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## Quantifying the Impact of Atmospheric Transport Uncertainty on CO<sub>2</sub> Surface Flux Estimates

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## RESEARCH ARTICLE

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### Special Section:

Carbon and Weather: Results from the Atmospheric Carbon and Transport – America Mission

### Key Points:

- There are systematic differences in transport between two commonly used chemical transport models, TM5 and GEOS-Chem
- These systematic differences lead to significant and meaningful posterior flux uncertainties in atmospheric CO<sub>2</sub> flux inversions

### Supporting Information:

- Supporting Information S1

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## Quantifying the Impact of Atmospheric Transport Uncertainty on CO<sub>2</sub> Surface Flux Estimates

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**Abstract** We show that transport differences between two commonly used global chemical transport models, GEOS-Chem and TM5, lead to systematic space-time differences in modeled distributions of carbon dioxide and sulfur hexafluoride. The distribution of differences suggests inconsistencies between the transport simulated by the models, most likely due to the representation of vertical motion. We further demonstrate that these transport differences result in systematic differences in surface CO<sub>2</sub> flux estimated by a collection of global atmospheric inverse models using TM5 and GEOS-Chem and constrained by in situ and satellite observations. While the impact on inferred surface fluxes is most easily illustrated in the magnitude of the seasonal cycle of surface CO<sub>2</sub> exchange, it is the annual carbon budgets that are particularly relevant for carbon cycle science and policy. We show that inverse model flux estimates for large zonal bands can have systematic biases of up to 1.7 PgC/year due to large-scale transport uncertainty. These uncertainties will propagate directly into analysis of the annual meridional CO<sub>2</sub> flux gradient between the tropics and northern midlatitudes, a key metric for understanding the location, and more importantly the processes, responsible for the annual global carbon sink. The research suggests that variability among transport models remains the largest source of uncertainty across global flux inversion systems and highlights the importance both of using model ensembles and of using independent constraints to evaluate simulated transport.

### 1. Introduction

Fossil fuel combustion releases approximately 10 PgC/year into the atmosphere. Long-term monitoring of atmospheric CO<sub>2</sub> levels has clearly shown that only about half of those emissions stay in the atmosphere (Ballantyne et al., 2012). The other half of the emissions are sequestered in some fashion in the oceans and land biosphere. At large scales, these fluxes are difficult to observe directly, and instead, the primary observational constraint available to us is the signature they leave behind in atmospheric CO<sub>2</sub> concentrations. Atmospheric inverse modeling has become a primary tool for quantifying the space-time distribution of the land-ocean sink and identifying underlying processes responsible for the sink.

Inverse modeling is the estimation of surface fluxes of atmospheric CO<sub>2</sub>, both into and out of the surface, from analysis of observed atmospheric gradients of carbon dioxide in tandem with estimated atmospheric transport. In these models, atmospheric transport is usually assumed to be known and without systematic bias. As a result, quantifying the impacts of transport errors on surface flux estimation has long been a focus of carbon cycle research. The TransCom project was initiated in the early 1990s with the objective of quantifying differences between atmospheric transport models. Denning et al. (1999) summarized many of the differences among contemporary transport models using the anthropogenic tracer SF<sub>6</sub>. Patra

et al. (2011) revisited the topic a decade later, using SF<sub>6</sub> interhemispheric gradients to validate global CH<sub>4</sub> simulations by a suite of 12 atmospheric transport models. Using the results from TransCom, Stephens et al. (2007) determined that the potential impact of model transport upon the apportionment of CO<sub>2</sub> flux between the northern midlatitudes and the tropics was far from trivial, showing high correlations between the vertical mixing strength of the transport models and the inferred apportionment. More recently, with the increased focus on Arctic carbon emissions and subsequent increase in high-latitude field campaigns, researchers are revisiting the transport questions with respect to high-latitude dynamics of atmospheric CO<sub>2</sub>. Barnes et al. (2016) showed that high-latitude seasonality in CO<sub>2</sub> is often driven more strongly by mid-latitude surface fluxes combined with vigorous meridional mixing than by local flux signals. Parazoo et al. (2011) showed that this effect is often clarified by viewing the meridional transport of CO<sub>2</sub> in an appropriate vertical coordinate system, for example, isentropes versus pressure levels.

In this paper, we employ two popular offline chemical transport models and the suite of inverse models being used to estimate surface fluxes from the Orbiting Carbon Observatory-2 (OCO-2) column-averaged carbon dioxide (X<sub>CO<sub>2</sub></sub>) data, to help understand the relationship between the differences in modeled transport and the surface fluxes estimated by atmospheric inversions.

## 2. Methods

We conducted simulations of carbon dioxide (CO<sub>2</sub>) and sulfur hexafluoride (SF<sub>6</sub>) in two atmospheric transport models, TM5 and GEOS-Chem. In contrast to inverse simulations aimed at finding optimal surface CO<sub>2</sub> fluxes, these are “forward” simulations in which both transport models use the same surface fluxes of CO<sub>2</sub> and SF<sub>6</sub>. In this experiment, differences in the distributions of tracers between the two models are due almost entirely to differences in transport.

### 2.1. Transport Models

#### 2.1.1. TM5/ERA-Interim

TM5 is a global offline chemical transport model based on the predecessor model TM3 (Dentener, 2003; Houweling et al., 1998), with the capability of using two-way nested grids and including improvements in the advection scheme, vertical diffusion parameterization, and meteorological preprocessing of the wind fields (Krol et al., 2005). TM5 simulates advection, deep and shallow convection, and vertical diffusion in both the planetary boundary layer (PBL) and free troposphere. The model is driven by ECMWF ERA-interim (ERA-i) reanalysis meteorology, which is computed with 80-km horizontal resolution. Winds and mass fluxes from ERA-i are preprocessed by TM5 into coarser grids, with attention to creating fields that conserve tracer and dry air mass in TM5. Like most numerical weather prediction models, advection in the parent ECMWF model is not strictly mass conserving, so this preprocessing step is designed to enforce tracer mass conservation, which is crucial for trace gas modeling. For simulations reported in this paper, TM5 was run at a global 3° longitude × 2° latitude resolution. For some identified simulations, a nested 1° × 1° resolution grid was used over North America. TM5 uses a dynamically variable time step with a maximum length of 90 min. This overall time step is dynamically reduced to maintain numerical stability, generally during times of high wind speeds. Furthermore, transport operators in nested grids are modeled at shorter time steps, so processes at the finest scales are conducted at an effective time step of one quarter the overall time step. We will use “TM5” to refer to this configuration of TM5 with ERA-i meteorology.

#### 2.1.2. GEOS-Chem/Modern Era Retrospective-analysis for Research and Applications

GEOS-Chem (Bey et al., 2001; Lin & Rood, 1996) is an offline global chemical transport model developed by an extensive global community of researchers, including teams at Harvard University and the Global Modeling and Assimilation Office (GMAO) at NASA's Goddard Space Flight Center. GEOS-Chem separately simulates advection, deep and shallow convection, and vertical diffusion in the PBL. We use the version 11-01 of GEOS-Chem which has improved mass conservation (Lee & Weidner, 2016) and tracer advection over previous versions, and also includes modifications to more correctly simulate the impacts of variable water vapor content and dry air mass. Meteorology to drive the GEOS-Chem simulations is regridded from MERRA2 reanalyses (Bosilovich, 2015; Rienecker et al., 2011) to 2.5° longitude × 2° latitude. GEOS-Chem is run using a 15-min dynamical time step. The native 72 levels of the MERRA2 grid are reduced to 47 levels for use in GEOS-Chem by aggregating levels above approximately 70 hPa. This configuration of GEOS-Chem with MERRA2 meteorology is abbreviated “GEOS-Chem” in the following text. We also note that tests were run with both MERRA1 and MERRA2 reanalysis fields with no noticeable effects on the conclusions being

drawn in the paper, suggesting that the differences between versions of MERRA reanalysis are likely much smaller than the differences between GEOS-Chem/MERRA and TM5/ERA-i.

## 2.2. CO<sub>2</sub> Simulations

We conduct CO<sub>2</sub> forward runs in both models from 1 January 2000 to 31 December 2010. Initial CO<sub>2</sub> concentrations and surface fluxes throughout the simulation come from the CarbonTracker CT2016 release (Peters et al., 2007, with updates documented at <http://carbontracker.noaa.gov>). The initial condition field used by both models at 1 January 2000 was created by extrapolating the NOAA marine boundary layer reference surface (<https://www.esrl.noaa.gov/gmd/ccgg/mb1/mb1.html>, using the method of Masarie & Tans, 1995) for that date using vertical gradients estimated from aircraft profile measurements. Therefore, although the CarbonTracker system uses TM5 as its transport model, the initial condition is not created using a transport model and thus does not have a signature of TM5 transport. For use in GEOS-Chem, the CarbonTracker initial condition was interpolated vertically in pressure and horizontally in space to the GEOS-Chem grid as described in section 3.1.2

CT2016 CO<sub>2</sub> optimized fluxes are partitioned into four flux terms, with five tracers: the background initial condition (no fluxes added), the imposed fossil fuel term, the optimized biological flux, the imposed fire emissions flux, and the optimized oceanic flux. Each of these terms is tracked independently as a tagged tracer. As a result of the optimization procedure, these fluxes are generally consistent with observed atmospheric CO<sub>2</sub> mole fractions. They were created with an inverse modeling system based on TM5 and may have artifacts and inaccuracies associated with that model's atmospheric transport and with assumptions used in the CarbonTracker data assimilation system. However, in the analyses conducted here we do not require that these fluxes be completely correct, only reasonably representative of actual atmospheric CO<sub>2</sub> exchange with the surface. While there is certainly large uncertainty in CT2016 fluxes, important aspects of the flux signals, such as seasonal terrestrial net ecosystem exchange in northern latitudes, placement of fossil fuel emissions, and estimates of biomass burning, are generally consistent with the results from other inversion systems that assimilate surface in situ CO<sub>2</sub> data (Peylin et al., 2013).

