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## Highlights

- We for the first time applied the EPA CMAQ chemical transport model (CTM) to simulate CO<sub>2</sub> [1]
- We examined the spatial correlations between CO<sub>2</sub> and NO<sub>2</sub>, CO, and SO<sub>2</sub>, and found that the correlations vary with season and sampling strategy (e.g., surface concentrations or vertical column densities)
- The CMAQ-CO<sub>2</sub> model will be used for developing a multi-species emissions verification system

## Background

- **Two key challenges in fossil-fuel CO<sub>2</sub> emissions verification**
  - (1) A signal-to-noise issue due to the large and yet uncertain interference by the biosphere
  - (2) Limited understanding of fine-scale spatial variability of CO<sub>2</sub> and its fossil-fuel component
- **Motivation and rationale of studying CO<sub>2</sub> in conjunction with air-quality species**
  - (1) Sources almost always emit an array of pollutants together
  - (2) All trace chemical constituents are transported in the atmosphere simultaneously
  - (3) Abundant data are available from the air-quality monitoring networks and satellites
  - (4) Inverse modeling theory provides the foundation for multi-species flux inversion [2,3]

## CMAQ Model Configuration

(refer to [1] for details)

### CMAQ model setup

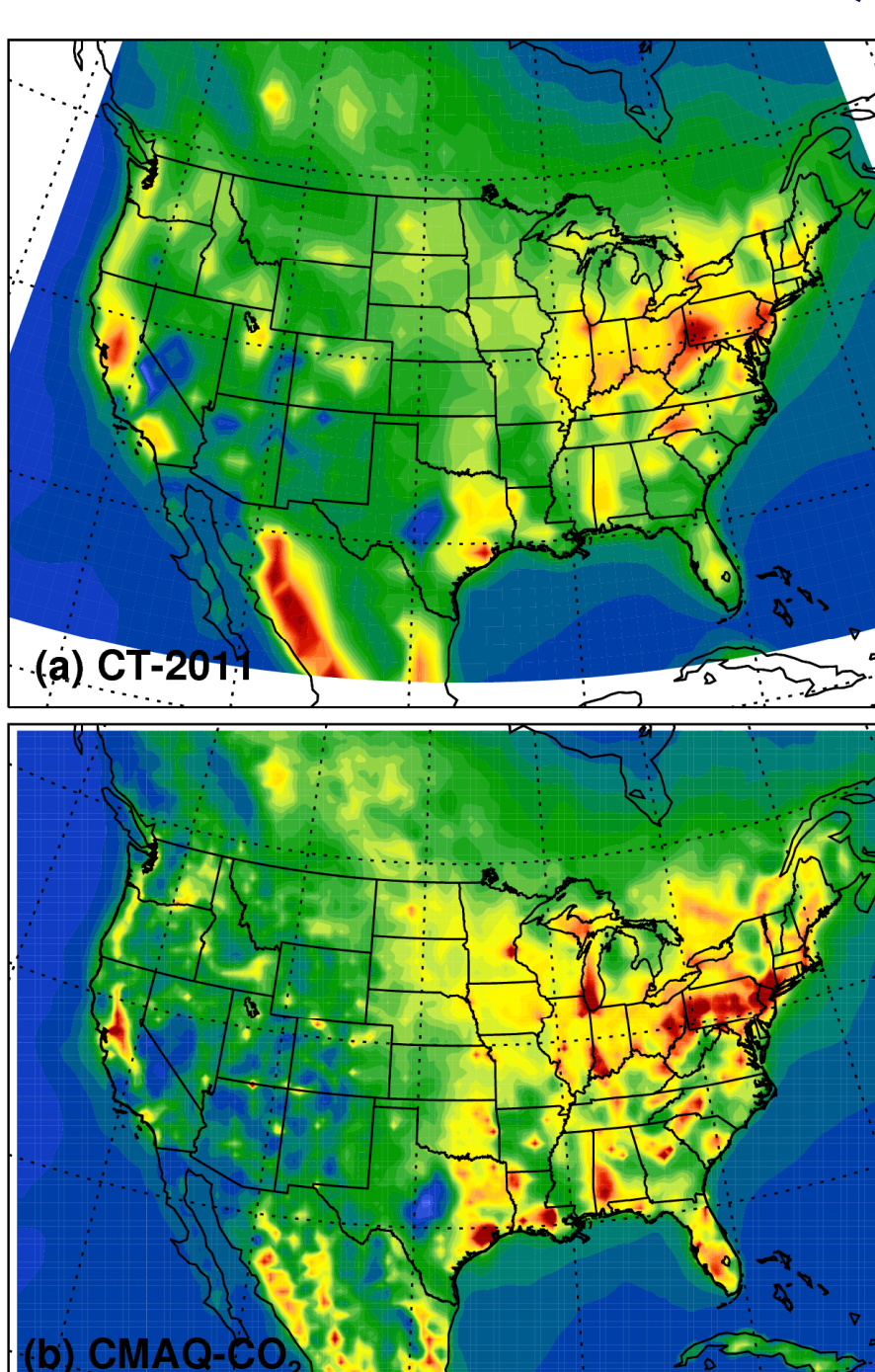
- **CMAQ** : v5.0, CONUS/36km/22L
- **Meteorology** : WRF v3.1.1
- **Simulation year** : 2007
- **CO<sub>2</sub> simulation**
  - **BC and IC** : CT-2011 (1° × 1°; 3-hourly)
  - **Biosphere fluxes** : CT-2011 (1° × 1°; 3-hourly)
  - **Fossil fuel (FF) emissions** : Vulcan (2002; 10km; hourly) in the US; CDIAC outside
  - **Fire emissions** : GFEDv3.1 (0.5° × 0.5°; 3-hourly)
  - **Oceans fluxes** : CT-2011 (1° × 1°; 3-hourly)

