the two inventories are similar in the vicinity of these two rural sites (see 468 also Figure 5). However at both the Downsview and Hanlan's Point sites, using the SOCE inventory provided a slightly higher correlation and reduced RMSE and MB relative to using the FFDAS v2 469 inventory. The improvement by using the SOCE inventory is likely a result of both the improved 470 471 spatial resolution (2.5 km versus 10 km), and therefore more accurate allocation of emissions to grid 472 cells, and also a better estimation of emission magnitudes, as large differences are shown in Figures 473 3 and S1.

## 474 3.6 Sectoral contributions to simulated CO<sub>2</sub> mixing ratios

475 One of the major advantages of the SOCE inventory over the FFDAS v2 inventory is the availability of sectoral emission estimates. Figure 7 displays the sectoral percent contributions to diurnal CO<sub>2</sub> 476 477 mixing ratio enhancements (calculated as local CO<sub>2</sub> mixing ratios above the MACC estimated 478 background) for the Downsview station in February 2016 averaged by the day of week (Figures S7 479 and S8 displays the same for other months). This figure clearly demonstrates the importance of Area 480 emissions (defined here as the sum of the Area + Residential natural gas combustion + Commercial 481 natural gas combustion) to simulated  $CO_2$  mixing ratios, reaching ~80 % contribution in the early morning and late evening, consistent with times when emissions from home heating are the 482 dominant source of  $CO_2$ . Contributions from Area emissions decrease to ~35 % midday, which 483 484 coincides with when emissions from other sources, such as On-road, gain importance. In the midday, 485 emissions from the On-road sector can contribute  $\sim$ 50 %, which is consistent with transportation patterns of the times when the population is travelling to and from work and other activities. The 486 relative contributions to CO<sub>2</sub> mixing ratios from point source emissions is quite variable during the 487 488 course of a day and week, but generally seems to increase in the early morning and evening and can





489 contribute a significant portion of total  $CO_2$  emissions (up to  $\sim 20$  %). Figure 7 indicates that biogenic 490 sources of CO<sub>2</sub> play a negligible role during January-March in the GTA. Recent studies, however, have 491 shown the importance of the biospheric contribution (up to  $\sim$ 132-308 g CO<sub>2</sub> km<sup>-2</sup> s<sup>-1</sup>) to measured 492 CO<sub>2</sub> in urban environments during the growing season (Decina et al., 2016). Therefore, this finding 493 supports the importance of modelling  $CO_2$  in the wintertime in cities like the GTA to avoid complications associated with biospheric contributions. The new ability to understand the sectoral 494 495 contributions to CO<sub>2</sub> mixing ratios in the GTA and southern Ontario has implications from a policy 496 perspective; with recent initiatives to curb  $CO_2$  emissions, understanding from which sector the  $CO_2$ 497 is being emitted could be useful to assess how effective applied mitigation efforts have been or where 498 to target future efforts. These efforts could be complemented by running simulations with additional 499 tracers, such as carbon monoxide (CO), nitrogen oxides ( $NO_x$ ), or stable carbon isotopes ( $^{12}C$  and  $^{13}C$ ) 500 to gain further insight.

501 4.0 Conclusions

502 We presented the SOCE inventory for southern Ontario and the GTA, the first, to our knowledge, high-503 resolution  $CO_2$  inventory for southern Ontario and for a Canadian metropolitan region. The SOCE inventory provides  $CO_2$  emissions estimates at 2.5 km x 2.5 km spatial and hourly temporal 504 resolution for seven sectors: Area, Residential natural gas combustion, Commercial natural gas 505 506 combustion, Point, Marine, On-road and Off-road. When compared against two existing  $CO_2$ inventories available for southern Ontario, the EDGAR v4.2 and the FFDAS v2 inventories, using 507 508 FLEXPART footprints, the SOCE inventory had improved model-measurement agreement; FFDAS v2 509 agreed well with in situ measurements, but the EDGAR v4.2 inventory systematically overestimated mixing ratios. We developed a model framework using the GEM-MACH chemistry-transport model 510 511 on a high-resolution 2.5 km x 2.5 km grid coupled to the SOCE and FFDAS v2 inventories for anthropogenic CO<sub>2</sub> emissions and C-TESSEL for biogenic CO<sub>2</sub> fluxes. We compared output simulations 512





