

# Synergy between Emission Verification for Climate and Air Quality:

## CMAQ Modeling Analysis over the Contiguous US domain

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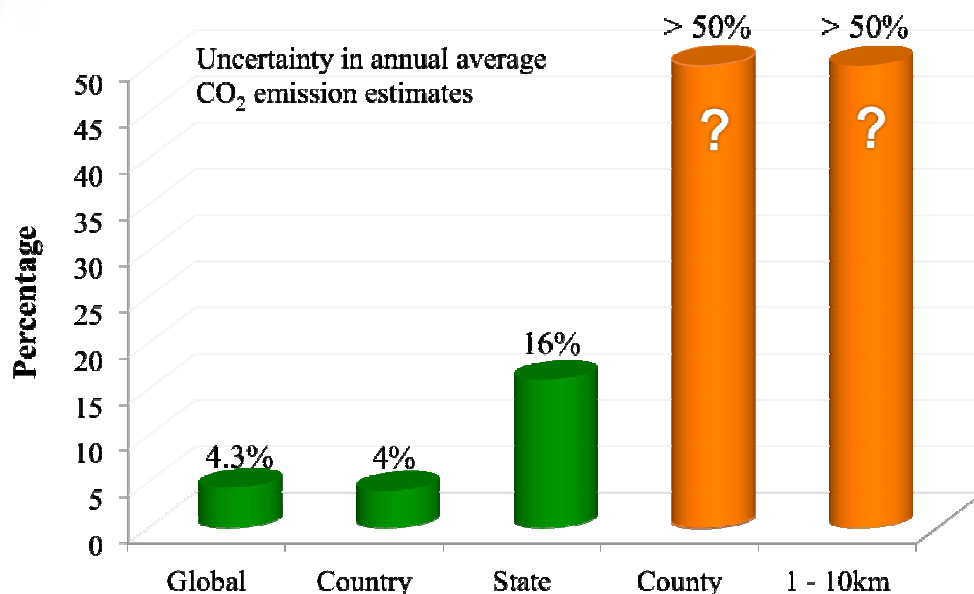
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# Fossil-fuel CO<sub>2</sub> emission verification: *uncertainties in fossil-fuel CO<sub>2</sub> emissions*

## spatiotemporal distributions

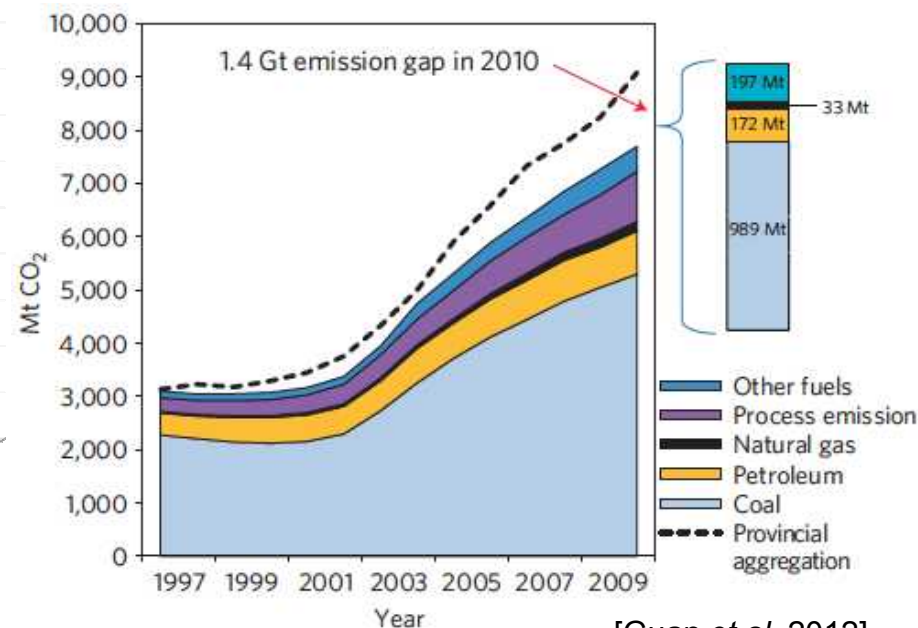


higher uncertainty after temporal allocation!

Sources: Global: NRC [2010]; Country: EPA [2012]; State, county and 1-10km: Gurney et al. [2009]

## national emission trends

The gigatonne gap in China's CO<sub>2</sub> inventories



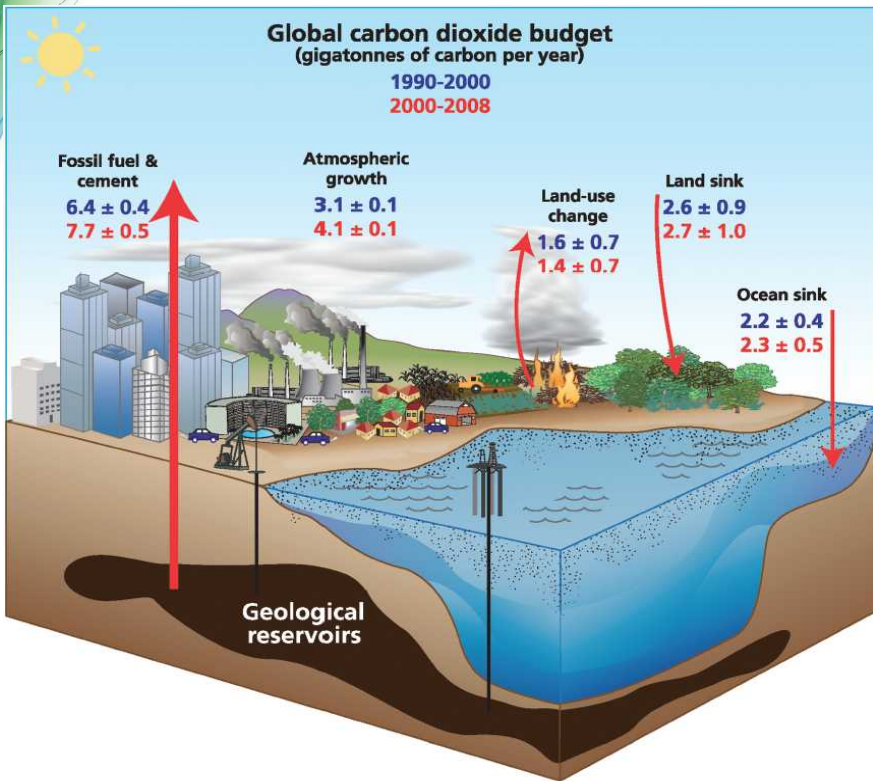
[Guan et al. 2012]