## 2.3. SF<sub>6</sub> Simulations

Sulfur hexafluoride (SF<sub>6</sub>) is a potent greenhouse gas used as a dielectric in high-voltage industrial electrical equipment. It has only a minor sink in the mesosphere, resulting in an extremely long atmospheric lifetime estimated somewhere between 850 and 3,200 years (Maiss & Brenninkmeijer, 1998; Ray et al., 2017). Due to its near-conservation in the atmosphere and to its surface emissions being related to electrical power consumption, it is analogous to fossil fuel-derived CO<sub>2</sub> and is frequently used to evaluate the large-scale transport in atmospheric models (Denning et al., 1999; Krol et al., 2017; Patra et al., 2011; Peters et al., 2004). The global atmospheric growth rate of SF<sub>6</sub>, and hence its global emissions source, is particularly well constrained by available observations (Levin et al., 2010).

We created an initial condition for SF<sub>6</sub> in January of 2000 by spinning up TM5 from an all-zero concentration field using a pseudo-SF<sub>6</sub> tracer with exponentially growing emissions. Surface fluxes were derived from the EDGAR emissions inventory for SF<sub>6</sub>, version 4.2 (European Commission, 2011). This inventory manifests approximately exponential growth in global SF<sub>6</sub> emissions in the 1970s and 1980s. Fitting an exponential growth model to global emissions from 1970 to 1990 yields a growth rate of 0.08 year<sup>-1</sup>. TM5 was integrated with this pseudo-SF<sub>6</sub> tracer using repeating meteorology representing the year 2001 for 56 years, until the mole fractions throughout the atmosphere were growing at the same exponential rate to within 10%. The global tracer mole fractions were then scaled using a single multiplicative factor such that the lowest level of the model over the oceans agreed optimally with the NOAA marine boundary layer surface for SF<sub>6</sub> in January 1997, created from NOAA flask measurements using the methods of Masarie and Tans (1995) and measurements at stations listed in Table S1 in the supporting information. SF<sub>6</sub> emissions from 1997 onward were set to the EDGAR values scaled to agree with annual global atmospheric growth rates as estimated from the NOAA marine boundary layer surface.

The initial SF<sub>6</sub> condition for GEOS-Chem was created by first remapping the TM5 field for January 2000 onto the GEOS-Chem grid. GEOS-Chem was then integrated forward using the scaled EDGAR fluxes until January 2005, with the intention of minimizing spin-up artifacts from TM5 transport. The resulting 2005 field was then scaled back to 2000, once again made to agree optimally with the NOAA marine boundary layer reference surface.

**Table 1**
*General Characteristics of the TM5 and GEOS-Chem Inverse Models Participating in the OCO-2 MIP, Demonstrating Also the Diversity of Land Flux Priors Used*

System	Transport	Resolution	Technique	Prior land fluxes	Investigator
CarbonTracker near-real time	TM5	3° × 2° global; 1° × 1° over N.A.	EnKF	CT2016 Opt-Clim	A. Jacobson
TM5-4DVAR	TM5	3° × 2°	Variational	SiB-CASA	S. Basu
University of Oklahoma	TM5	3° × 2°	Variational	CT-NRT Unopt	S. Crowell
CMS-Flux	GEOS-Chem	5° × 4°	Variational	CASA-GFEDv3	J. Liu
Colorado State University	GEOS-Chem	5° × 4°	Batch	SiB4/MERRA2	A. Schuh
University of Edinburgh	GEOS-Chem	5° × 4°	EnKF	CASA	L. Feng
University of Toronto	GEOS-Chem	5° × 4°	Variational	BEPS	F. Deng

*Note.* OCO-2 = Orbiting Carbon Observatory-2; MIP = model intercomparison project.

Models are run from 2000 to 2010 and sampled at locations of NOAA marine boundary layer reference stations where SF<sub>6</sub> measurements are available (see section 2.4.3).

## 2.4. Available Observational Constraints

### 2.4.1. Column-Averaged CO<sub>2</sub> From Space

The OCO-2 satellite was launched in July 2014, with the goal of estimating atmospheric CO<sub>2</sub> mole fractions from spectroscopic absorption features of CO<sub>2</sub> and O<sub>2</sub> in the near-infrared spectrum (Eldering et al., 2017). The most constrained feature of CO<sub>2</sub> in a given sounding is the pressure-weighted column average or X<sub>CO<sub>2</sub></sub>. It is this quantity that is the primary objective of the OCO-2 retrieval system. Evaluation of OCO-2 retrievals against constraints from the Total Carbon Column Observation Network, models, and in situ CO<sub>2</sub> measurements has identified biases in the X<sub>CO<sub>2</sub></sub> retrievals and provided necessary data to perform a bias correction (Wunch et al., 2017). The resulting bias-corrected X<sub>CO<sub>2</sub></sub> is presented to inverse models for flux estimation. For the results in this paper, we focus on the Land Nadir soundings from OCO-2, those soundings in which the instrument is directly over land and imaging straight down at the subsatellite point.

### 2.4.2. In Situ CO<sub>2</sub> Measurements

In situ CO<sub>2</sub> measurements for this project are extracted from the GLOBALVIEW+ 2.1 project (NOAA Earth System Research Laboratory, G. M. D., 2016).

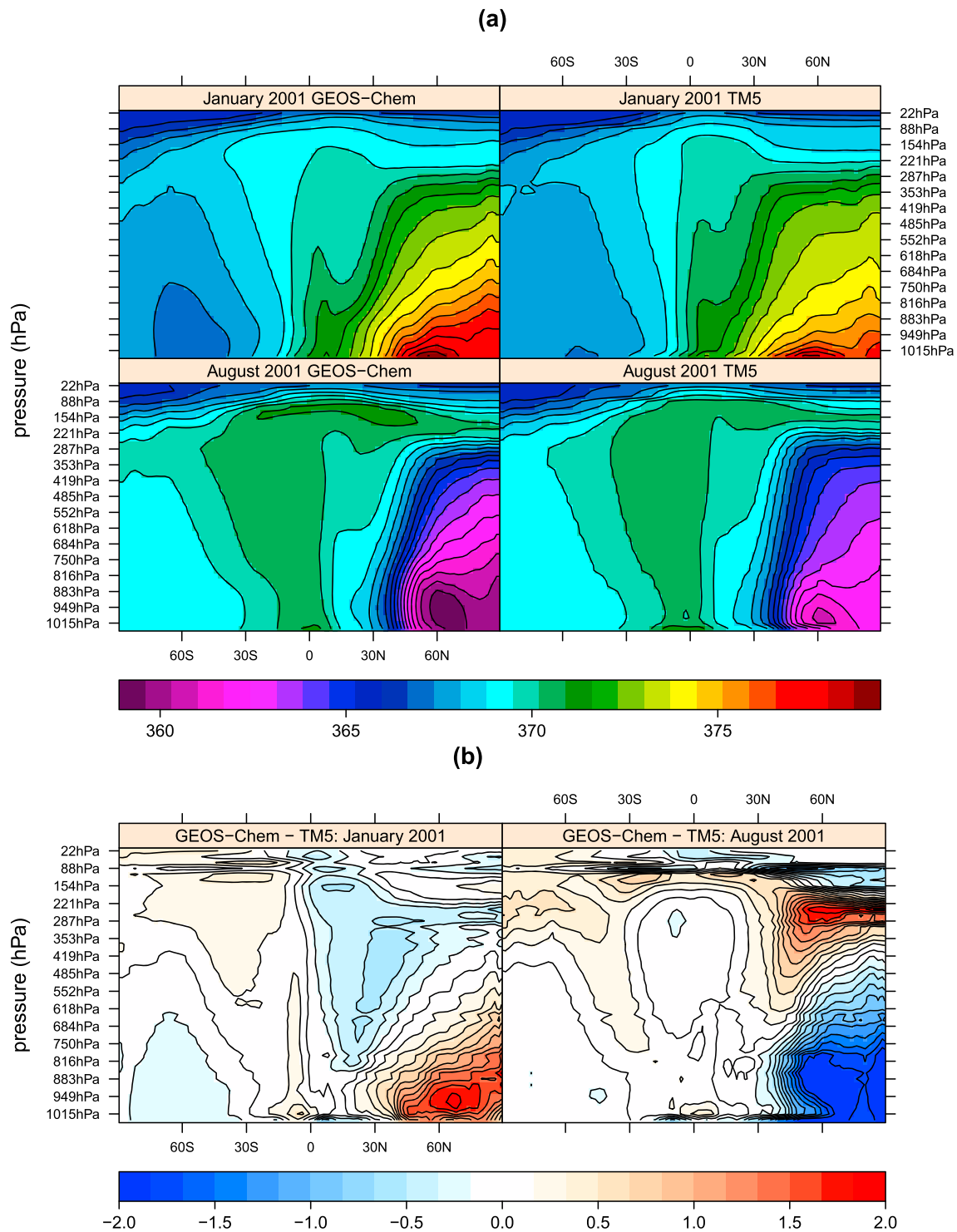
This data collection comprises about six million observations in 254 unique time series data sets collected by 32 laboratories. CT2016 assimilated about 600,000 of these measurements to constrain its surface fluxes.

