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Interpreting column CO<sub>2</sub> Data

P. I. Palmer et al.



# Interpreting the variability of CO<sub>2</sub> columns over North America using a chemistry transport model: application to SCIAMACHY data

P. I. Palmer<sup>1</sup>, M. P. Barkley<sup>1</sup>, and P. S. Monks<sup>2</sup>

<sup>1</sup>School of GeoSciences, University of Edinburgh, UK <sup>2</sup>Department of Chemistry, University of Leicester, UK

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Correspondence to: P. I. Palmer (pip@ed.ac.uk)

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### Abstract

We use the GEOS-Chem chemistry transport model to interpret variability of CO<sub>2</sub> columns and associated column-averaged volume mixing ratios (CVMRs) observed by the SCIAMACHY satellite instrument during the 2003 North American growing season, accounting for the instrument averaging kernel. Model and observed columns, largely determined by surface topography, averaged on a 2°×2.5° grid, are in excellent agreement (model bias=3%, *r*>0.9), as expected. Model and observed CVMRs, determined by scaling column CO<sub>2</sub> by surface pressure data, are on average within 3% but are only weakly correlated, reflecting a large positive model bias (10–15 ppmv) at 50–70° N during midsummer at the peak of biospheric uptake. GEOS-Chem generally reproduces the magnitude and seasonal cycle of observed CO<sub>2</sub> surface VMRs across North America. During midsummer we find that model CVMRs and surface VMRs converge, reflecting the instrument vertical sensitivity and the strong influence of the land biosphere on lower tropospheric CO<sub>2</sub> columns. We use model tagged tracers to

- show that local fluxes largely determine CVMR variability over North America, with the largest individual CVMR contributions (1.1%) from the land biosphere. Fuel sources are relatively constant while biomass burning make a significant contribution only during midsummer. We also show that non-local sources contribute significantly to total CVMRs over North America, with the boreal Asian land biosphere contributing close
- to 1% in midsummer at high latitudes. We used the monthly-mean Jacobian matrix for North America to illustrate that: 1) North American CVMRs represent a superposition of many weak flux signatures, but differences in flux distributions should permit independent flux estimation; and 2) the atmospheric e-folding lifetimes for many of these flux signatures are 3–4 months, beyond which time they are too well-mixed to interpret.

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#### Introduction 1

The importance of the natural carbon cycle in understanding climate is well established (IPCC, 2007). A better quantitative understanding of natural sources and sinks of carbon dioxide (CO<sub>2</sub>), in particular, is crucial if CO<sub>2</sub> mitigation and sequestration activities relying on these natural fluxes are to work effectively. Estimation of sources and sinks 5 of CO<sub>2</sub> using inverted atmospheric transport models to interpret atmospheric concentration data has been generally effective but has had varied success in the tropics where there is relatively little data (Gurney et al., 2002). Previous inversion studies have used surface concentration data (Bousquet et al., 1999), representative of spatial scales of the order of 1000 km by virtue of their location; aircraft concentration data 10

- (Palmer et al., 2006; Stephens et al., 2007) representative of spatial scales of the order of 10-100 s km, and generally only available during intensive campaign periods; and concentrations from tall towers (Chen et al., 2007), representative of spatial scales of the order of < 1-10 s km.
- New CO<sub>2</sub> column data from low-Earth orbit space-borne sensors (e.g., the Scan-15 ning Imaging Absorption Spectrometer for Atmospheric Chartography (SCIAMACHY) (Bovensmann et al., 1999), the Orbiting Carbon Observatory (OCO) (Crisp et al., 2004; Miller et al., 2007), and the Greenhouse Observating SATellite (GOSAT) (Hamazaki et al., 2004)), measuring in the near-infrared (NIR), are sensitive to changes in  $CO_2$  in
- the lower troposphere and therefore provide potentially useful data with which to esti-20 mate surface fluxes of CO<sub>2</sub> (Chevallier et al., 2007). One of the main advantages of space-borne sensors is their repeated global coverage, facilitating measurements, for example, over remote tropical ecosystems that are currently poorly characterized by in situ data. SCIAMACHY CO<sub>2</sub> data, in particular, are representative of a 60 km×30 km
- spatial footprint, comparable with the horizontal resolution of current generation atmo-25 spheric transport models; upcoming instruments will have better horizontal resolution. At the time of writing, SCIAMACHY is the only space-borne sensor in orbit that measures CO<sub>2</sub> columns sensitive to the lower troposphere. To date there have been very