Verifying fossil CO<sub>2</sub> emissions is

*"firmly on the agenda of science, politics, and business".*

[Marland, 2008]

# Challenges in atmospheric CO<sub>2</sub> source attribution

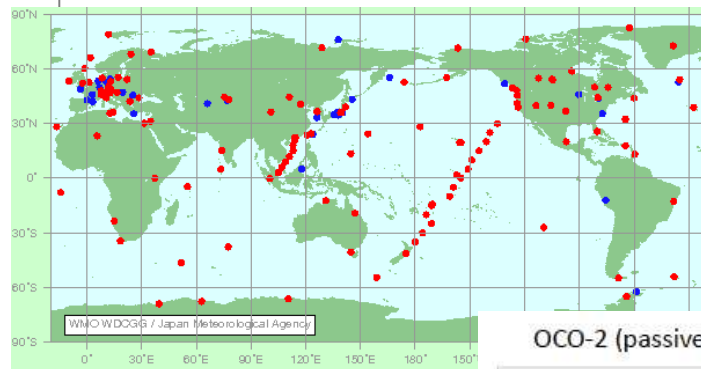


$$[CO_2]_{OBS} = [CO_2]_{natural} + [CO_2]_{fossil} + [CO_2]_{background}$$

Fossil-fuel emission

Terrestrial carbon cycle (highly uncertain)

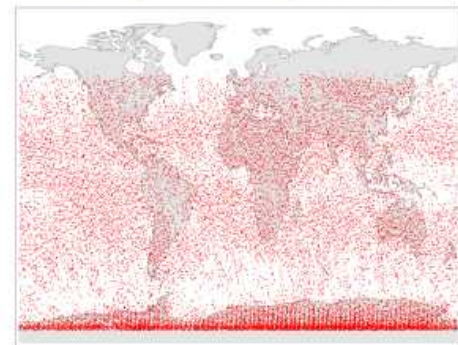
In situ network



satellites

OCO-2 (passive SWIR, launch 2014)

[http://ds.data.jma.go.jp/gmd/wdcgg/cgi-bin/wdcgg/map\\_search.cgi](http://ds.data.jma.go.jp/gmd/wdcgg/cgi-bin/wdcgg/map_search.cgi)



Caia et al., 2013

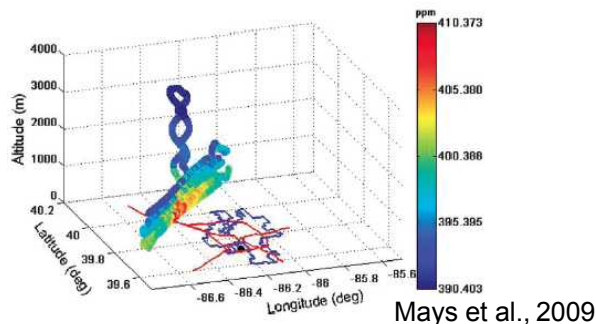
**NRC, 2010: Verifying Greenhouse Gas Emissions:**  
Methods to Support International Climate Agreements, pp16, Fig. 1.3

Quantifying fossil-fuel emissions is difficult due to:

- (1) Large and uncertain natural carbon fluxes
- (2) Sparse/inadequate observational data
- (3) Transport model biases

# Current CO<sub>2</sub> emission verification activities and motivations for regional CO<sub>2</sub> modeling

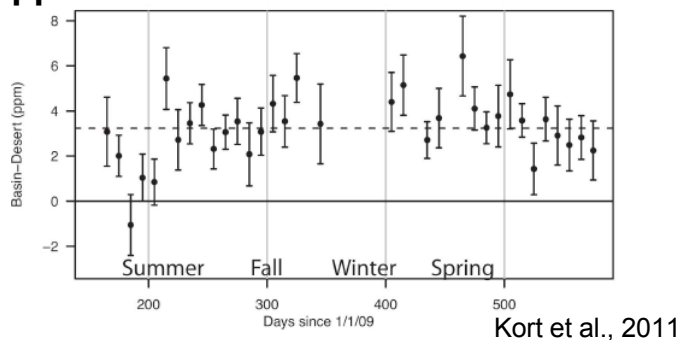
## Approach I: in situ observations



## Research needs

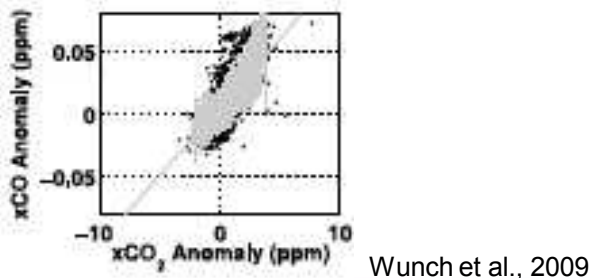
Understanding the fine-scale spatial distribution of CO<sub>2</sub> and influence of the biosphere

## Approach II: satellite observations



Characterizing the observational system

## Approach III: tracer correlation/ratio



Understanding the CO<sub>2</sub>:tracer relationships



# CMAQ-CO<sub>2</sub> Model configuration

## ❑ CMAQ model setup

✓ Version	:	CMAQ v5.0
✓ Domain	:	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	:	(1) CT-2011 (1°× 1°; 3-hourly) (2) CASA (1°× 1°; 3-hourly) (3) CLM4MIP (0.5°× 0.5°; 3-hourly)
✓ Fossil fuel emissions	:	(1) Vulcan (2002; 10km; hourly) in the US (2) CDIAC (2007; 1°× 1°; monthly) outside
✓ Fire emissions	:	GFEDv3.1 (0.5°× 0.5°; 3-hourly)
✓ Ocean fluxes	:	CT-2011 (1°× 1°; 3-hourly)