### 2.4.3. In Situ SF<sub>6</sub> Measurements

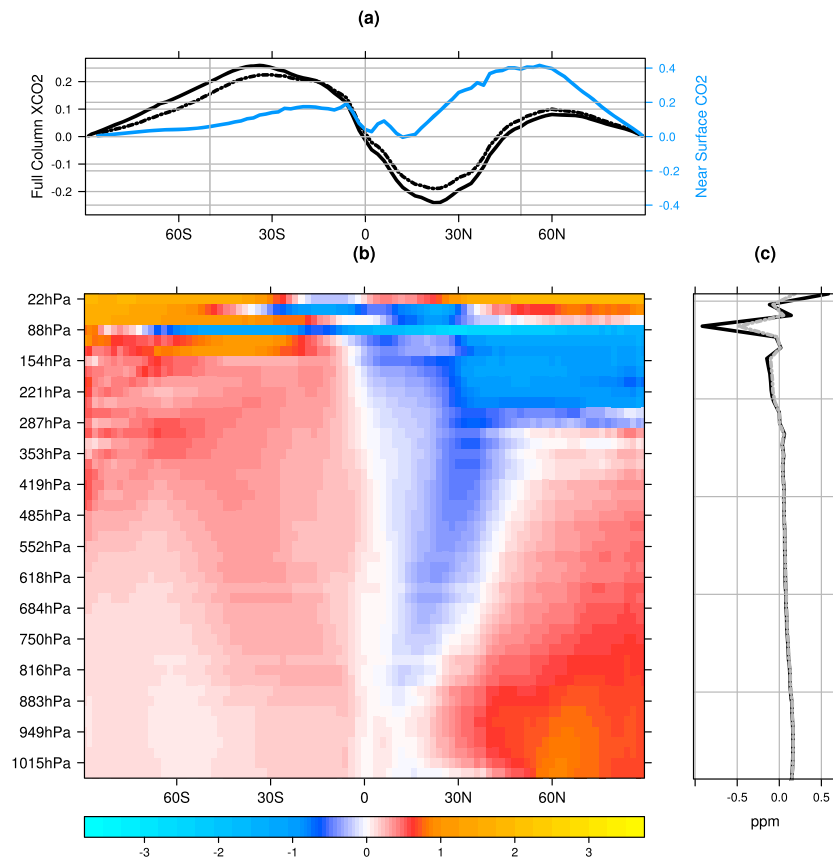
Flask samples from the NOAA Carbon Cycle Greenhouse Gases (CCGG) Cooperative Air Sampling Network are routinely analyzed for SF<sub>6</sub> content. We use time series from 49 data sets listed in Table S1, all of which sample background conditions. Most of these have collection protocols designed to sample marine boundary layer air.

### 2.4.4. The OCO-2 MIP

The transport difference between TM5 and GEOS-Chem revealed by the forward simulations of CO<sub>2</sub> and SF<sub>6</sub> could result in differences in surface CO<sub>2</sub> fluxes estimated by inverse models. The most direct way to quantify flux differences caused by these transport differences would be to use the same inverse technique with both transport models. Implementing such a comparison is beyond the scope of the current research, but we can analyze results from a recent model intercomparison effort in which seven inverse systems use either TM5 or GEOS-Chem. The NASA OCO-2 mission has sponsored a model intercomparison project (MIP) for CO<sub>2</sub> inverse models. This effort has developed a set of standardized numerical experiments for an inverse model ensemble with varying transport, optimization techniques, and prior CO<sub>2</sub> flux assumptions (Crowell et al., 2019). In this ensemble, three models use TM5/ERA-i transport and four use GEOS-Chem/MERRA transport. Model configurations are briefly listed in Table 1, with definitive descriptions available in Crowell et al. (2019). Results, analysis, and current publications related to this project are available at <https://www.esrl.noaa.gov/gmd/ccgg/OCO2/>. Within both TM5 and GEOS-Chem groups, there are examples of variational and Kalman filtering techniques and a variety of prior flux estimates and transport resolutions. We note the standardization of in situ CO<sub>2</sub> measurements (although not model-data mismatch errors), OCO-2 X<sub>CO<sub>2</sub></sub> retrievals, and fossil fuel fluxes in all the OCO-2 MIP experiments. Sensitivity of inversion systems to prior flux specifications is not discussed in this manuscript but is explored extensively in Philip et al. (2019).



**Figure 1.** Plot (a) shows simulated CO<sub>2</sub> in micromoles per mole from GEOS-Chem (left column) and TM5 (right column), averaged zonally and over the month of January 2001 (top panels) and August 2001 (bottom panels) as a function of latitude and altitude from the simulations described in section 2.2. Differences are shown in plot (b). Both models use a terrain-following sigma vertical coordinate. For simplicity, the y axis shows the 47 GEOS-Chem model levels with approximate pressure levels at sea level.



**Figure 2.** GEOS-Chem minus TM5 difference in simulated fossil fuel CO<sub>2</sub> in micromoles per mole, averaged zonally and over the month of March 2008 as a function of latitude and pressure. Both simulations used CT2016 fossil fluxes. The vertical axis of the plot (b) represents equally spaced pressure levels with the label corresponding to the equivalent sea surface level grid for the sigma terrain-following coordinates. Panel (a) shows the GEOS-Chem minus TM5 difference in pressure-weighted average X<sub>CO<sub>2</sub></sub> as a function of latitude (solid black line). This is equivalent to the vertical average of the field shown in panel (b), with the exception that panel (b) is area weighted from a value of one near the equator to zero at the poles. Panel (c) shows the meridional-averaged difference as a function of pressure level. The dashed lines in panels (a) and (c) show the approximate effect of computing X<sub>CO<sub>2</sub></sub> using an estimated Orbiting Carbon Observatory-2 (OCO-2) averaging kernel as a function of solar zenith angle and latitude. The blue line in top panel (a) shows the pressure-weighted average of the bottom five model levels. The OCO-2 averaging kernel (AK) is only defined where OCO-2 observations exist; thus, we estimated the AK as a function of latitude and solar zenith angle in order to be able to apply to arbitrary atmospheric columns.

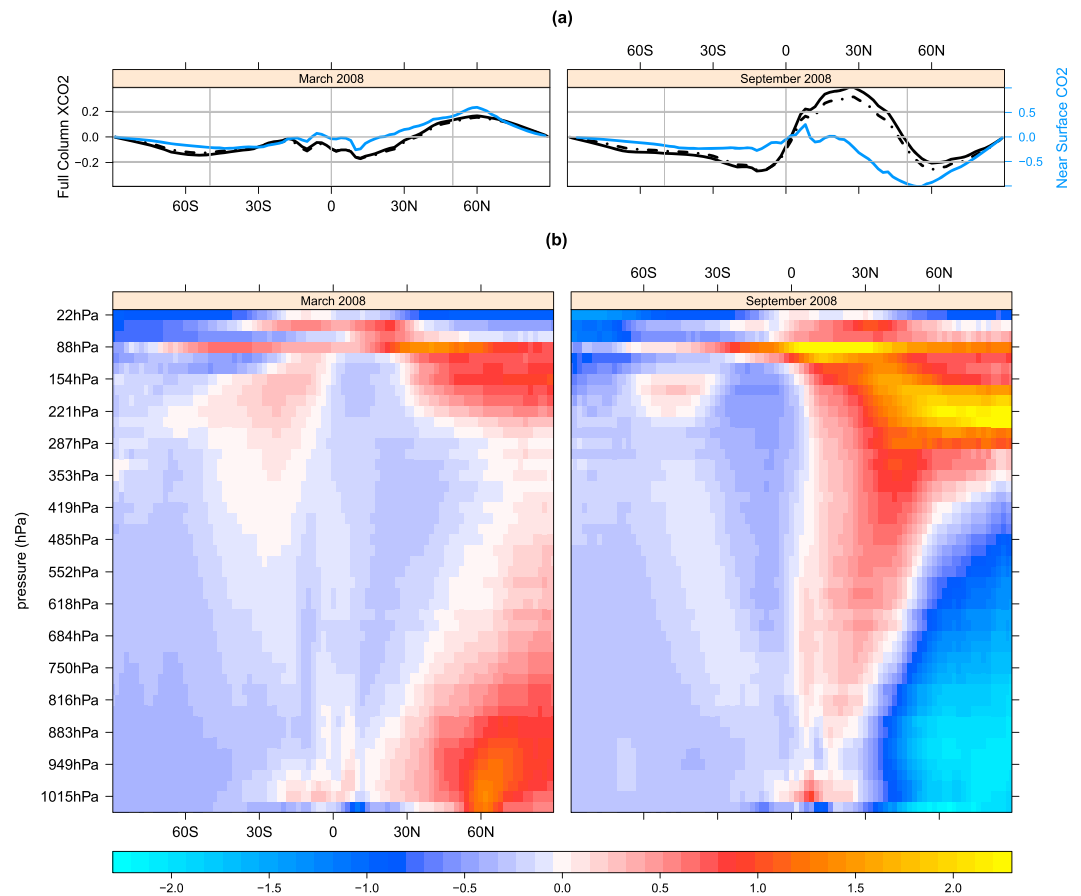
We compare surface fluxes estimated from two numerical experiments in which different observational constraints are assimilated. The first experiment, labeled IS, is one in which only traditional in situ CO<sub>2</sub> measurements are assimilated. The second experiment, LN, is one in which 10-s averages of OCO-2 land nadir retrievals of bias-corrected X<sub>CO<sub>2</sub></sub> only are assimilated. These two experiments differ not only in that there are vastly more X<sub>CO<sub>2</sub></sub> retrievals than in situ measurements but also in the vertical information content of the observational constraints. In situ measurements are mostly at the surface or within the PBL, whereas X<sub>CO<sub>2</sub></sub> integrates the whole column content of CO<sub>2</sub>.