### Atmospheric chemistry simulation

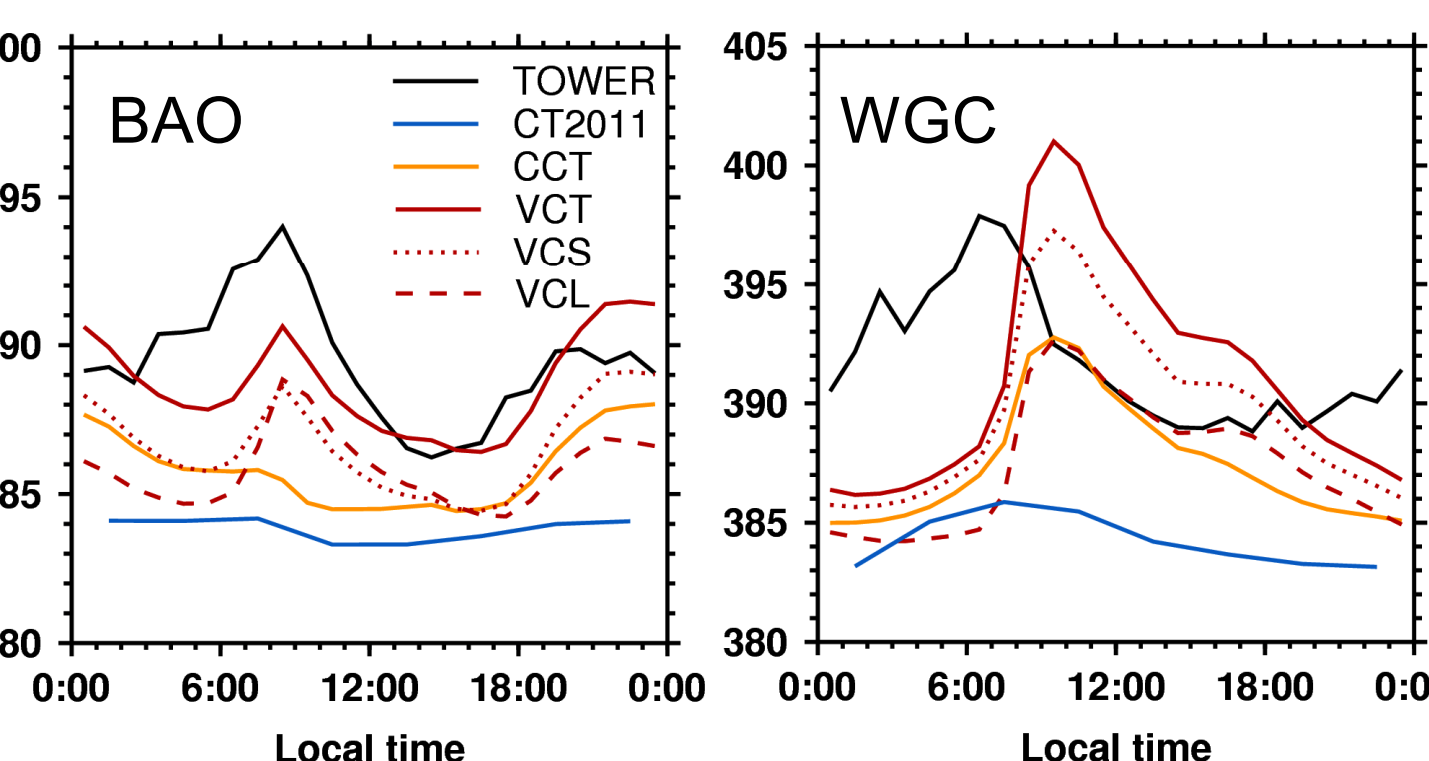
- **BC and IC** : GEOS-Chem v8.2.1
- **Biogenic emissions** : MEGAN v2.1
- **Anthropogenic emissions** : NEI 2005
- **Fire emissions** : Blue Sky + FEPS
- **Chemistry** : CB-05