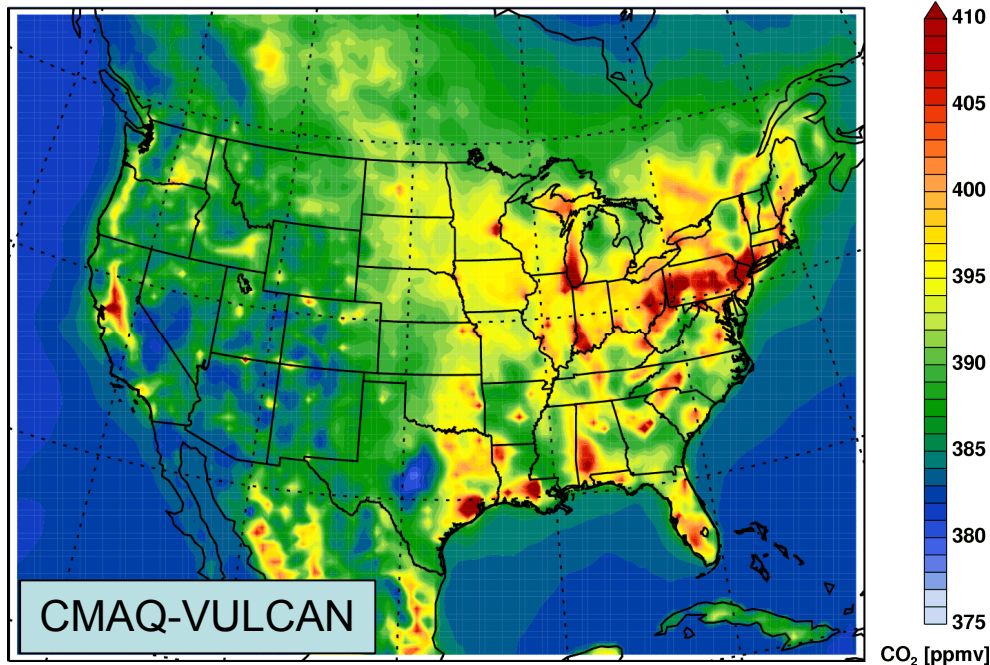
## ❑ Chemistry simulation

✓ 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

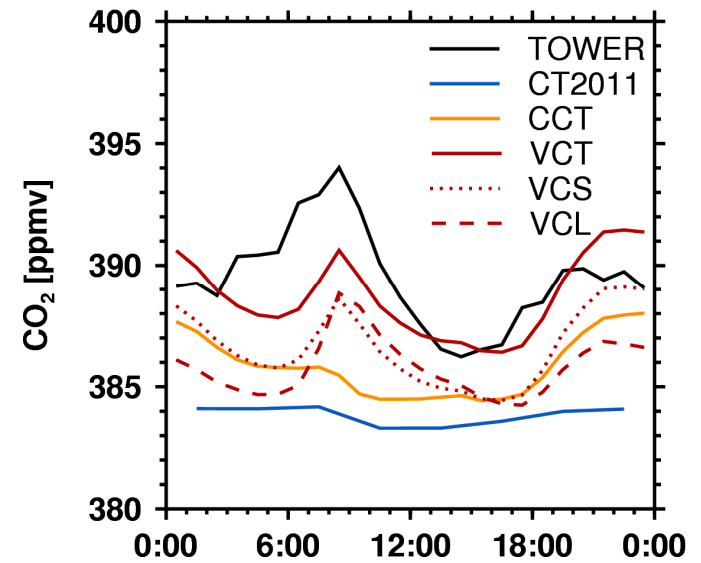
(For details refer to Liu *et al.*, 2013, JAWMA CMAS-2013 special issue)

# CMAQ-CO<sub>2</sub> model evaluation

From CarbonTracker-2011 to CMAQ-CO<sub>2</sub>  
(Surface CO<sub>2</sub> in October 2007)