### 3. Results

#### 3.1. CO<sub>2</sub> Distributions From Forward Simulations

##### 3.1.1. Zonal-Mean Atmospheric CO<sub>2</sub> Differences

The transport differences between GEOS-Chem and TM5 are evident in the meridional distribution of simulated CO<sub>2</sub> from the forward simulations described in section 2.2. It is convenient to summarize this by computing zonal-average “curtains” of CO<sub>2</sub>. For this comparison, TM5’s output is remapped from its 25 level vertical grid to GEOS-Chem’s 47 level vertical grid in a manner that conserves column-averaged concentrations. This allows both models to be analyzed at the same time and space resolution.

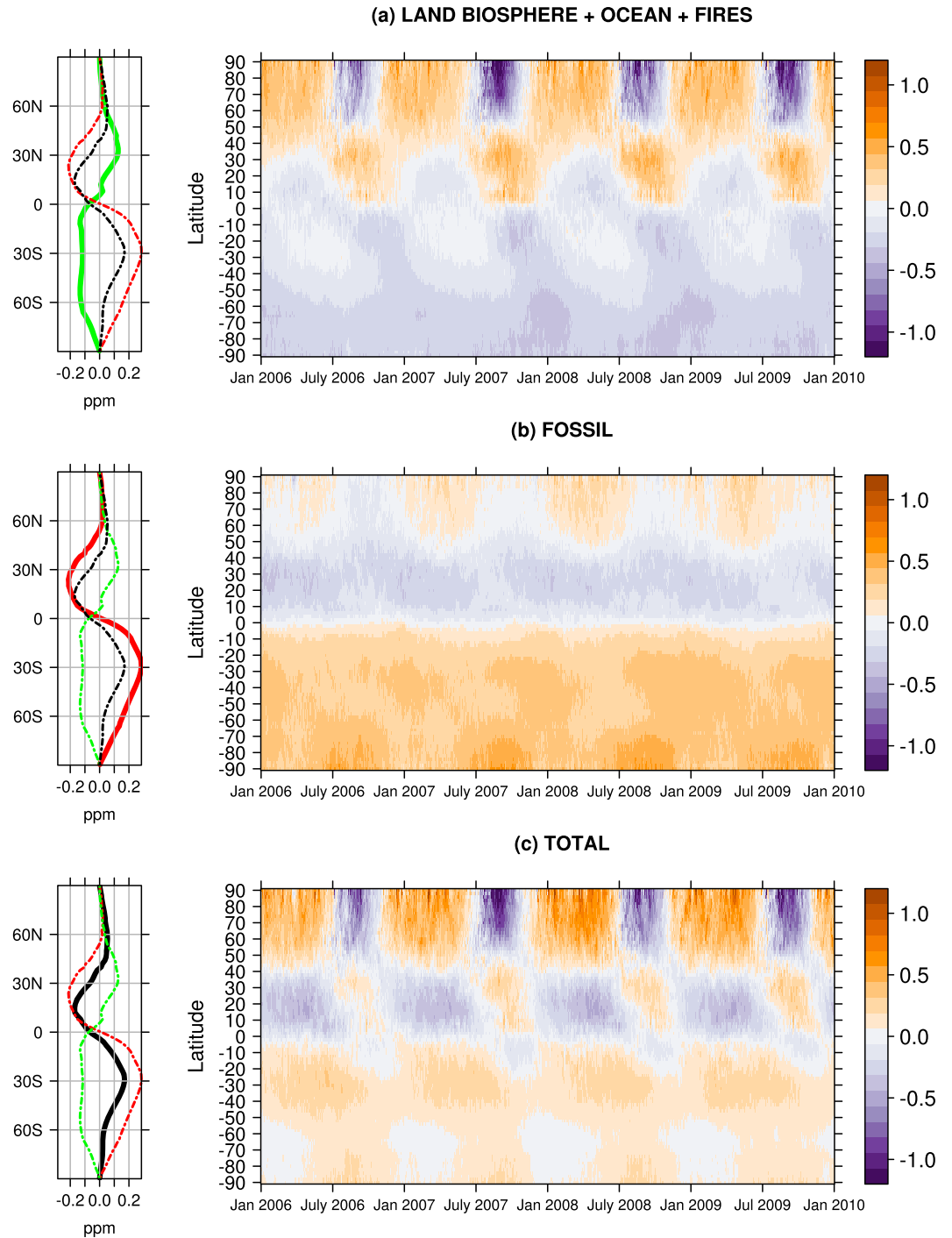


**Figure 3.** Similar to Figure 2 but for the sum of all CT2016 nonfossil fuel CO<sub>2</sub> tracers (land biosphere, fires, and ocean) for March 2008 and September 2008. Top panel: Black line is full column XCO<sub>2</sub>, black dotted line is with addition of OCO-2 averaging kernel, and blue line is the column CO<sub>2</sub> average for the bottom five model levels.

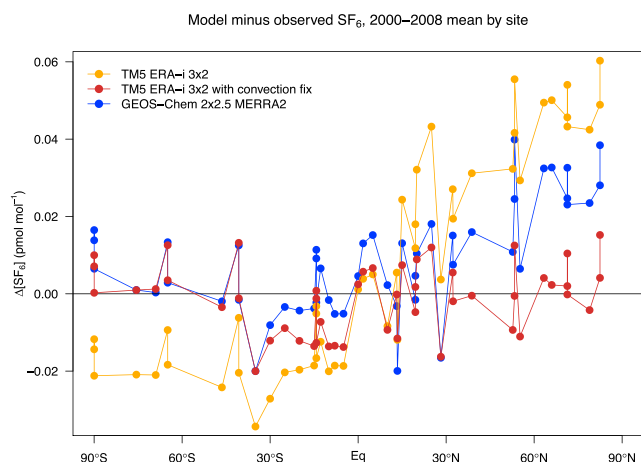
Figure 1 presents a comparison of the modeled CO<sub>2</sub> for the total CO<sub>2</sub> flux (land biosphere net ecosystem exchange and fire emissions, air-sea CO<sub>2</sub> flux, and fossil fuel emissions) 12 months (January 2001) and 20 months (August 2001) into the simulation. The models agree reasonably well on the vertical and meridional structure of the CO<sub>2</sub> distribution, with the differences between the models generally being less than the common variations seen vertically and seasonally in both models. Both models show similar signatures of vertical and poleward transport of surface CO<sub>2</sub> exchange from northern midlatitudes. In the boreal winter, when terrestrial photosynthesis is at a minimum and input of CO<sub>2</sub> from biological respiration and fossil fuel combustion dominates surface exchange, the Northern Hemisphere troposphere has higher CO<sub>2</sub> than the rest of the atmosphere. In the boreal summer, the same atmospheric zone has the lowest CO<sub>2</sub> due to surface uptake by terrestrial photosynthesis.

We first analyze the differences in the distribution of the fossil fuel tracer which are shown in Figure 2. Fossil fuel emissions of CO<sub>2</sub> are always positive and reasonably unchanging over time, reducing possible complications from covarying surface fluxes and atmospheric transport fields. Analysis of differences between the two models in the fossil fuel tracer shows that the deficit in GEOS-Chem CO<sub>2</sub> aloft appears immediately in the Northern Hemisphere and at the same time as the surplus of near-surface CO<sub>2</sub> over the same area. We conclude that this large difference aloft appears to be from TM5 transporting fossil fuel CO<sub>2</sub> to the Northern Hemisphere upper troposphere, while GEOS-Chem has stronger northward advection and trapping near the surface. Second, by analyzing the fossil fuel tracer many years into the simulation, one can see that a stronger fossil outflow in the low/middle southern latitudes by GEOS-Chem (extending from near surface around 10°S and extending to about 300 hPa at 40°S in Figure 2) appears to enter high in the upper troposphere and is also mixed down near the surface. We note that anticorrelated differences between the models in the stratosphere which we speculate are due to differing





**Figure 4.** Zonal-mean GEOS-Chem minus TM5 differences in simulated  $X_{CO_2}$  in micromoles per mole. These Hovmöller plots show the dominant latitude and time differences of simulated  $X_{CO_2}$  between the two models. (a) Summed differences in the land biosphere, fire, and ocean tracers and excludes the fossil fuel tracer. (b) Differences in the fossil tracer alone. (c) The total signal by summing all  $CO_2$  tracers. The three plots on the left side of the figure show the average difference over the 4 years as a function of latitude, area weighted from a value of 1 near the equator to 0 near the poles. The figure is the same for all three rows with green being the biological, fires, and ocean signal, red being the fossil signal, and black being the total signal.