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few model studies of SCIAMACHY CO<sub>2</sub> column data, which have provided only qualitative comparisons (Buchwitz et al., 2005, 2007; Barkley et al., 2006c). In this paper, we use the GEOS-Chem global 3-D chemistry transport model (CTM) to interpret the variability in CO<sub>2</sub> columns from SCIAMACHY over North America during the 2003 growing season. We focus on North America because of the extensive multi-platform measurement programme which can be used to help evaluate SCIAMACHY via the CTM.

A number of studies have illustrated that the precision and accuracy of measured  $CO_2$  columns is critical to their success in better quantifying the carbon cycle. The temporal and spatial variations in column data are much less than those in surface concentration measurements (Olsen and Randerson, 2004). Inversions of synthetic data have shown that  $CO_2$  columns have to be retrieved with a precision of less than 1% over a 8°×10° grid if they are to improve upon the existing ground-based network

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used for source/sink estimation (Rayner and O'Brien, 2001). Consequently, uncharacterized systematic biases will compromise this ability (Miller et al., 2007). Use of

- <sup>15</sup> column CO<sub>2</sub> has the benefit of effectively reducing the potential model bias introduced by inaccurate descriptions of vertical mixing (Olsen and Randerson, 2004). Nonetheless, recent work has highlighted the requirement of using accurate, synoptic-scale atmospheric transport to interpret CO<sub>2</sub> column data in order to minimize errors associated with spatial sampling, particularly over geographical regions with active weather
- systems (Corbin et al., 2008). The vertically integrated CO<sub>2</sub> column abundance represents the sum of an age-spectrum of airmasses. Young airmasses (defined in this paper as <3 months), still bearing the signatures of surface fluxes, are subject to atmospheric dilution processes that eventually render these signatures indistinguishable from the global background whose variability is determined by atmospheric transport.</p>
- In this paper we show that variability in space-borne CO<sub>2</sub> columns over one region is determined by both national and international surface flux signatures (local biosphere fluxes that reach 1.1% of the column-averaged volume mixing ratio, CVMR, generally represent the largest signals) that can be used to estimate flux strengths via inverse model calculations. We also emphasize that accounting for the vertical sensitivity of



the satellite instrument can, in some instances, enhance surface flux signatures.

Section 2 briefly describes the SCIAMACHY retrievals of  $CO_2$  used in this work and presents  $CO_2$  distributions over North America. Section 3 describes the GEOS-Chem CTM used for this study and presents a brief model evaluation using surface  $CO_2$ 

- <sup>5</sup> data over North America from the GLOBALVIEW network (GLOBALVIEW-CO<sub>2</sub>, 2006). Section 4 critically examines the comparison between model and SCIAMACHY CO<sub>2</sub> columns and CVMRs. In Sect. 5 we use the model to estimate which land-based fluxes determine the continental-scale variability of CVMRs over North America during the growing season, and look in detail at two contrasting sites over North America. In
   10 Sect. 6 we discuss how CVMRs data could be used to infer source and sink distribu-
- tions. We conclude the paper in Sect. 5.

### 2 SCIAMACHY CO<sub>2</sub> data

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SCIAMACHY is a nadir and limb-viewing UV/Vis/NIR solar backscatter instrument aboard the ENVISAT satellite, launched in 2002 (Bovensmann et al., 1999). It mea <sup>15</sup> sures from 240 to 2380 nm, with a resolution of 0.2–1.4 nm depending on the channel. ENVISAT is in a near-polar sun-synchronous orbit crossing the equator at about 10:00 local solar time in the descending node, achieving full longitudinal global coverage at the equator within six days. SCIAMACHY makes measurements in an alternating nadir and limb sequence. We use the nadir measurements that have a horizontal resolution of 60×30 km<sup>2</sup> (across × along track).