Model evaluation using tall tower data

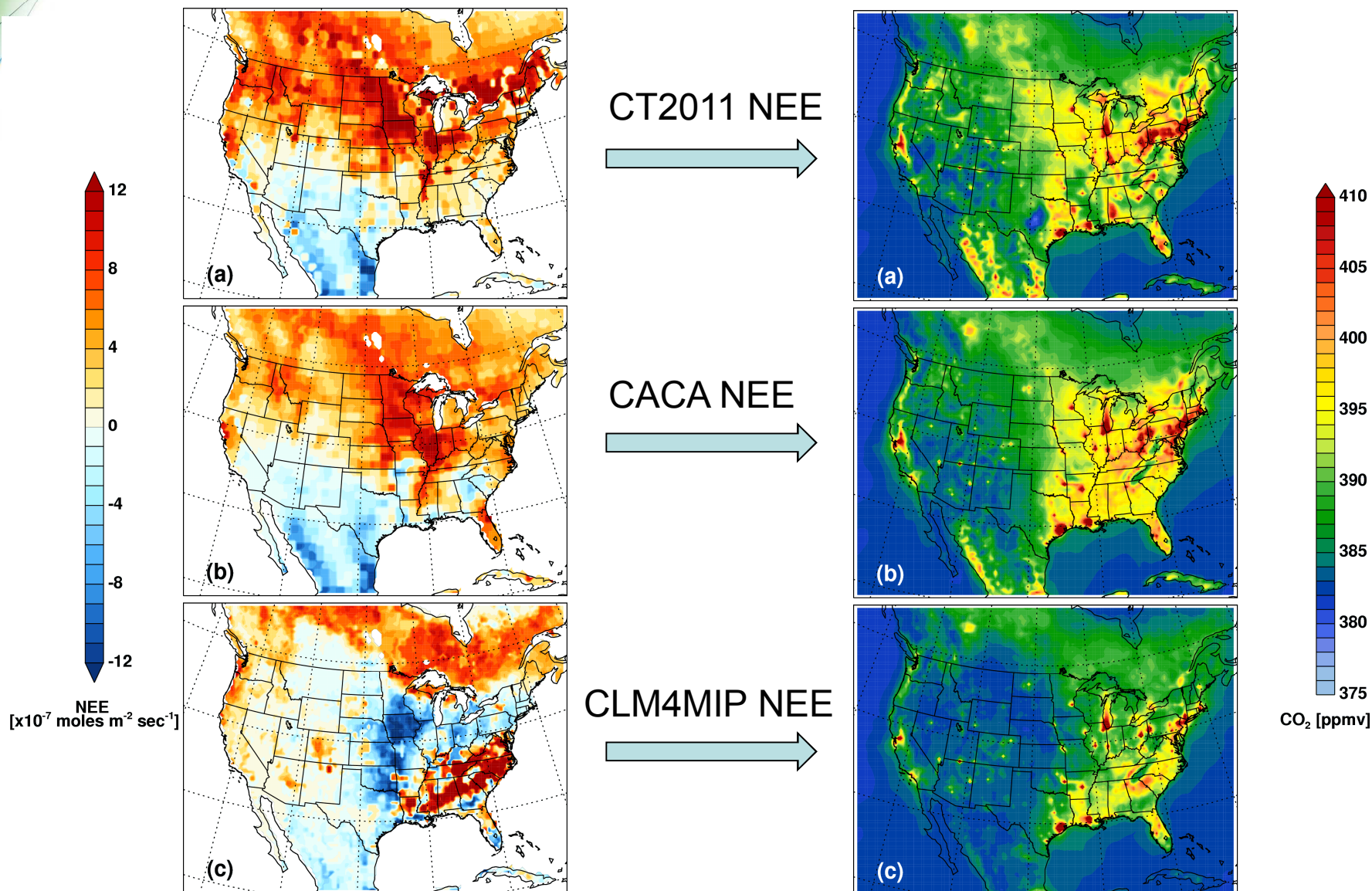


Monthly mean diurnal profiles of CO<sub>2</sub> in October 2007 observed at Boulder Atmospheric Observatory (BAO) (TOWER) and simulated by CT2011 and CMAQ with different configurations:  
CCT: CDIAC FF emissions and CT2011 NEE;  
VCT: Vulcan FF emissions and CT2011 NEE;  
VCS: Vulcan FF emissions and CASA NEE;  
VLM: Vulcan FF emissions and CLM4VIC NEE.

## Examples of 'First-order' scientific questions to address with CMAQ:

- ✓ What are the impacts of biosphere (and its uncertainties) on regional/urban CO<sub>2</sub> distribution?
- ✓ How well/difficult can we see fossil-fuel CO<sub>2</sub> (FFCO<sub>2</sub>) from space?
- ✓ How similar/different are the distributions of FFCO<sub>2</sub> and combustion byproducts?

## *Sensitivity to different NEE inputs*

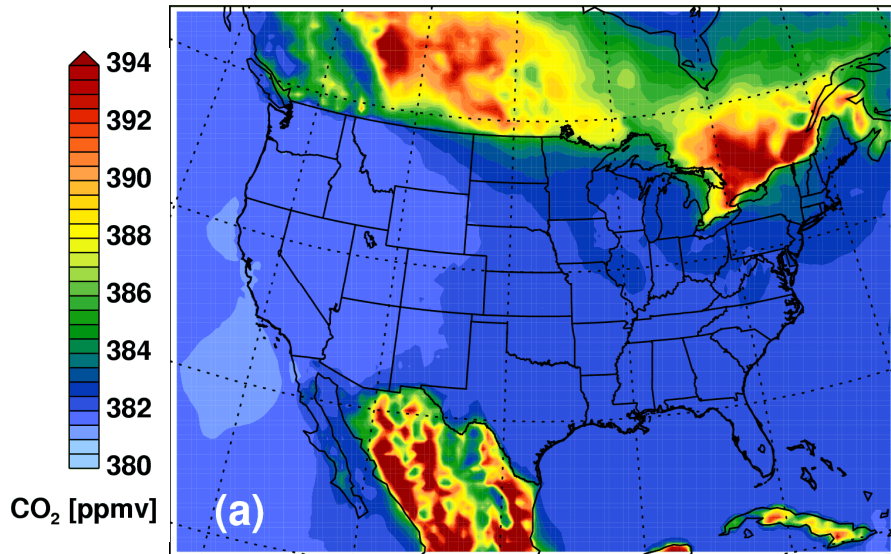




# Decomposition of CO<sub>2</sub> components

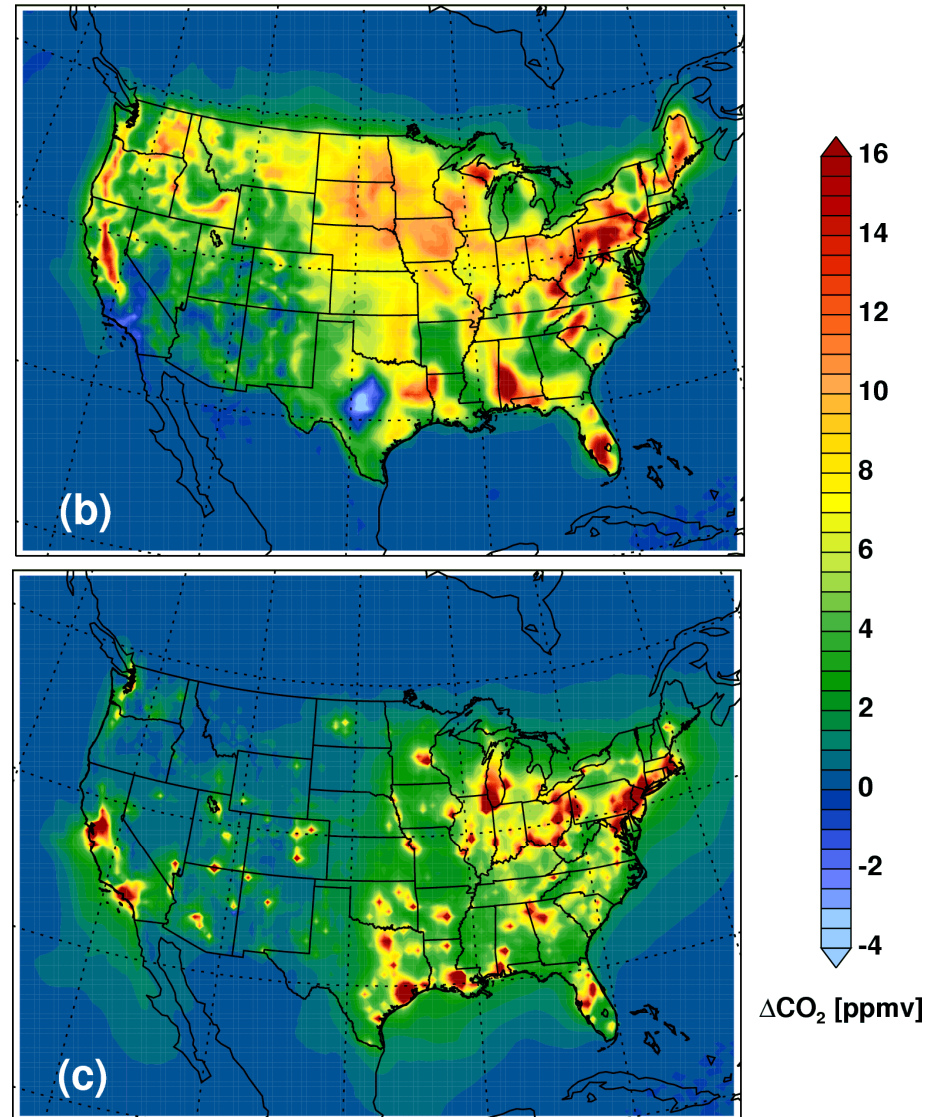
Background, biosphere and fossil-fuel CO<sub>2</sub> components (October 2007)