**Figure 5.** The 9-year average model-minus-observed residuals of SF<sub>6</sub> at the marine boundary layer sites listed in Table S1, arranged by latitude. Results are from two different versions of TM5 with ERA-i meteorology (gold, an earlier version subject to a fault in convective transport; red, a version correcting that fault) and GEOS-Chem using MERRA2 (blue).

mixing characteristics in the upper troposphere-lower stratosphere (UTLS) and stratosphere, since independent research has revealed no significant differences in tropopause height between the MERRA and ERA-i reanalyses used in these models. The strong signals of CO<sub>2</sub> difference in the upper layers of the atmosphere at around 88 hPa appear to be tied to a discontinuity in layer pressure thicknesses in the stratosphere in the TM5 model (see GEOS-Chem and TM5 pressure thickness plot in Figure S1). We note that UTLS mixing in the GEOS-Chem model was discussed in detail in a recent model-data comparison paper (Deng et al., 2015) and is a fundamental part of an upcoming paper by Dr. Brad Weir at NASA-GMAO. It will not be discussed further here.

Interpretation of the vertical differences in the forward runs of the biological tracer, which comprises terrestrial biological emissions including fire and air-sea gas exchange, is made more difficult by the fact that the flux signal changes intensity and sign seasonally while being distributed more broadly in latitude than fossil fuel emissions. This seasonal flux variability is also correlated with transport mechanisms having strong seasonal variability, such as PBL mixing and the strength of midlatitude storm systems. It is clear from Figure 3 that the source of the strong seasonal variations seen in Figure 1 is the seasonal nature of carbon exchange in

the terrestrial biosphere. We note that the dominant differences appear in the Northern Hemisphere both at the surface and aloft and aloft in the lower latitudes of the Southern Hemisphere.

### 3.1.2. Column-Averaged X<sub>CO<sub>2</sub></sub> Differences

As atmospheric inverse models begin to assimilate satellite-retrieved CO<sub>2</sub> information, it is vital to see how the transport differences between these two models are manifested in vertically integrated X<sub>CO<sub>2</sub></sub>. To simulate X<sub>CO<sub>2</sub></sub> as estimated by OCO-2, three-dimensional CO<sub>2</sub> mixing ratio fields from TM5 are first conservatively remapped to the GEOS-Chem horizontal grid, using the Climate Data Operators (Schulzweida, 2018). Column-averaged X<sub>CO<sub>2</sub></sub> from each model is then created as the vertical weighted average, in which the layer CO<sub>2</sub> mole fractions are weighted by the layer pressure thicknesses of each model. For analysis here, X<sub>CO<sub>2</sub></sub> is then averaged zonally.

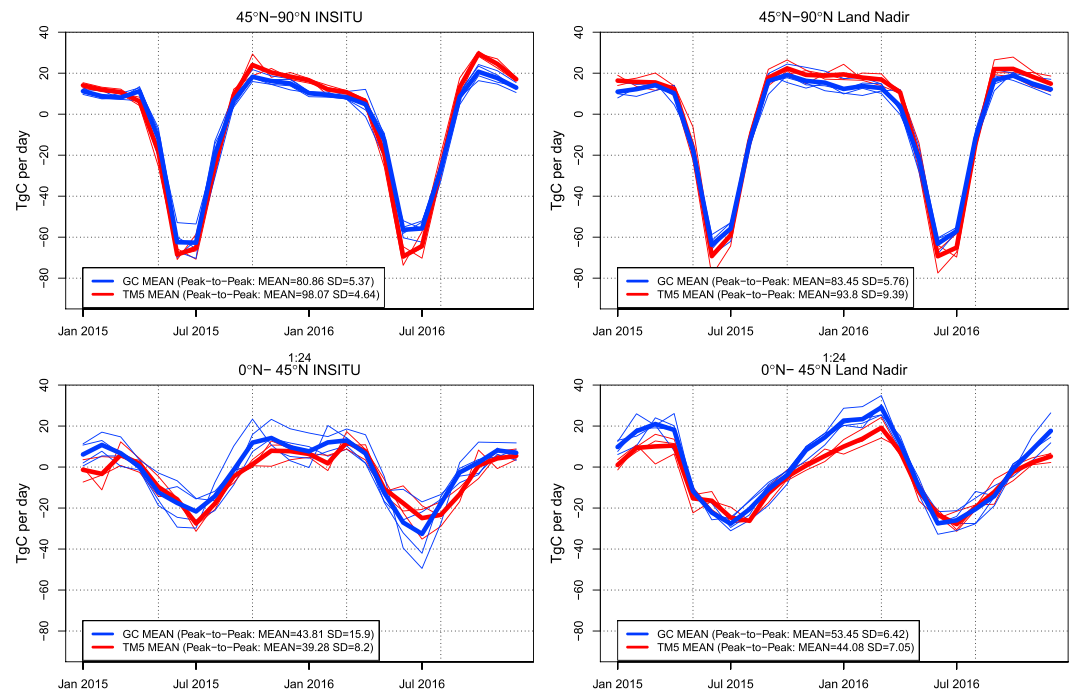
A latitude by time plot of the differences in X<sub>CO<sub>2</sub></sub> between TM5 and GEOS-Chem (Figure 4) shows clear seasonal and meridional patterns. There are distinct regime changes in the X<sub>CO<sub>2</sub></sub> differences around 50°N, the equator, and 50°S in all panels of the figure.

Fossil fuel CO<sub>2</sub> differences are easier to interpret than the other CO<sub>2</sub> tracers since its emissions are always positive and with relatively minor trends and seasonality. In Figure 4b one can see that GEOS-Chem manifests a deficit of fossil fuel CO<sub>2</sub> in the northern midlatitudes compared to TM5. This latitude band corresponds with the zones of the largest anthropogenic emissions from North America, Europe, and Asia. It appears that GEOS-Chem moves fossil fuel CO<sub>2</sub> out of this source region more rapidly than TM5 does. This results in more simulated CO<sub>2</sub> in the southern midlatitudes as well as more CO<sub>2</sub> in the lower vertical levels in the high northern latitudes. The vertical distributions leading to these features are revealed by Figure 2. For instance, the GEOS-Chem excess of fossil fuel CO<sub>2</sub> in the Southern Hemisphere is concentrated in the upper atmosphere, suggesting a more rapid interhemispheric transport at upper levels in GEOS-Chem compared to TM5. In the Northern Hemisphere high latitudes, GEOS-Chem manifests an excess of fossil fuel CO<sub>2</sub> near the surface, counterbalanced by a deficit aloft, resulting in a smaller average difference in the column.

### 3.2. Meridional Gradients of Surface SF<sub>6</sub>

Simulated minus-observed residuals of SF<sub>6</sub> for the two models are shown in Figure 5. These are 9-year averages at the stations listed in Table S1. This observational constraint involves surface concentrations of SF<sub>6</sub> measured during background conditions in the marine boundary layer, away from immediate continental influences.

Earlier versions of TM5 manifested unrealistically high meridional gradients of surface SF<sub>6</sub> (Patra et al., 2011; Peters et al., 2004). This earlier TM5 transport is shown in Figure 5 with gold symbols. That model version manifests an excess of SF<sub>6</sub> in the Northern Hemisphere and a deficit in the south. After almost a decade of investigation into the cause of this bias, it was discovered that the convective transport parameterization in



**Figure 6.** Flux inversion monthly fluxes from the Orbiting Carbon Observatory-model intercomparison project partitioned by transport model and latitude band. Thin blue lines represent GEOS-Chem models, and thin red lines are TM5 models. Thick blue and red lines represent the ensemble mean for GEOS-Chem and TM5 models, respectively. Upper panels are for fluxes integrated across 45°N to the north pole, and lower panels represent fluxes integrated from the equator to 45°N. Left panels show results for inversions assimilating traditional in situ CO<sub>2</sub> measurements and right panels for inversions assimilating Orbiting Carbon Observatory-2 land nadir retrievals of X<sub>CO<sub>2</sub></sub>.

TM5 based on Tiedtke (1989) was not representing the vertical mass fluxes of the parent ECMWF model. By this time, however, the ERA-i reanalysis had begun archiving these convective mass fluxes and became possible to apply them directly in TM5 instead of rediagnosing convective transport within the daughter model (Krol et al., 2017; Tsuruta et al., 2017). This “convection fix” (red symbols in Figure 5) almost completely removed the excessive interhemispheric gradient of surface SF<sub>6</sub> manifested by the earlier TM5 configuration.

The convection fix in TM5 had a direct impact on CO<sub>2</sub> fluxes estimated in CarbonTracker, which uses TM5 as a transport model. In the CT2013 release of CarbonTracker using the faulty convective transport, Northern Hemisphere land regions were estimated to represent a sink of 2.4 PgC/year. A revised CarbonTracker version using TM5 transport with the convection fix, CT2013B, reduced this sink estimate to 1.8 PgC/year. Oceanic and Southern Hemisphere land fluxes around the world were reapportioned by this change, but this 25% decrease in the estimated Northern Hemisphere land sink was the most significant effect. This provides a quantifiable linkage between the impacts of transport error and inferred surface CO<sub>2</sub> flux.