We include here only a short description of the retrieval of SCIAMACHY CO<sub>2</sub> and refer the reader to dedicated retrieval studies (Buchwitz et al., 2000; Barkley et al., 2006a). CO<sub>2</sub> columns are retrieved in the 1561.03–1585.39 nm wavelength window using the Full Spectral Initiation (FSI) (Barkley et al., 2006a) Weighting Function Modified Differential Optical Absorption Spectroscopy (WFM-DOAS) (Buchwitz et al., 2000). The mean fitting uncertainty of these columns is typically 1–4% (0.8– $3.2 \times 10^{20}$  molec cm<sup>-2</sup> based on a fitted column of  $8 \times 10^{21}$  molec cm<sup>-2</sup>), which is largely

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attributable to poor characterization of the atmospheric state (e.g., aerosols, cirrus clouds) (Barkley et al., 2006a). Cloudy scenes are diagnosed using the SCIAMACHY polarization measurement devices using a cloud algorithm developed by Krijger et al. (2005), as described by Barkley et al. (2006a), and excluded from subsequent analy-

- <sup>5</sup> ses. We also exclude back scans, observations with solar zenith angles >75° (Barkley et al., 2006a), and observations over ocean due to very low surface albedo. We use only observations with a retrieval error of <5% and within a range of 340–400 ppmv (to adequately constrain the light path). Previous studies have extensively evaluated FSI CO<sub>2</sub> data against independent measurements over the Northern Hemisphere. Com-
- <sup>10</sup> parisons between SCIAMACHY CO<sub>2</sub> and ground-based Fourier Transform Spectrometers (FTS) and a CTM show a negative bias of 2–4% in the absolute CVMRs magnitudes. Strong correlations between SCIAMACHY CO<sub>2</sub> anomalies and aircraft and ground-based data imply that SCIAMACHY can track lower troposphere variability on at least monthly timescales, and has the potential to monitor changes in CO2 (Barkley
- et al., 2006b, c, 2007). At this time, several retrieval issues (e.g., aerosol contamination) need to be resolved before the data are characterized sufficiently well for inverse modelling.

Figure 1 shows monthly mean  $CO_2$  columns (molec cm<sup>-2</sup>) over North America during the 2003 growing season (here defined as April–September) averaged over the GEOS-Chem 2°×2.5° grid (Sect. 3). Observed columns represent the vertical integral

- <sup>20</sup> GEOS-Chem 2°×2.5° grid (Sect. 3). Observed columns represent the vertical integral of atmospheric  $CO_2$  weighted by the instrument averaging kernel that describes the instrument sensitivity to changes in the vertical profile of  $CO_2$ . As we show later in Sect. 3 SCIAMACHY has most sensitivity to  $CO_2$  in the lower troposphere (Barkley et al., 2006c). The average number of individual scenes that fall into a North American
- $2^{\circ} \times 2.5^{\circ}$  grid box is between 25 and 50, depending on month; this effectively reduces the random error by approximately an order of magnitude. Outside the growing season spatial coverage at high latitudes is reduced by seasonally varying solar zenith angle and persistent cloud cover. Retrieved columns range from 6 to  $8 \times 10^{21}$  molec cm<sup>-2</sup> with the largest values during Springtime over the Northeast and the smallest values gener-



ally later in the summer. The spatial distribution of  $CO_2$  columns is determined largely by surface topography, with the Rockies mountain range introducing an apparent longitudinal gradient across North America.

