# The Impact of Accounting for 3-D CO<sub>2</sub> Production on Inversion for Natural Fluxes **Using GOSAT and In Situ Observations**



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## 1. Introduction

Most atmospheric inversions for estimating natural carbon dioxide ( $CO_2$ ) fluxes have placed CO<sub>2</sub> release from fossil fuel combustion and other sources entirely at the surface. However, a portion of fossil fuel and biospheric carbon emissions (~1 Pg C y<sup>-1</sup>) occurs in the form of reduced carbon species including carbon monoxide (CO), methane (CH<sub>4</sub>), and non-methane volatile organic compounds (NMVOCs), which are oxidized to CO<sub>2</sub> downwind of the emissions. Omission of this 'chemical pump' can result in a shift in the distribution of the inferred fluxes, e.g. in the global sink from the tropics to the northern extratropics. A few inversion studies using surface  $CO_2$ observations have accounted for the chemical pump, the most thorough analysis being conducted by Suntharalingam et al. [2005]. Nassar et al. [2010] presented a forward model analysis using advanced chemistry model output.

We further examine the impact of accounting for the chemical pump on flux inversions, with the added dimension of **considering satellite observation**based as well as surface in situ-based inversions. Our hypothesis is that there will be differing regional impacts in GOSAT and in situ inversions due to differences in horizontal and vertical observational sampling. This study employs a relatively high spatiotemporal resolution Bayesian inversion approach, and atmospheric CO<sub>2</sub> production rates derived from a state-of-theart NASA chemistry model historical simulation. Early results are presented below.

## 2. Methods

Assimilated observations

- •In situ: Individual flask and afternoon-averaged continuous measurements from NOAA ESRL and JMA
- •GOSAT: ACOS B3.4 retrieval of weighted column-average CO<sub>2</sub>, filtered and biascorrected (figure on the right)
- •Prior constraints
  - •Net ecosystem production (NEP) and fire fluxes from CASA-GFED v.3 model •Ocean fluxes from Takahashi et al. [2009]
  - •Fossil CO<sub>2</sub> emissions from CDIAC
- •Atmospheric CO<sub>2</sub> production and surface correction
  - •CO oxidation ( $\approx$  CO<sub>2</sub> production) rates from NASA GEOS-5 GMI chemistry-climate model nudged to MERRA-2 reanalysis meteorology
  - •Fossil fuel CO and NMVOCs: As initial estimate, assume a uniform 4.89% of fossil CO<sub>2</sub> as with Nassar et al. [2010]
  - •Biomass and biofuel burning: Apply non-CO<sub>2</sub> emission factor from GFED averaged over ecosystem types

### GOSAT retrievals in model grid, June 2009-May 2010



<sup>5</sup> 1152533544555566577588599510

#### Flux regions and in situ observation sites



•Biospheric CH<sub>4</sub>: TransCom-CH<sub>4</sub> interannually varying emissions [Patra et al., 2011] •Biospheric NMVOCs: Initially, apply global NMVOC/CH<sub>4</sub> ratio from Nassar et al. [2010] uniformly to our biospheric CH<sub>4</sub> distribution

#### •Transport model

•PCTM, with MERRA meteorology, 2° latitude x 2.5° longitude x 56 levels

•Inversion technique [Wang et al., 2018, in review, ACP]

50 km

20 km

5 km

• "TransCom"-style batch Bayesian synthesis inversion

•Optimize natural fluxes in **108 regions** (map on the right) over **8-day intervals**, and

initial concentrations; high resolution minimizes aggregation error.



### **3. Forward Model Simulations**

3-D CO2 Production and Surface Correction Budgets		
Component	Global, Annual Total (Pg C/y)	
	2009-2010, this work	2006, Nassar et al. (2010)
Total chemical production	1.15	1.05
Total surface correction	0.97	0.83
Fossil fuel combustion	0.41	0.38
Biomass and biofuel burning	0.23	0.00
Biospheric CH <sub>4</sub>	0.16	0.28
Biospheric NMVOCs	0.16	0.16

(Note that Nassar et al. did not apply surface corrections for biomass and biofuel burning since they did not include non-CO<sub>2</sub> carbon emissions for those sources in their baseline CO<sub>2</sub> simulation)

Atmospheric Concentrations After 1 Year



### Distribution of CO<sub>2</sub> chemical production (March, 2010)



#### 3-D CO2 Production tracer

#### Tot. Surface Correction tracer 3–D Prod minus Surf. Correction



¥ 2

0



- Surface in situ observations are more sensitive to the surface correction than are satellite column observations, especially over land
- The combination of 3-D CO2 production and the surface correction generally elevates concentrations in the tropics and southern extratropics, lowers concentrations in the north

• CO<sub>2</sub> production is greatest where OH oxidant is most abundant, i.e. in the tropics, and secondarily where CO and VOC concentrations are highest

### **4. Inversion Results**

Aggregated Regions, June 2009-May 2010 Prior Flux (Pg C/yr) In Situ Posterior In Situ + 3D CO2 GOSAT Posterior GOSAT + 3D CO2

•Similar to previous studies, accounting for chemical pump **shifts** a portion of the global CO<sub>2</sub> sink from the north to the tropics and south

•In addition, we see a **shift** in the sink from land to oceans in the GOSAT inversion •GOSAT inversion appears more sensitive to chemical pump than in situ inversion in ocean regions  $\rightarrow$  The available GOSAT observations can see more of the chemical production throughout column than the surface observations

•Overall, the impact of accounting for 3-D CO<sub>2</sub> production appears minor compared to difference between in situ and GOSAT inversions



### 5. Conclusions and Further Work

- •Our analysis of the impact of 3-D CO<sub>2</sub> production and surface correction on flux inversions confirms small but possibly significant shifts in the global sink seen in a previous analysis
- •In addition, we find that a GOSAT inversion may be more sensitive to the 'chemical pump' in ocean regions than a surface observation-based inversion
- •We will examine in more depth the impact of the chemical pump on posterior fluxes via column vs. surface observations •We will also test an alternative fossil CO<sub>2</sub> emissions database, ODIAC, in place of CDIAC

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