513 to observations made at four stations across southern Ontario and for three winter months, January 514 - March, 2016. Model-measurement agreement was strong in the afternoon using both 515 anthropogenic inventories, particularly at the Downsview and Egbert sites. Difficulty in capturing 516 mixing ratios at the Hanlan's Point and Turkey Point sites was hypothesized to be a result of their close proximity to shorelines (Lake Ontario and Lake Erie, respectively) and the model's inability to 517 capture the unique circulation patterns that occur in those environments. Generally, across all 518 519 stations and months, simulations using the SOCE inventory resulted in higher model-measurement 520 agreement than those using the FFDAS v2 inventory, quantified using R, RMSE and mean bias. In addition to improved agreement, the primary advantage of the SOCE inventory over the FFDAS v2 521 522 inventory is the sectoral breakdown of emissions; using average day of week diurnal mixing ratio 523 enhancements, we were able to demonstrate that emissions from area sources can contribute >80 %524 of CO<sub>2</sub> mixing ratio enhancements in the early morning and evening with on-road sources 525 contributing >50 % midday. The applications of the SOCE inventory will likely show future utility in 526 understanding the impacts of CO<sub>2</sub> reduction efforts in southern Ontario and identify target areas 527 requiring further improvement.

## 528 Author Contributions

529 The SOCE inventory was prepared by Stephanie C. Pugliese, with critical input from Felix Vogel and 530 Jennifer Murphy. The CO inventory which the SOCE inventory is based upon was provided by Mike Moran, Junhua Zhang and Qiong Zheng. The GEM-MACH modelling analyses were performed by 531 532 Shuzhan Ren and Craig Stroud. The ambient CO<sub>2</sub> data were collected by Douglas Worthy and his team at Environment and Climate Change Canada. The MACC and C-TESSEL products used in our model 533 534 simulations were provided by Gregoire Broquet. The data was analyzed and interpreted for 535 publication by Stephanie C. Pugliese. This manuscript was written by Stephanie C. Pugliese, with critical input from Jennifer Murphy, Felix Vogel and Mike Moran. 536





## 537 Acknowledgements

- 538 The authors are thankful to Robert Kessler, Michelle Ernst, Lauriant Giroux, Senen Racki and Lin
- 539 Huang for their efforts collecting the <sup>12</sup>CO<sub>2</sub> and <sup>13</sup>CO<sub>2</sub> measurements at Environment and Climate
- 540 Change Canada. They would also like to thank Elton Chan for providing the FLEXPART footprints and
- 541 for Pegah Baratzadeh for help creating the SOCE inventory.





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# Table 1: Summary of atmospheric measurement programs in Southern Canada operated by Environment and Climate Change Canada

Start Date	Site Name	Coordinates	Elevation (asl)	Intake Height	In-situ Instrumentation
March, 2005	Egbert	44.231037N, 79.783834W	251m	3m, 25m*	NDIR
November, 2010	Downsview	43.780491N, 79.468010W	198m	20m	NDIR
November, 2012	Turkey Point	42.635368N, 80.557659W	231m	35m	CRDS
		43.612201N			
June, 2014	Hanlan's Point	79.388705W	87m	10m	CRDS

- 684 NDIR = Non-dispersive infrared
- 685 CRDS = cavity ring-down spectroscopy

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Table 2: Anthropogenic CO<sub>2</sub> emissions for the year 2010 in the black-box area (shown in
 Figure 2a) by sector. Values in parentheses indicate the percentage contribution of the
 sector to the total CO<sub>2</sub> emissions in the black-box area.