- To remove artefacts introduced by surface elevation we normalize retrieved CO<sub>2</sub> columns using the nearest 6-hourly 1.125°×1.125° ECMWF model surface pressure (Barkley et al., 2006c) to derive a CVMR. As we discuss in Sect. 4 there is significantly less agreement between model and observed values of CVMR than column abundances. Figure 2 shows monthly mean SCIAMACHY CO<sub>2</sub> CVMRs from April to September 2003 over North America. Values range from 350 to 390 ppmv with a 15–20 ppmv peak-to-peak seasonal cycle over regions with a strong biospheric signal, consistent with previous studies (Olsen and Randerson, 2004). Other studies of SCIAMACHY CO<sub>2</sub> data have used O<sub>2</sub> columns to normalize retrieved CO<sub>2</sub> columns, to
- derive a dry air CVMR, (Buchwitz et al., 2007). Using O<sub>2</sub> instead of surface pressure will partially cancel effects of aerosols and clouds on the light path. However, at the <sup>15</sup> time of writing the general efficacy of this approach is not well quantified owing to differences between the radiative transfer and subsequent averaging kernels of the CO<sub>2</sub>
- and  $O_2$  spectral fitting windows. Future satellite missions (e.g., OCO and GOSAT) also plan to use  $O_2$  to normalize derived  $CO_2$  columns.

### **3** The GEOS-Chem forward model of CO<sub>2</sub>: description and evaluation

- We use the GEOS-Chem global 3-D chemistry transport model (v7-03-06) to calculate column concentrations of CO<sub>2</sub> from prescribed surface CO<sub>2</sub> fluxes described in this section. We used the model with a horizontal resolution of 2°×2.5°, with 30 vertical levels (derived from the native 48 levels) ranging from the surface to the mesosphere, 20 of which are below 12 km. The model is driven by GEOS-4 assimilated meteorology data from the Global Modeling and Assimilation Office Global Circulation Model based
- at NASA Goddard. The 3-D meteorological data is updated every six hours, and the mixing depths and surface fields are updated every three hours. The CO<sub>2</sub> simulation



is based on Suntharalingam et al. (2004) and Palmer et al. (2006); here, we provide a description of modifications to these previous studies.

### 3.1 CO<sub>2</sub> flux inventories

Table 1 reports the regional monthly mean estimates of CO<sub>2</sub> fluxes from fuel combustion (sum of fossil fuel and biofuel), biomass burning, and the land biosphere used in GEOS-Chem. Gridded fossil fuel emission distributions are representative of 1995 (Suntharalingam et al., 2004) which we have scaled to 2003 values using regional budget estimates for the top 20 emitting countries in 2003 from the Carbon Dioxide Information Analysis Center (Marland et al., 2007), including sources from fossil fuel burning,

- <sup>10</sup> gas flaring, and cement production. On a global scale the sum of these sources has increased by 14% relative to 1995 values. Biofuel emission estimates, taken from Yevich and Logan (2003), represent climatological values. This source of  $CO_2$  is generally less than 1% of the total fuel source for North America and western Europe but represents up to 18% of the total fuel source for Asia. In many regions, particularly Asia, the
- <sup>15</sup> distributions of fossil and bio-fuel emissions overlap significantly so we lump these fuel source together (FL). Monthly biomass burning (BB) emission estimates are taken from the second version of the Global Fire Emission Database (GFEDv2) for 2003 (van der Werf et al., 2006). These data are derived from ground-based and satellite observations and should describe well the burning distributions. Monthly mean air-sea fluxes of
- <sup>20</sup> CO<sub>2</sub> are taken from Takahashi et al. (1999). As we show later the observed variability in SCIAMACHY data is determined largely by continental fluxes so we do not discuss further the role of ocean exchange in this study. We use daily mean land biosphere (BS) fluxes from the CASA model for 2001 (Randerson et al., 1997), in the absence of corresponding fluxes for 2003. Year-to-year variability of CASA monthly mean land
- <sup>25</sup> biosphere CO<sub>2</sub> fluxes is small (<10%) so our approach should not introduce significant error. We do not explicitly account for the contribution of fuel combustion CO<sub>2</sub> from the oxidation of reduced carbon species (Suntharalingam et al., 2005) as they make only a small contribution to the CO<sub>2</sub> column.