Background (w/o US fluxes)



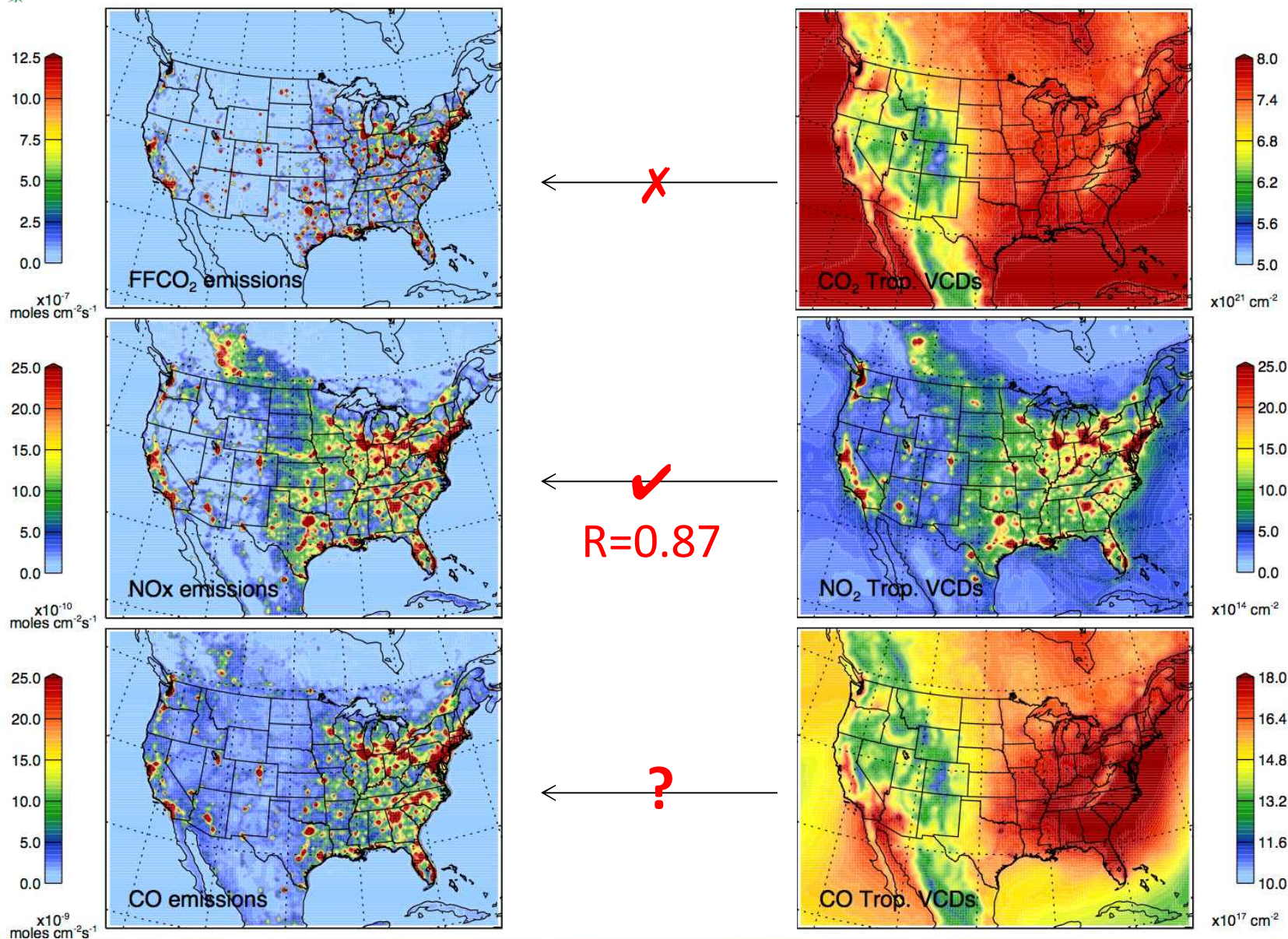
Fossil-fuel CO<sub>2</sub> →

Biospheric CO<sub>2</sub>





# Using CMAQ to simulate space-observed CO<sub>2</sub> and combustion tracers (July)



# Using tracers to constrain fossil-fuel CO<sub>2</sub> emissions: theoretical considerations

## (1) The emission ratio approach $E_{CO_2} = \beta E_{tracer}$ :

[e.g., Berezin *et al.* 2013]

### **Requirements/circumstances:**

- a. abundant and reliable observational data for the tracer (not necessary for CO<sub>2</sub>)
- b. good knowledge of the emission ratio ( $\beta$ )

### **Research needs:**

- a. quantify emission ratios for different sources
- b. method uncertainty quantification

## (2) The concentration slope approach $C_{CO_2} = \alpha C_{tracer}$ :

[e.g., Prather *et al.*, 1985; Brioude *et al.*, 2012; Silva *et al.*, 2013]

### **Requirements/circumstances:**

- a. observation data for both CO<sub>2</sub> and tracer
- b. CO<sub>2</sub> and tracer has almost identical sources

### **Research needs:**

- a. understand factors that affect the tracer slope and correlation.
- b. method uncertainty quantification

## (3) The formal joint inversion approach:

[e.g., Wang *et al.* 2009]

### **Requirements/circumstances:**

- a. observation data for both CO<sub>2</sub> and tracer
- b. knowledge of the transport and prior error correlations between CO<sub>2</sub> and tracer