## CMAQ CO<sub>2</sub> Simulation Evaluation

CarbonTracker → CMAQ



CMAQ simulations vs Tower observations

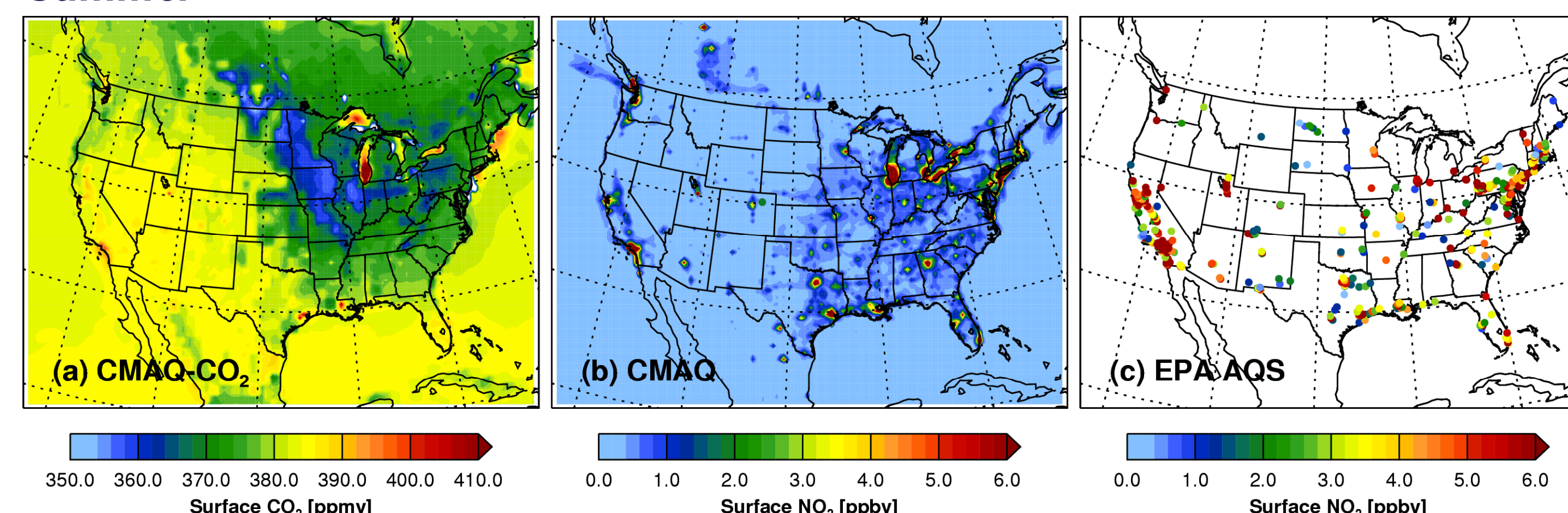


**Figure 1.** Monthly mean diurnal profiles of CO<sub>2</sub> in October 2007 observed at Boulder Atmospheric Observatory (BAO) and Walnut Grove (WGC) (TOWER) and simulated by CT2011 and CMAQ with different configurations. CCT uses CDIAC FF emissions and CT2011 NEE; VCT uses Vulcan and CT2011 NEE; VCS uses Vulcan FF emissions and CASA NEE; and