GEOS-Chem transport manifests no apparent bias in surface SF<sub>6</sub> south of about 30°N (blue symbols in Figure 5). Poleward of the northern midlatitudes, however, there appears to be an excess of simulated SF<sub>6</sub> at the surface, increasing to a maximum in Arctic latitudes. As with CO<sub>2</sub>, the significant sources of SF<sub>6</sub> are estimated to be in the northern midlatitudes (European Commission, 2011), so we infer that there is some anomalously strong meridional transport northward from these latitudes in GEOS-Chem in preference to vertical transport. We again emphasize that due to the constraints of the observations, we can only conclude that an anomalously strong signal of SF<sub>6</sub> is seen with GEOS-Chem near the surface in this analysis and it is unknown what kind of errors might exist aloft for either model.

### 3.3. Impacts of Transport Differences on Inferred Surface Fluxes

The OCO-2 MIP (section 2.4.4) includes three inverse models using TM5 and four inverse models using GEOS-Chem. While these small sample sizes preclude robust statistical conclusions, we find differences in inversely derived surface fluxes. These flux differences are consistent with transport differences found from the forward simulations of CO<sub>2</sub> and SF<sub>6</sub>.

### 3.3.1. A Distinct Signature in Flux Seasonality

The transport differences seen in the forward  $\text{CO}_2$  and  $\text{SF}_6$  simulations suggest that we should be able to see a difference in the amplitude of the seasonal cycle of optimized fluxes from approximately  $45^\circ\text{N}$  to  $90^\circ\text{N}$  and from the equator to  $45^\circ\text{N}$ . It was already shown that GEOS-Chem sees a surplus relative to TM5 of surface  $\text{CO}_2$  and  $X_{\text{CO}_2}$  during boreal winter north of about  $45^\circ\text{N}$  and a deficit of these same quantities during boreal summer in the same zone. As argued by Stephens et al. (2007), GEOS-Chem inversion systems need to estimate smaller (larger) flux seasonality north (south) of  $45^\circ\text{N}$  to agree with available observational constraints. Therefore, we would expect that GEOS-Chem inverse models would retrieve a smaller seasonal cycle at high northern latitudes and a larger seasonal cycle at tropical and northern midlatitudes. In Figure 6, we plot the seasonal cycles of total fluxes for these two bands by month for each inversion contribution and calculate the average and standard deviation of the ranges for each of the transport families. Figure 6 reveals that the peak-to-peak amplitudes of monthly optimized fluxes for models utilizing GEOS-Chem tend to estimate a weaker seasonal cycle in  $\text{CO}_2$  flux in the higher latitudes of the Northern Hemisphere and a stronger seasonal cycle in the lower latitudes compared to TM5 models. This is true in both the IS experiment, in which models assimilate traditional in situ  $\text{CO}_2$  measurements, and in the LN experiment, in which OCO-2 land nadir model retrievals of  $X_{\text{CO}_2}$  are assimilated. These differences are small, and there is a great deal of scatter among models due to inversion methods and configuration details, so they are not statistically significant.

In the  $45^\circ\text{N}$  to  $90^\circ\text{N}$  latitude band, there is one GEOS-Chem model with a particularly weak seasonal cycle in the IS inversion and a different one with a particularly weak seasonal cycle in the LN inversion. Removing each of these simulations from those particular comparisons, which still leaves three GEOS-Chem and three TM5 models, reduces the difference in peak-to-peak seasonal cycle between the transport model groups but still leaves a 5–10% difference in general in the  $45$ – $90^\circ\text{N}$  band.

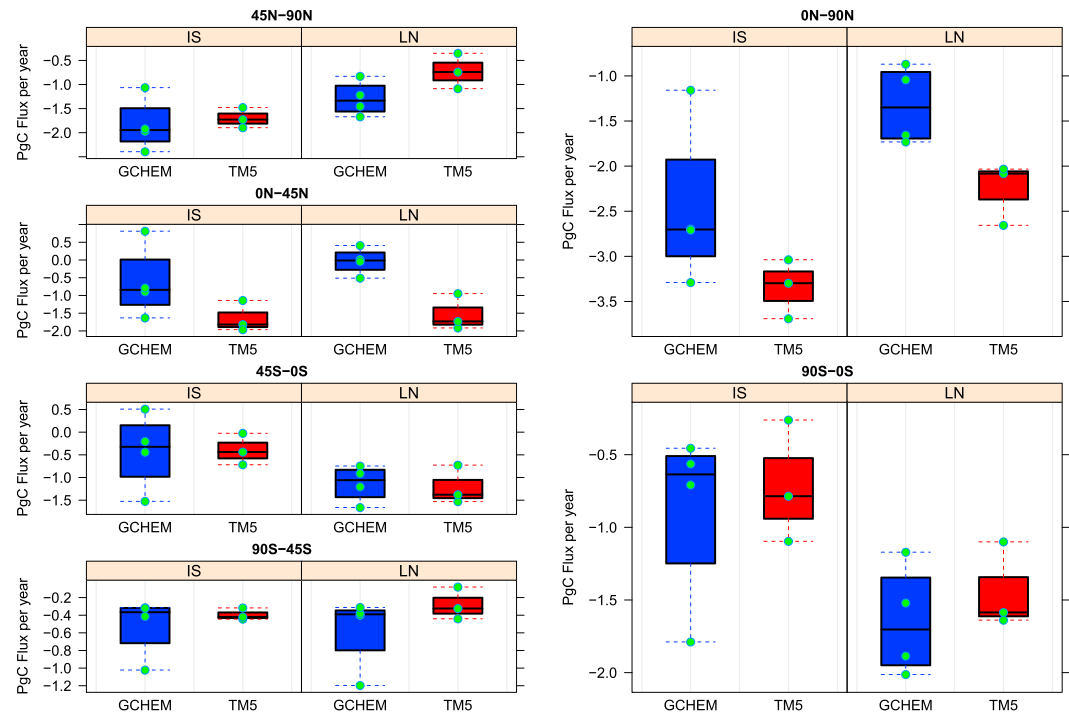
Noisy as they may be, these results are qualitatively consistent with transport differences identified from the forward simulations of  $\text{CO}_2$  and  $\text{SF}_6$ . From those simulations we hypothesize that GEOS-Chem moves surface emissions out of the northern midlatitudes more quickly than TM5. In a flux inversion context, this means that the land biosphere uptake signal in Northern Hemisphere summer is being removed from its source region more quickly in GEOS-Chem. Hence, that model would require greater uptake in its optimized fluxes over that region to agree with the observational constraints. Conversely, north of  $45^\circ\text{N}$ , GEOS-Chem has imported more of that signal of land uptake and thus requires a smaller summer land sink to agree with observations.

Previous results suggest that we could expect IS optimized fluxes to be more sensitive to transport errors than LN optimized fluxes (Basu et al., 2017; Rayner & O'Brien, 2001). The stronger seasonality differences here under in situ constraints seem to support this.

### 3.3.2. Impact on Estimates of Annual-Mean Flux

Using vertical profile data from aircraft observations, Stephens et al. (2007) found that inversion models which preferentially “trapped” surface flux signals close to the ground-derived surface fluxes with a weaker seasonal amplitude. In terms of an annual-mean effect, these models simulated a larger carbon sink over northern midlatitudes. It is true that seasonal correlations of surface flux and weather-driven transport mechanisms should drive the amplitude of flux seasonality in inverse models. To explain the annual-mean sink, however, we must also acknowledge that the  $\text{CO}_2$  from fossil fuel combustion at the same latitudes is subject also to these transport differences. The more stagnant of the two models will retain anomalous fossil fuel  $\text{CO}_2$  in the northern midlatitudes. Since most inverse models do not optimize fossil fuel emissions, the stagnant model must be driven to estimate extra uptake in its midlatitude land and ocean fluxes to correct for this extra  $\text{CO}_2$ . The more northern region sees an opposite effect, and there the more stagnant model would have to simulate less of a land-ocean sink to agree with observations.

This is largely what we see in both high-latitude bands,  $45^\circ\text{N}$  to  $90^\circ\text{N}$  and  $45^\circ\text{S}$  to  $90^\circ\text{S}$  (Figure 7). Using in situ data, the median annual drawdown between  $45^\circ\text{N}$  and  $90^\circ\text{N}$  in the GEOS-Chem-based systems is  $-1.95$  PgC/year (range:  $-2.39$  to  $-1.06$ ), while the three TM5-based frameworks have a median annual sink of  $-1.73$  PgC/year, 11% less. The land nadir data produce weaker overall sinks, but larger differences, with the GEOS-Chem-based frameworks producing a median sink of  $-1.34$  PgC/year (range:  $-1.67$  to  $-0.83$ ) and the TM5-based frameworks producing a median sink of  $-0.74$  PgC/year (range:  $-1.09$  to  $-0.35$ ), 45% less. This difference in high latitudes reverses sign as we move south, with GEOS-Chem based frameworks having a much stronger source of  $\text{CO}_2$  in the  $0^\circ\text{N}$  to  $45^\circ\text{N}$  zonal band, consistent with the large deficit of  $\text{CO}_2$  seen