Sector	FFDAS v2 <sup>‡</sup> CO <sub>2</sub> Inventory (Mt CO <sub>2</sub> /year)	EDGAR v4.2 <sup>#</sup> CO <sub>2</sub> Inventory (Mt CO <sub>2</sub> /year)	SOCE CO2 Inventory (Mt CO2/year)
Area*	-	46.2 (33.9 %)	41.6 (43.9 %)
Point	-	45.9 (33.7 %)	24.4 (25.7 %)
Marine	-	0.12 (0.10 %)	0.10 (0.10 %)
<b>On-road</b>	-	41.2 (30.2 %)	23.7 (25.0 %)
Off-road	-	2.95 (2.2 %)	5.01 (5.3 %)
Total	104.8	136.4	94.8

<sup>6</sup>91 \*Area sector represents the summation of Area + Residential + Commercial natural gas combustion.

692 #The EDGAR inventory v4.2 can be found at http://edgar.jrc.ec.europa.eu.

<sup>‡</sup>The FFDAS v2 inventory can be found at http://hpcg.purdue.edu/FFDAS/.

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Figure 1: Total anthropogenic CO<sub>2</sub> emissions for a weekday in February 2010 estimated by the
SOCE inventory for the province of Ontario and by the FFDAS v2 inventory for the remainder
of the GEM-MACH PanAm domain. Locations of in-situ measurements of CO<sub>2</sub> in the Southern
Ontario GHG Network are shown in the inset (Downsview = square, Egbert = circle, Hanlan's
Point = triangle, Turkey Point = diamond). The Downsview and Hanlan's Point sites are both
located in the GTA. Units: g CO<sub>2</sub>/second/grid cell.







Figure 2: Anthropogenic CO<sub>2</sub> emissions for a weekday in February 2010 in southern Ontario.

745 Emissions are estimated by the SOCE inventory for the (a) Area sector; (b) sum of the

746 Residential and Commercial sectors; (c) Point sector; (d) Marine sector; (e) On-road sector;

<sup>747 (</sup>f) Off-road sector. Units: log<sub>10</sub>(g CO<sub>2</sub>/second/grid cell).







757 Figure 3: Comparison of spatial distribution of annual CO<sub>2</sub> emissions inventories for the black-758 box area (shown in Figure 2a) at 0.1° x 0.1° resolution. Panel a) shows the FFDAS v2 inventory 759 estimate, Panel b) shows the EDGAR v4.2 inventory estimate and Panel c) shows the SOCE 760 inventory estimate. Units: log<sub>10</sub>(tonne CO<sub>2</sub>/year/grid cell). Domain totals are shown on top of each panel and locations of in-situ measurements of CO<sub>2</sub> for three stations in the Southern 761 762 Ontario GHG Network are shown on Panel a (Downsview = square, Hanlan's Point = triangle, 763 TAO = pentagon). The other two stations, Egbert and Turkey Point, are located outside this 764 area.







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Figure 4: Time series of measured (blue) and modelled February afternoon (12:00-16:00 EST)
 CO<sub>2</sub> mixing ratios for the four sites used in this study. The red and gold markers are the
 modelled mixing ratios when using the SOCE CO<sub>2</sub> inventory and the FFDAS v2 inventory,
 respectively.







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Figure 5: Time series of mean measured (blue) and modelled diurnal CO<sub>2</sub> mixing ratios at the
four sites considered in this study for January - March 2016. The red and gold markers are
the modelled diurnal mixing ratios when using the SOCE CO<sub>2</sub> inventory and the FFDAS v2
inventory, respectively. Note the difference in scale for urban and rural sites.







Figure 6: Scatter plot of the modelled and measured afternoon (12:00-16:00 EST) CO<sub>2</sub> mixing ratios from

January-March, 2016 at the four monitoring stations used in this study. The top and bottom panels show measurement-model correlation when the SOCE inventory and the FFDAS v2 inventory were used, respectively. The model vs. measurement Correlation Coefficient (R), root mean square error (RMSE) and mean bias (MB) (units: ppm) are provided within each panel. Solid lines are the standard major axis

787 regression lines and dashed lines are 1:1 lines shown for reference.







Figure 7: Modelled sectoral percent contributions to diurnal local CO<sub>2</sub> enhancement for February 2016 at Downsview averaged by day of week. Note: Area = Area + Residential natural gas combustion + Commercial natural gas combustion. (Time zone is EST).