VLM uses Vulcan FF emissions and CLM4VIC NEE. For model grids outside the US, Vulcan has no values and CDIAC is used instead.

**Figure 2.** Monthly mean CO<sub>2</sub> concentrations near the surface simulated by (a) CT2011 and (b) CMAQ using CT2011 NEE, and fossil-fuel emissions from CDIAC and Vulcan for model grids outside and inside the US, respectively.

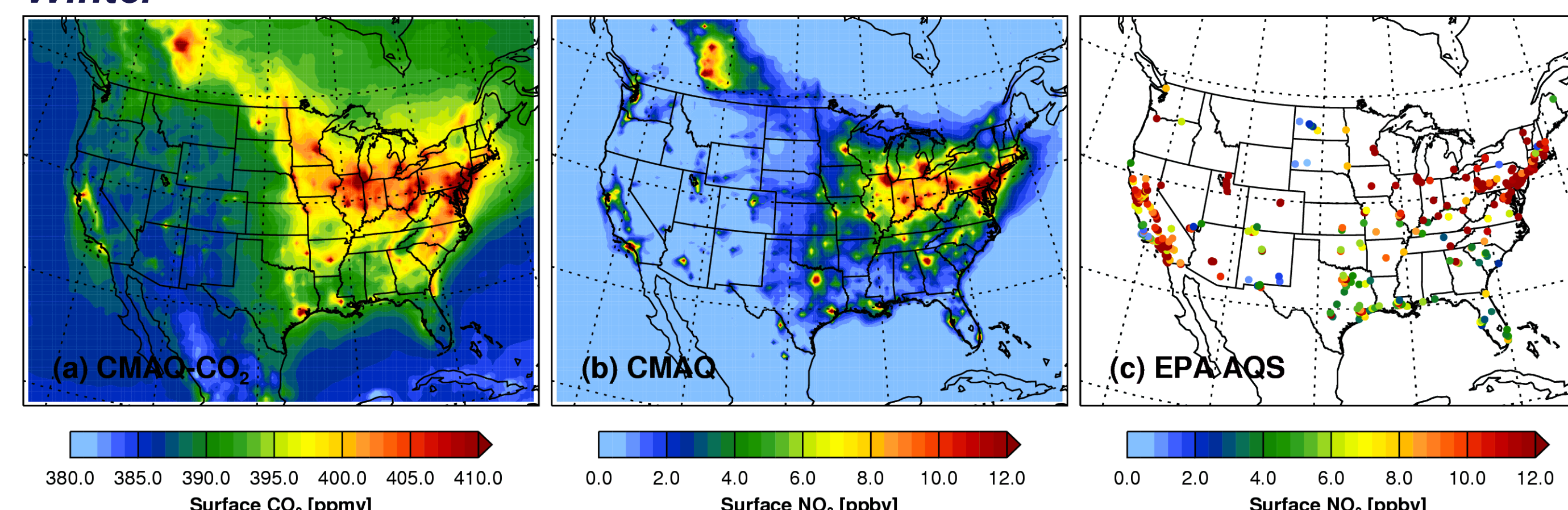
## Spatial Distributions of CO<sub>2</sub> and NO<sub>2</sub> – Surface Concentrations