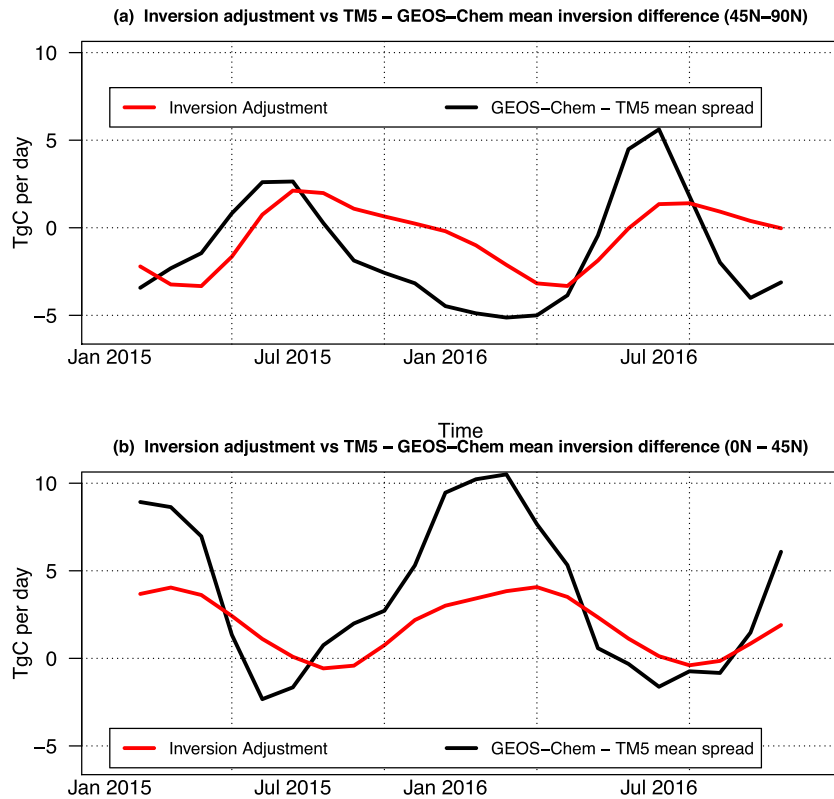
**Figure 7.** Annual flux average (2015–2016) from Orbiting Carbon Observatory-2 model intercomparison project suite. IS refers to inversions constrained with traditional in situ observations, and LN refers to inversions constrained with  $X_{\text{CO}_2}$  retrievals from Orbiting Carbon Observatory-2 in its land nadir observing mode. The box and whiskers plot shows a box which roughly approximates the first and third quartiles of the data and whiskers which extend to the most extreme data point which is no more than 1.5 times the length of the box away from the box.

in Figure 4. The difference between median annual fluxes is 0.98 PgC for the IS inversions and 1.72 PgC for the LN inversions. The surplus of  $\text{CO}_2$  in Figure 4 in the 0–45°S band would seem to infer; we might find a corresponding relative sink there in the flux results. However, the fluxes are similar between the two transport models in the equator to 45°S band, leaving the GEOS-Chem inversions with a weaker integrated global sink relative to TM5. We note that this is consistent with the simulations shown in Basu et al. (2017), and although the exact reasons for this are unknown, we suspect that the 2-year duration of the simulations may not be long enough to ensure agreement on the global sink to the levels desired.

We would be remiss not to present a word of caution. It is often tempting to try to “invert the concentrations by eye”, that is, estimate local surface fluxes which would match the residual annual differences in  $X_{\text{CO}_2}$  by zonal bands. There are instances where this approach appears to work well, for example, the correspondence between the large deficit of  $\text{CO}_2$  in the northern midlatitudes seen in Figure 4c and the OCO-2 annual flux differences shown in Figure 7. However, this same approach does not appear to work in the southern midlatitudes where we see an excess of  $\text{CO}_2$  (aloft) in Figure 4. Furthermore, it has been shown in previous studies (Chan et al., 2008; Denning et al., 1996) that significant meridional gradients in surface  $\text{CO}_2$  can arise from an annually balanced model through complex covariances between flux and transport, often termed “rectifier effects.” The rectifier effect body of work has not been extended to column-averaged satellite data. However, it would seem to make one cautious when making inferences about surface  $\text{CO}_2$  fluxes based upon  $X_{\text{CO}_2}$  differences, particularly with respect to biological fluxes which certainly would covary in time with both PBL mixing depths and mid-latitude eddy mixing strength.

### 3.4. Quantification of Impact of Transport Error via Direct Atmospheric Inversion of Transport Differences

Our investigation on the effect of transport differences on  $\text{CO}_2$  surface flux inversions has been largely indirect up to this point. In an attempt to more directly quantify transport difference impacts, we use a simple flux inversion framework to directly calculate the flux perturbation corresponding the  $X_{\text{CO}_2}$  differences in Figure 4c. These  $X_{\text{CO}_2}$  differences are first averaged by month and 5° latitude band. This particular binning is appropriate for investigating large-scale seasonal differences, as opposed to finer-scale differences arising



**Figure 8.** The effect of monthly average climatological transport bias on a simple inversion of  $X_{CO_2}$ . The black line is the monthly four-model mean GEOS-Chem minus three-model mean TM5 flux difference from the LN experiment of the Orbiting Carbon Observatory-2 model intercomparison project. The red line is the result of inverting a smoothed version, by month and  $5^\circ$  latitude band, of the  $X_{CO_2}$  difference plotted in Figure 4, using the Schuh GEOS-Chem based inversion framework. “Inversion adjustment” results are smoothed with 3-month boxcar average. Results are in Teragrams carbon per day.

from the diurnal or synoptic cycles. We then generate simulated bias observations at the locations of the 10-s average OCO-2 v7 product, replacing the OCO-2 v7 retrieval with a corresponding bias estimate from that latitude by month bin. We then assimilate this perturbation with a GEOS-Chem-based flux inversion framework, to estimate the effect on surface  $CO_2$  fluxes. This result is dependent upon the transport model (GEOS-Chem) and inversion method chosen.

The inversion method used here is a batch synthesis inversion (Enting, 2002) where the Jacobian, that is, the matrix of sensitivities of  $X_{CO_2}$  to linear scalings of the  $CO_2$  fluxes, is built by running  $CO_2$  pulses through GEOS-Chem and measuring the effect on  $X_{CO_2}$  in places where OCO-2 can measure. The pulses are composed of harmonic functions of respiration and gross primary production, for example, seven forward tracers for each of gross primary production and respiration, for each of three different years (2014, 2015, and 2016), for each of 11 TRANSCOM land regions [http://transcom.project.asu.edu/transcom03\\_protocol\\_basisMap.php](http://transcom.project.asu.edu/transcom03_protocol_basisMap.php), and each of 24 possible plant functional types. This forms a land flux Jacobian matrix of size approximately  $(3 \times 7 \times 2 \times 11 \times 24)$  by “number of observations.” The ocean sensitivities are captured in an augmented Jacobian but constrained very tightly to the prior. It is important to note that all corrections to  $X_{CO_2}$  are essentially attributed to land fluxes in this inversion, whereas variability in prior uncertainty on the ocean fluxes in the broader OCO-2 MIP may lead to differences between this inversion and the TM5 and GEOS-Chem suite averages. More details on methodology will be available in an upcoming manuscript. We will refer to this inversion as the “PSEUDO” inversion run. Results are shown in Figure 8.

The resulting flux perturbation is largely as one would expect, providing local time-space fluxes which would be necessary to create the  $X_{CO_2}$  differences in Figure 4. The annual seasonal cycle of  $CO_2$  to the north of  $45^\circ N$  is modified by a seasonally varying flux signal on the order of approximately 5 TgC/day, while the annual seasonal cycle of  $CO_2$  to the south of  $45^\circ N$  is modified by approximately the same amount but with

a reversed seasonal cycle. We provide the monthly average difference between the GEOS-Chem and TM5 suites of Land Nadir OCO-2  $X_{\text{CO}_2}$  inversion models (noted in section 2.4.4) as reference. There is reasonably good agreement in terms of the correlation between the suite-wide difference and the PSEUDO estimate although there are some indications of a 1- to 2-month phase shifting of the signal. One would not expect perfect agreement here because of the inversion suite's additional differences in inversion setup and a priori fluxes. However, there is a significant difference in amplitude between the PSEUDO and the suite-wide differences. The PSEUDO flux estimate represents an adjustment of 7% and 12% on the seasonal cycles of the 45°N to 90°N and equator –45°N bands respectively, about half of what we see in the inversion suite. We also note that the offset in the mean annual flux retrieved in Figure 8b is likely due to the fact that this particular inversion is only correcting land fluxes and unable to correct fossil fuel emissions or ocean fluxes in order to mimic the portion of the transport difference associated with fossil  $\text{CO}_2$  shown in Figure 4b or ocean fluxes which are embedded in Figure 4a.

An analysis of posterior  $X_{\text{CO}_2}$  residuals of the PSEUDO fit shows temporally and spatially correlated posterior residuals, potentially indicating that the temporal and spatial frequencies of the pulses used as a basis for flux correction in this particular inversion scheme may be too coarse to capture sharp changes across time and space and are hence an overly smoothed flux estimate with weaker amplitude in time than the truth.

#### 4. Discussion and Path Forward

It has been shown that GEOS-Chem and TM5 manifest significant large-scale differences in their distribution of passive trace gases. While the causes of these differences are not immediately obvious, four potential suspects stand out and all are associated with the modeling of vertical motion.