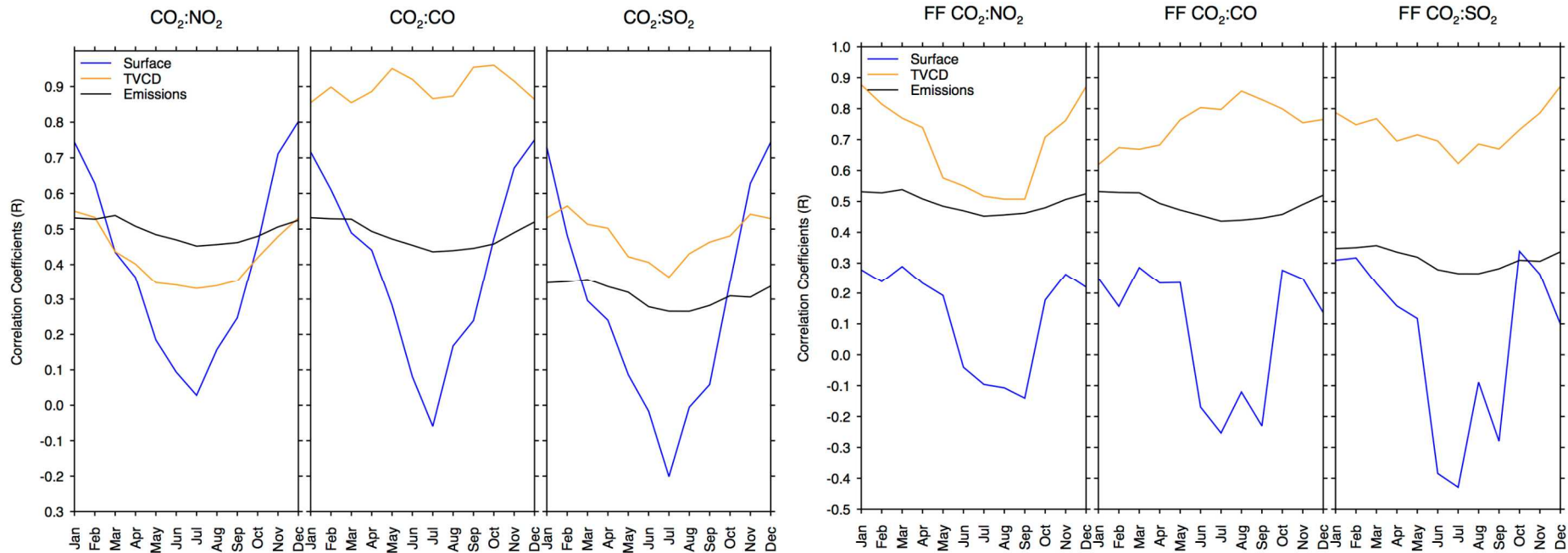
### **Research needs:**

- a. quantify transport and and prior error correlations

# CMAQ-simulated spatial correlations of CO<sub>2</sub> and combustion tracers

We examined spatial correlations in the US domain for

- (1) emissions (monthly mean)
- (2) surface concentrations (local time 14:00)
- (3) tropospheric vertical column densities (TVCDs, local time 14:00)
- (4) both CO<sub>2</sub> and its fossil-fuel CO<sub>2</sub> component (FF CO<sub>2</sub>)



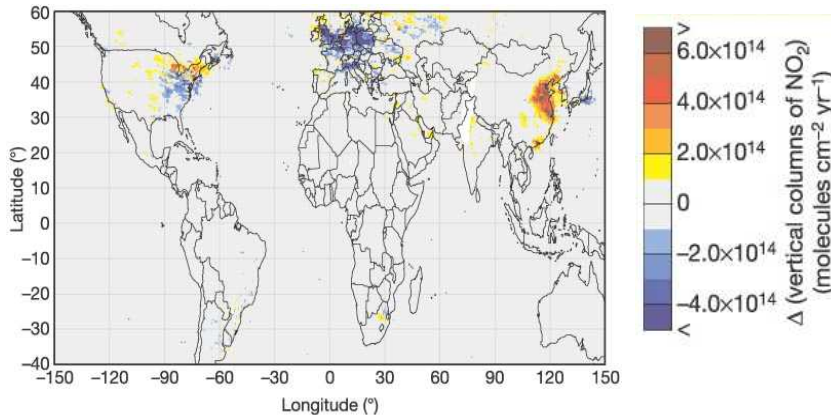
- ✓ Moderate to low emission correlations due to source differences
- ✓ FF CO<sub>2</sub> and combustion tracers are more closely related when observed from space
- ✓ Transport is a major factor shaping the atmospheric concentration patterns and correlations



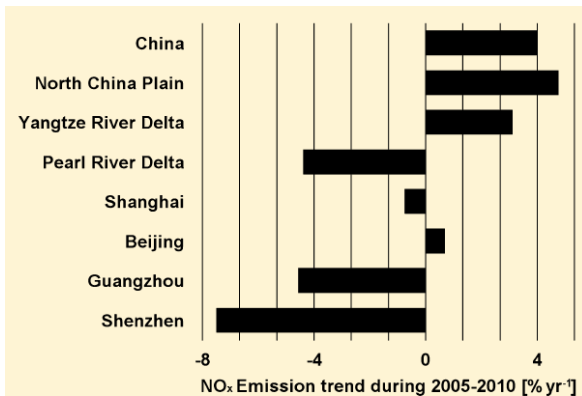
# Tropospheric NO<sub>2</sub> VCDs: a good fossil-fuel CO<sub>2</sub> tracer?

Satellite NO<sub>2</sub> as an indicator of fossil-fuel emissions

1996-2002 GOME NO<sub>2</sub> trends [Richter *et al.* 2005]

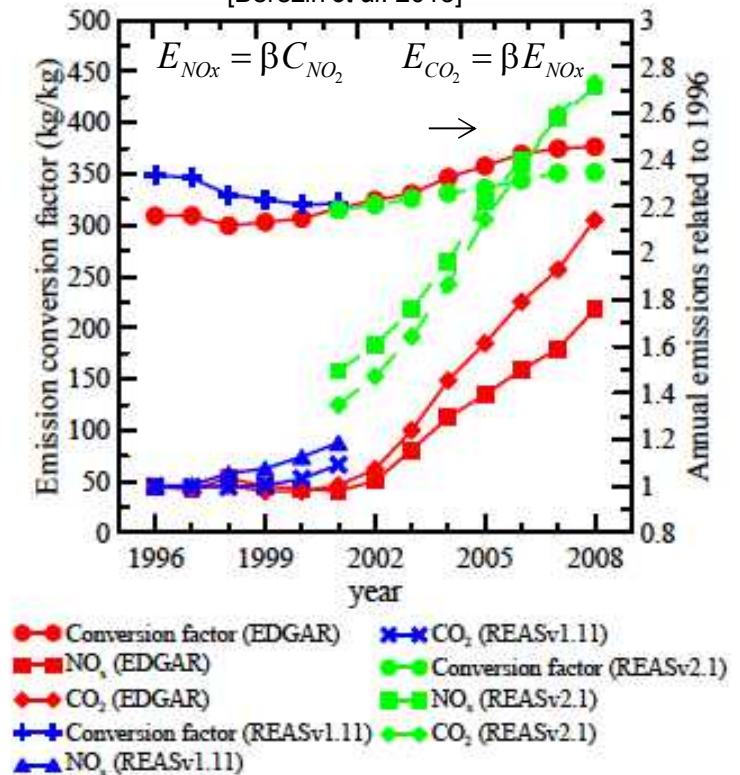


2005-2010 emission trends using OMI NO<sub>2</sub> [Gu *et al.* 2013]