Summer



**Figure 3.** Spatial distributions of (a) CMAQ simulated CO<sub>2</sub>, (b) CMAQ simulated NO<sub>2</sub>, and (c) EPA AQS observed NO<sub>2</sub> near the surface at 14:00 local time in July 2007.

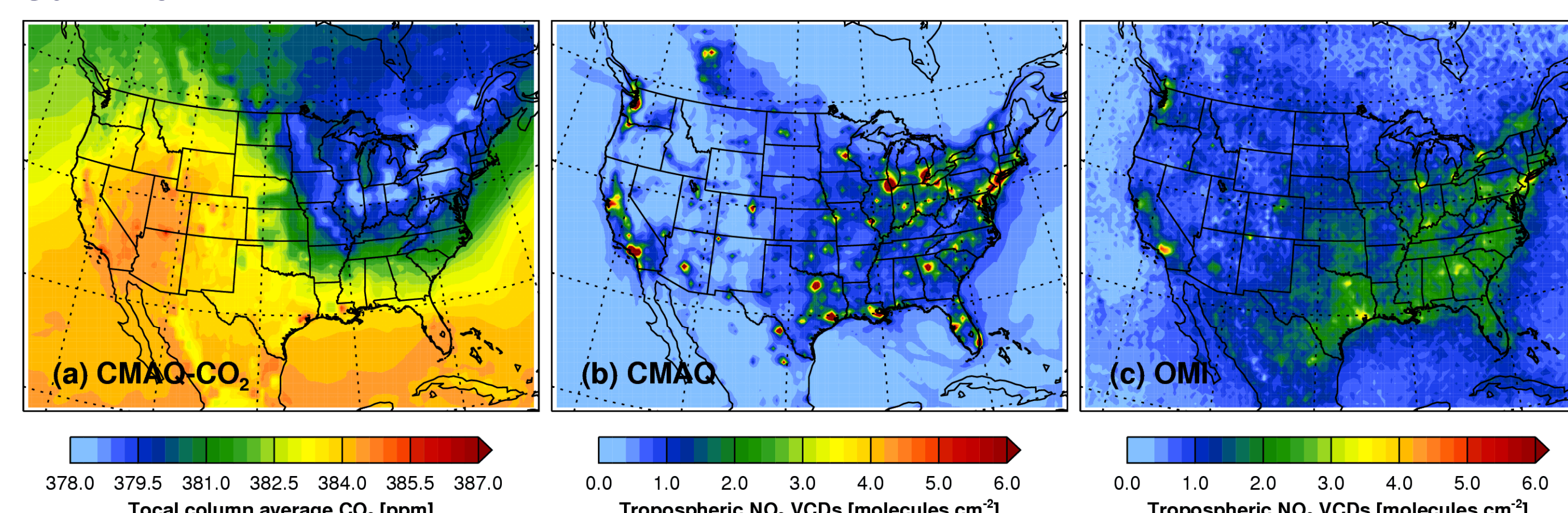
Winter



**Figure 4.** Same as Figure 3, but for December 2007.

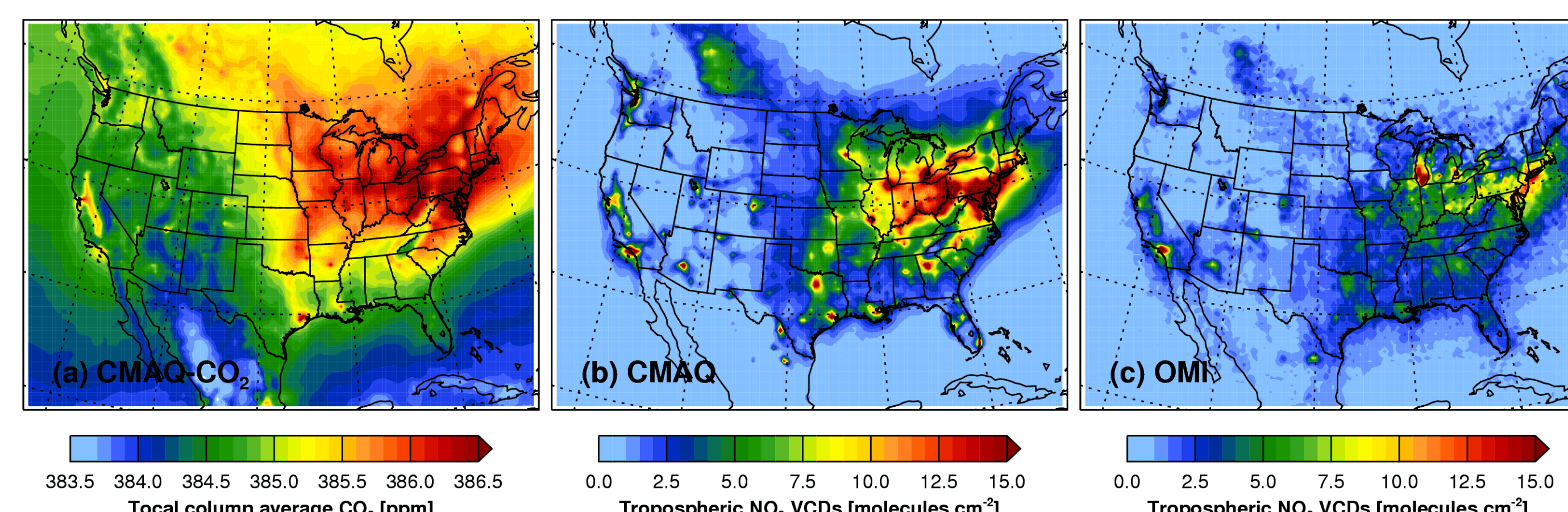
## Spatial Distributions of CO<sub>2</sub> and NO<sub>2</sub> – Vertical Column Densities