The likely mechanisms driving differences in transport between GEOS-Chem and TM5 all have some seasonal variability. However, qualitative explanations for both the forward simulation differences of  $\text{CO}_2$  and  $\text{SF}_6$  and also the differences in inversely modeled optimized fluxes do not require a strong seasonal component of the transport difference. While seasonal differences in transport certainly exist, the significant effects of that transport difference can be explained without relying on seasonality.

The likely mechanisms driving differences in transport between GEOS-Chem and TM5 all have some seasonal variability. However, qualitative explanations for both the forward simulation differences of  $\text{CO}_2$  and  $\text{SF}_6$  and also the differences in inversely modeled optimized fluxes suggest the strong seasonal variations in the model differences arise more as a function of the seasonality of the underlying flux field than the seasonality of transport differences between the models. Many unfamiliar with trace gas advection studies of  $\text{CO}_2$  may find this surprising.

The simplest description of the phenomenon from the current results is that GEOS-Chem has some combination of vertical and meridional motion that more quickly ventilates the northern midlatitudes compared to TM5. This vigorous meridional transport in GEOS-Chem moves the strong surface flux signals of the lower midlatitudes, around 30°N to 45°N, to northern boreal latitudes and also to the south more quickly than TM5. The fates of those two branches of meridional mixing are very different. Tracers moved more quickly to the south get entrained in the more vertically diffusive regime of vigorous (sub)tropical convection and become quickly mixed through a large volume of air associated with Hadley circulation and also thus mixed into the Southern Hemisphere troposphere. Tracers that moved more quickly to the north out of the northern midlatitudes are instead subject to being entrained into midlatitude synoptic weather patterns and the Ferrell circulation. Anomalous transport into this northern branch might be strongly evident in concentration differences because it is mixing into a much smaller volume of air.

##### 4.1. Deep Convection and Interhemispheric Exchange

The strong differences we see in interhemispheric mixing, as evidenced by the fossil fuel signal could be related to differences in the model characterizations of deep and/or shallow convection. The role of deep convection in the tropics and its relationship with the strength of interhemispheric mixing is complicated; nevertheless, it is thought that increasing the strength of tropical convection should impede interhemispheric transport in general (Bowman, 2006; Erukhimova & Bowman, 2006). Yu et al. (2018) showed that the averaging of meteorological fields necessary to use GEOS-Chem produces weakened tropical convection relative to the parent GEOS-5 model. Increasing the strength of tropical convection in GEOS-Chem would

likely reduce the interhemispheric gradient we see in Figure 4 by both reducing the excess CO<sub>2</sub> in the SH as well as the deficit in the NH lower latitudes. The main hypothesis of Yu et al. (2018) is that the regridding to coarse resolutions of increasingly higher-resolution native reanalysis products such as MERRA2, which is archived from 0.25° data assimilation products, can result in transport biases. This can lead to a potential loss of resolved convection and an overall low bias in the convective fluxes used in GEOS-Chem. In contrast, TM5 meteorology is regridded from a 80-km meteorological product where presumably more convection is parameterized instead of being directly represented. We do note that ERA-i will be replaced in the near future with ERA5 which will have a resolution of about 31 km, which is much closer to that of MERRA2. Yu et al. (2018) proposed code updates to GEOS-Chem, not yet implemented, which rediagnose convection from the coarse-averaged meteorology fields, as opposed to directly inputting parent model convective mass fluxes. We expect that this will provide us with one possible path forward to explore the differences.

#### 4.2. PBL Mixing and Vertical Advection/Diffusion in Troposphere

While tropical convection likely represents the strongest source of differences between the models in an integrated sense, that is, hemispheric carbon burdens, there are other areas where the models show coherent differences. Vertical diagnostic plots and the SF<sub>6</sub> analysis showed trapping in the GEOS-Chem model where the near-surface northern high-latitude areas saw a stronger signal of the local surface flux contribution, that is, positive for fossil fuels and negative for photosynthesis. PBL mixing and the modeling of entrainment near the PBL top are likely areas where models may differ. Furthermore, vertical velocities are often calculated diagnostically by chemical transport models as a function of horizontal divergence. Potential problems from this approach, in combination with a loss of information in time-space-averaged reanalysis fields, could certainly play a role in the differences we see in vertical mixing between the models. While we do not investigate vertical advection differences between the models, we acknowledge its potential importance to the differences shown here. We note that the accuracy of GEOS-Chem in addressing this process is under investigation by Dr. Dylan Jones at the University of Toronto. Due to the difficult nature of comparing models with quite different vertical turbulent mixing schemes in the PBL and the free troposphere, we refer readers to Dr. Jones's ongoing research.

#### 4.3. Slant Convection Processes Across Midlatitude Frontal Boundaries

Local mixing differences in the model due to differences in PBL mixing and vertical advection/diffusion are likely suspects to generate the differences we are seeing in the northern middle/high latitudes. However, it is also interesting to note that the north-south locations of the sign changes in the differences seen in Figure 4, as well as the strongest surface gradients in the differences in Figure 3, are approximately located over the intertropical convergence zone and the two midlatitude storm tracks. Furthermore, there is evidence in these plots of the subtle north-south movement of these features seasonally, likely matching the weakening and poleward movement of the midlatitude storm track in the summer and the subsequent strengthening and equatorward movement in the winter. These results would seem to suggest potential differences in the modeling and resolving of midlatitude frontal systems in isolation or in addition to potential local mixing effects, for example, vertical advection or PBL mixing and venting.

#### 4.4. Upper Tropospheric/Lower Stratospheric Exchange

Lastly, we note that care must be taken to condition this future research upon unknown differences in UTLS mixing between the models. It has been well documented that UTLS mixing in recent versions of GEOS-Chem is likely too strong (Eastham et al., 2014) and simulations of O<sub>3</sub> and CO<sub>2</sub> show increasing difficulties as one heads toward the poles (Deng et al., 2015; Greenslade et al., 2017).

We have conducted simulations of CO<sub>2</sub> and SF<sub>6</sub> in two widely used chemical transport models driven by state-of-the-art reanalysis products from ECWMF and NASA-GMAO and using identical surface fluxes in both models. Differences in tracer distributions are a convolution of the transport differences and the structure of the underlying emissions. Our intention was to view the transport difference in the space of realistic fluxes. For carbon dioxide, these fluxes are dominated by increasing fossil fuel emissions and the seasonality of biological photosynthesis and respiration in the northern midlatitudes. The particular choice of CO<sub>2</sub> flux is less important than the fact that the flux field is a reasonable representation of seasonally and interannually varying fluxes.

The resulting differences in our model simulations clearly show coherent structures in time and space. For SF<sub>6</sub>, whose modeled emissions have no seasonal variability, GEOS-Chem manifests excess surface concen-



trations north of about 45°N with no obvious time dependence. This should be similar to the behavior of the fossil fuel CO<sub>2</sub> tracer, which has only modest seasonality. Temporal patterns in X<sub>CO<sub>2</sub></sub> differences correspond to the cycle of northern midlatitude biological CO<sub>2</sub> fluxes, while spatial patterns appear to correspond to the positioning of strong meridional mixing features, in particular, the midlatitude storm tracks and the intertropical convergence zone. We show that these differences are significant enough to manifest themselves in atmospheric flux inversion results with (1) an explicit inversion of the X<sub>CO<sub>2</sub></sub> differences, as well as (2) an analysis of the seasonal amplitude/range and annual fluxes of the current suite of OCO-2 CO<sub>2</sub> flux inversion results. When compared to the mean seasonal cycles of CO<sub>2</sub> flux produced by atmospheric inversions, the transport difference amounts to an error of approximately 10–15% of the mean seasonal cycle. We also find significant annual flux differences between the inversions run with TM5 and those run with GEOS-Chem and that those differences corresponded roughly with the annually averaged differences on large scales, with the exception of a difference aloft in the southern hemisphere low latitudes which appears to drive a difference in the estimated annual global carbon sinks (as discussed in section 3.3.2). The exact transport mechanisms responsible for the concentration differences between the forward runs, the general correspondence with annual flux inversion results in the Northern Hemisphere, and the lack of correspondence in portions of the Southern Hemisphere are still under investigation.

### Acknowledgments

Author contributions as follows: A. S. performed the GEOS-Chem CO<sub>2</sub> simulations, inverse model analysis, comparisons to CT2016 mole fractions; wrote the manuscript; and performed analysis of results. A. J. was responsible for producing CT2016, conducting the SF<sub>6</sub> simulations in TM5 and GEOS-Chem, and helping to write the manuscript. B. W. and S. B. were an integral part of the manuscript discussions. OCO-2 L4 inversions results were provided by K. B., J. L., L. F., F. D., S. C., A. S., and A. J. Funding for work came from NASA via funded proposals of A. S., A. J., S. D., and K. D. Specifically, OCO-2 Science Team project (grant NNX15AG93G to Colorado State University and NNX12AP91G to the University of Colorado) and the Atmospheric Carbon and Transport (ACT)-America project, a NASA Earth Venture Suborbital 2 project funded by NASA's Earth Science Division (NNX15AG76G to Penn State, NNX15AJ07G to Colorado State University, and NNX15AJ06G to the University of Colorado). Results, analysis, and current publications related to the underlying atmospheric inversion models are available at their website (<https://www.esrl.noaa.gov/gmd/ccgg/OCO2/>). We also thank Daniel Jacob's group at Harvard University for feedback and support with the GEOS-Chem model.

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