Estimate CO<sub>2</sub> emissions trends using satellite NO<sub>2</sub>

1996-2008 CO<sub>2</sub> emission trends from GOME and SCIAMACHY NO<sub>2</sub> [Berezin *et al.* 2013]

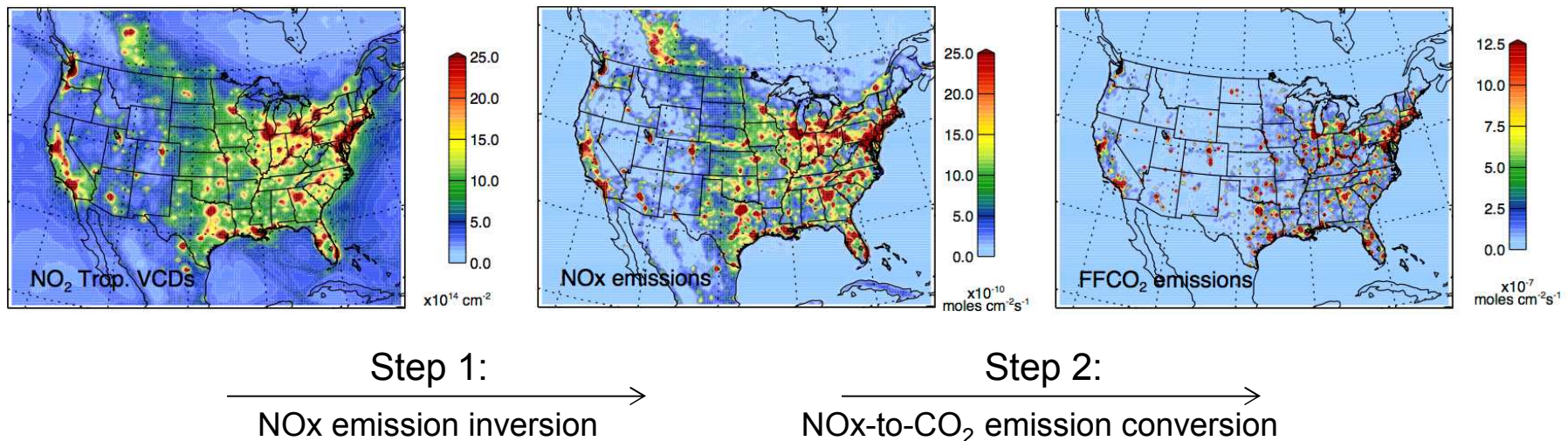


# Using tropospheric NO<sub>2</sub> VCDs to constrain fossil-fuel CO<sub>2</sub> emissions

## Theoretical and practical considerations:

- 1) Satellite-observed tropospheric NO<sub>2</sub> VCDs closely relate to NO<sub>x</sub> emissions;
- 2) abundant data and experience are available from NO<sub>x</sub> emission verification by the air quality research community.

## Steps:



## Key technical development (on going):

- ✓ Carefully compiled CO<sub>2</sub>:NO<sub>x</sub> emission ratio data;
- ✓ An inversion scheme properly taking into account the non-linear dynamics involving NO<sub>x</sub> emissions and chemistry, NO<sub>2</sub> vertical profiles, and tropospheric NO<sub>2</sub> vertical column densities (VCDs);
- ✓ Uncertainty quantification and comparison with the prior emission uncertainties

- ❑ We demonstrated how a regional chemical transport model like CMAQ can help understand regional CO<sub>2</sub> variability and facilitate emission verifications.
- ❑ We showed the similarities between fossil-fuel CO<sub>2</sub> and those combustion byproducts, which have long been studied by the air-quality community.
- ❑ Using a combustion byproduct as a tracer could help mitigate the challenges in atmospheric CO<sub>2</sub> source attribution.
- ❑ We outlined an approach to using satellite NO<sub>2</sub> observations to constrain fossil-fuel CO<sub>2</sub>.



# Acknowledgements

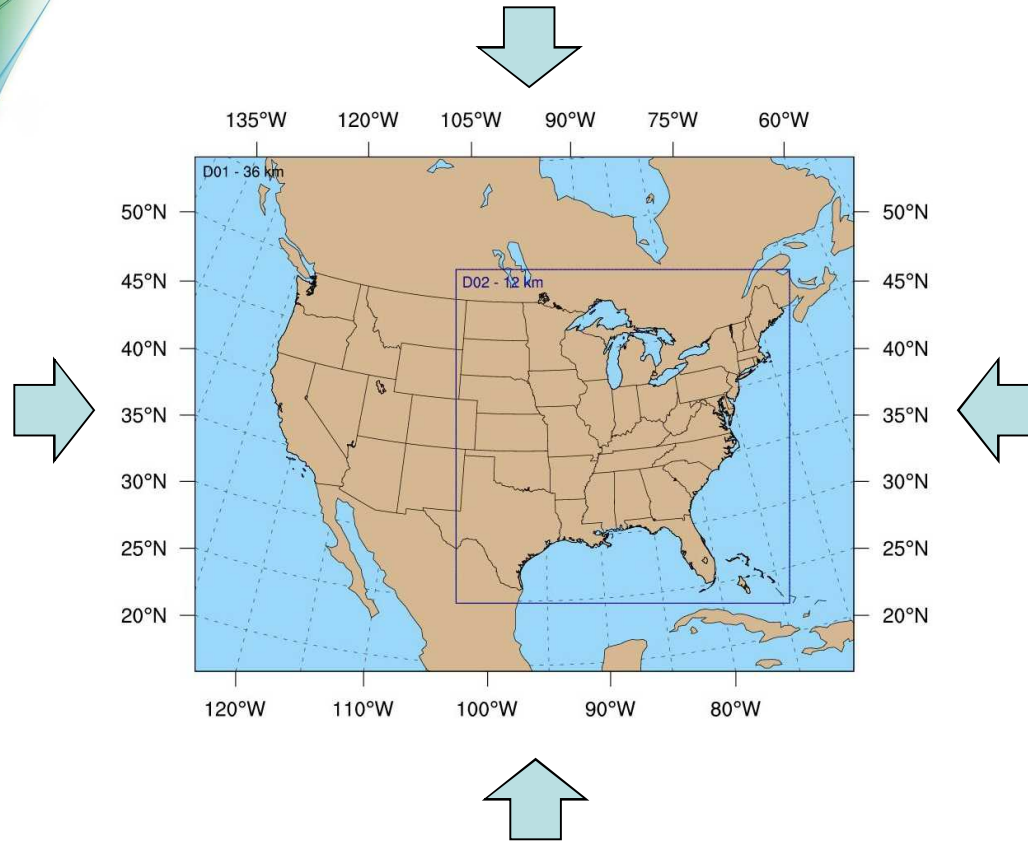
- ☐ CarbonTracker-2011 results are provided by NOAA ESRL (<http://carbontracker.noaa.gov>).
- ☐ Tower CO<sub>2</sub> data are provided by NOAA GMD.
- ☐ The CLM4VIC output is a product of the MsTMIP project
- ☐ WRF output and non-CO<sub>2</sub> emission data are shared by the SESARM project (<http://www.metro4-sesarm.org>).
- ☐ Funding for this work was provided by Sandia National Laboratories, Laboratory Directed Research And Development Program. Sandia is a multi-program laboratory operated by Sandia Corporation, a Lockheed Martin Company, for the National Nuclear Security Administration under contract DE-AC04-94-AL85000.