Summer



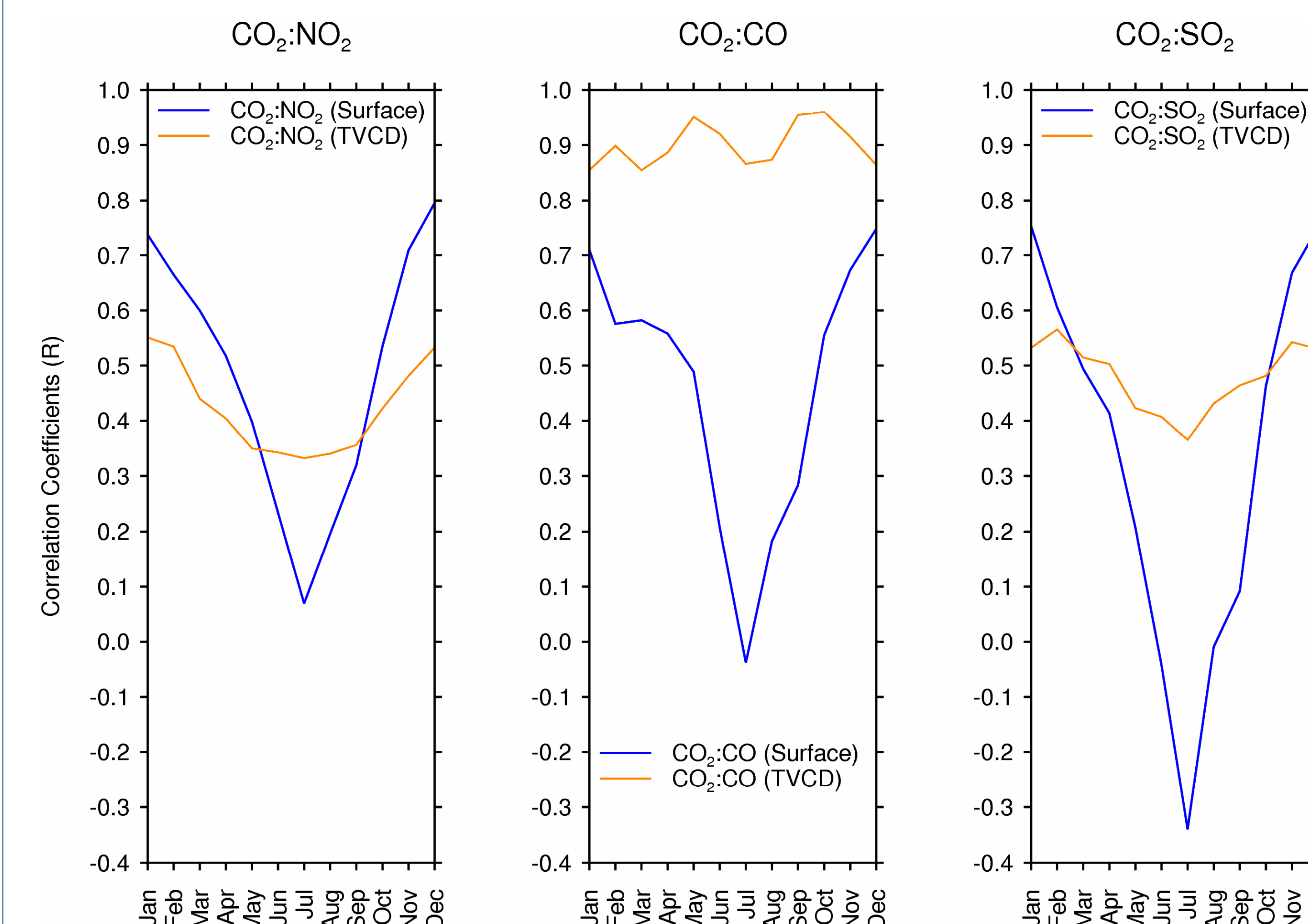
**Figure 5.** Spatial distributions of (a) CMAQ (trop) and CT-2011 (strat) simulated total column average CO<sub>2</sub>, (b) CMAQ simulated tropospheric vertical column densities (VCDs) of NO<sub>2</sub>, and (c) Aura OMI observed NO<sub>2</sub> VCDs at 14:00 local time in July 2007.

Winter



**Figure 6.** Same as Figure 5, but for December 2007.

## Simulated Seasonal Variations of CO<sub>2</sub>:NO<sub>2</sub>, CO, SO<sub>2</sub> Spatial Correlations



**Figure 7.** CMAQ simulated spatial correlation coefficients between CO<sub>2</sub> and NO<sub>2</sub>, CO, SO<sub>2</sub>, respectively. Correlations are examined for monthly mean surface concentrations (Surface) and tropospheric integrated vertical column densities (TVCDs) sampled from CMAQ native grids at 14:00 local time.

- Among all combinations, the best correlation is found for CO<sub>2</sub>:CO TVCDs
- In all cases but one (CO<sub>2</sub>:CO TVCD), the best correlation is in winter and the worst in summer
- R between vertical column densities show much weaker seasonality than surface concentrations

## Ongoing and Future Work

- Further understanding the spatiotemporal variability of CO<sub>2</sub> (the role of fluxes and transport)
- Modeling CO<sub>2</sub> emissions together with air quality species using SMOKE
- Developing a multi-species flux inversion framework
- Performing OSSEs to assess the information gained from multi-species flux inversion

## References

- [1] Liu, Z. et al. (2013) *J. Air & Waste Manag. Assoc. CMAS-2012 special issue.*, in press.
- [2] Palmer, P. I. et al. (2006) *J. Geophys. Res.*, 111, D12318.
- [3] Wang, H. et al. (2009) *Atmos. Chem. Phys.*, 9, 7313-7323.

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