***Thank you for your attention!!***



## Backup slides

# CMAQ-CO<sub>2</sub> model configuration



CO<sub>2</sub> Initial/boundary conditions: CT-2011 (1°× 1°; 3-hourly)

## ☐ Meteorology and resolution

WRFv3.1.1 assimilated meteorology for 2007  
36km resolution;

## ☐ CO<sub>2</sub> simulation

### ✓ BC and IC:

CT-2011 (1°× 1°; 3-hourly)

### ✓ Biosphere fluxes :

(1: STD) CT-2011 (1°× 1°; 3-hourly)

(2) CASA (1°× 1°; 3-hourly)

(3) CLM4MIP (0.5°× 0.5°; 3-hourly)

### ✓ Fossil fuel emissions:

(1: STD) Vulcan (2002; 10km; hourly) in the US

(2) CDIAC (2007; 1°× 1°; monthly) outside the US

### ✓ Fire emissions:

GFEDv3.1 (0.5°× 0.5°; 3-hourly)

### ✓ Ocean fluxes:

CT-2011 (1°× 1°; 3-hourly)

## ☐ Chemistry simulation

### ✓ BC and IC:

GEOS-Chem v8.2.1

### ✓ Biogenic emissions:

MEGAN v2.1

### ✓ Anthropogenic emissions:

NEI-2005

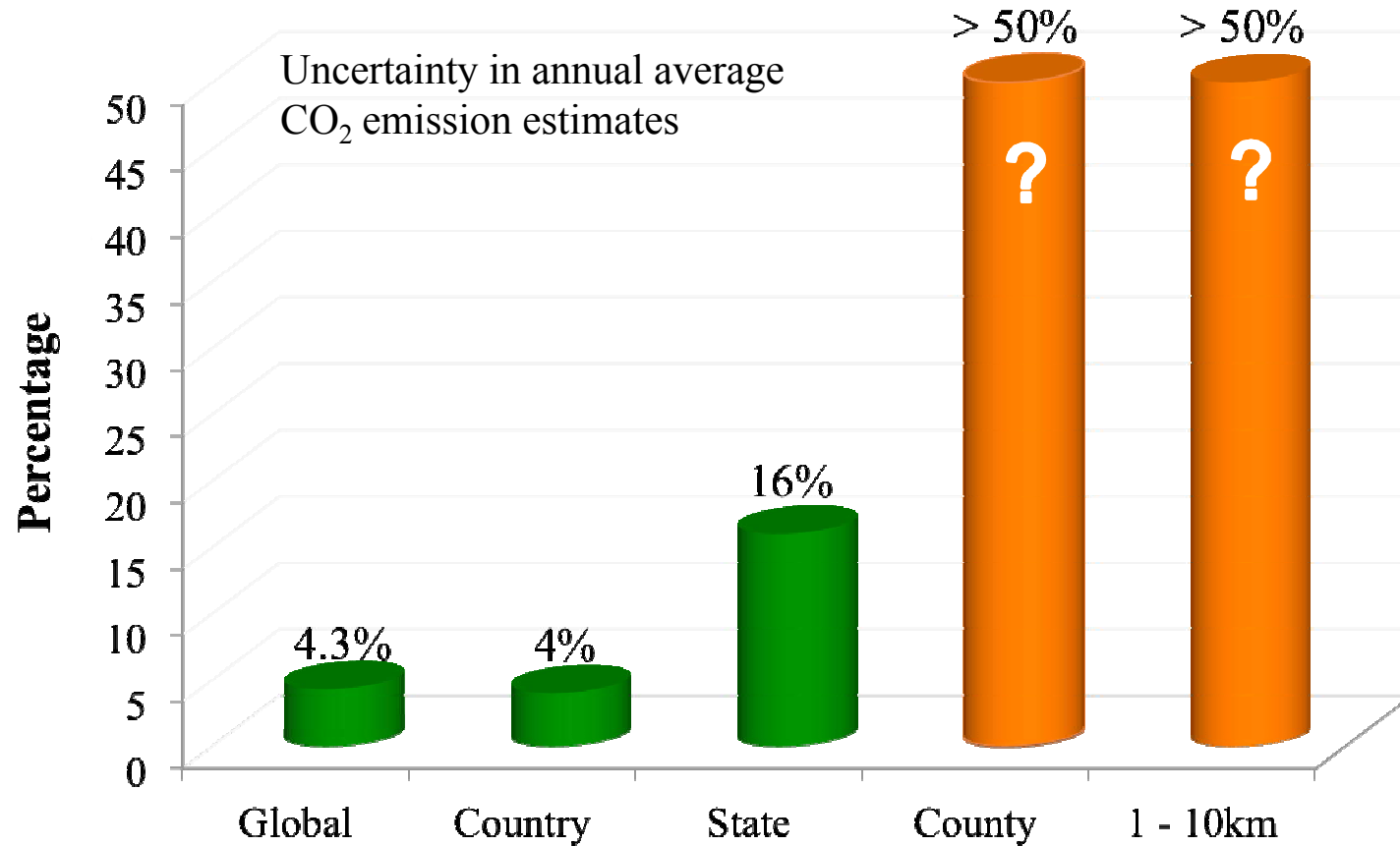
### ✓ Fire emissions:

Blue Sky + FEPS

### ✓ Chemistry:CB-05



# Uncertainty of fossil-fuel CO<sub>2</sub> emissions



higher uncertainty after temporal allocation!

Sources: **Global:** NRC [2010]; **Country:** EPA [2012]; **State, county and 1-10km:** Gurney et al. [2009]