### 3.2 Model initialization

CO<sub>2</sub> concentrations for January 2002 were initialized from a previously evaluated model run (Palmer et al., 2006), which we integrate forward to January 2003. We include an additional initialization to correction for the model bias introduced by not
 <sup>5</sup> accounting for the net uptake of CO<sub>2</sub> from the terrestrial biosphere. We make this downward correct by comparing the difference between GLOBALVIEW CO<sub>2</sub> data (GLOBALVIEW-CO<sub>2</sub>, 2006) and model concentrations over the Pacific during January 2003. Differences range from 1 to 4 ppmv with a median of 3.5 ppmv, and we subtract this value globally, following Suntharalingam et al. (2004).

From January 2003 the total  $CO_2$  tracer becomes the "background"  $CO_2$  concentration and is only subject to atmospheric transport. At that time, we also introduce additional model tracers, initialized with a uniform value (for numerical reasons and which is subtracted in subsequent analyses), that account for the monthly production and loss of  $CO_2$  originating from specific geographical regions and surface processes.

- The linear sum of these monthly tagged tracers (and the "background") is equivalent to the total CO<sub>2</sub>. Figure 3 shows the tagged geographical regions for these experiments: North America (NA), Europe (EU), Asia (AS), Boreal Asia (BA), and the rest of the World (ROW). We separately account for CO<sub>2</sub> contributions from fossil fuel emissions (FF), biofuel emissions (BF), biomass burning (BB), the land biosphere (BS), the
   ocean biosphere (OC), and the inert initial conditions from January 2003. As men-
- tioned above, FL describes the sum of FF and BF. We find the ocean flux contribution to atmospheric  $CO_2$  columns is diffuse and is difficult to distinguish from the initial conditions and is consequently lumped with the ROW.

3.3 Evaluation of model North American surface CO<sub>2</sub> concentrations

Figure 4 presents a comparison of model and GLOBALVIEW measurements (GLOBALVIEW-CO<sub>2</sub>, 2006) of surface CO<sub>2</sub> concentrations over North America during 2003. Here, we have chosen measurement sites that include reasonable coverage

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in 2003 and that have contrasting seasonal cycles. We sample the model at the location of each measurement site and at the time that SCIAMACHY passes over each site, to illustrate the extent to which SCIAMACHY can observe the seasonal cycle over North America. For example, there is no data in early 2003 over Canada because of persistent cloud. In general, the 2°×2.5° model has some skill in reproducing the in situ surface concentration data but there are some notable exceptions where the model overestimates observed concentrations by nearly 10 ppmv during periods of CO<sub>2</sub> uptake (Fraserdale and Harvard Forest) and mistimes the land biosphere uptake by a few weeks (Park Falls). As we show later in Sect. 4 these examples of model error are not necessarily explained only by local North American fluxes but also by other continental fluxes.

3.4 Modelling CO<sub>2</sub> columns and CVMRs from SCIAMACHY

Global 3-D model CO<sub>2</sub> distributions are sampled at the time and location of the SCIA-MACHY scenes. We take into account the vertical sensitivity of SCIAMACHY to
 <sup>15</sup> changes in CO<sub>2</sub> by using the instrument averaging kernel, **A**. The averaging kernel formally describes the sensitivity of retrieved CO<sub>2</sub> columns to changes in CO<sub>2</sub> throughout the column, and is a reflection of atmospheric radiative transfer at NIR wavelengths. Figure 5 shows the mean SCIAMACHY averaging kernel, averaged over solar zenith angles ranging from 0° to 70°, increase in sensitivity throughout the troposphere with only a small fall-off in the last 1 km (Barkley et al., 2006c). As noted above, not taking **A** into account compromises subsequent interpretation of observed columns. Model SCIAMACHY CO<sub>2</sub> columns, Ω, are given by (Rodgers, 2000)

 $\Omega = \Omega_a + \mathbf{a}(\mathbf{H}(\mathbf{x}) - \mathbf{x}_a),$ 

where  $\mathbf{H}(\mathbf{x})$  is the GEOS-Chem forward model,  $\mathbf{x}_a$  is the a priori CO<sub>2</sub> concentration profile taken from climatology and also used in the SCIAMACHY retrievals (Remedios et al., 2006) and  $\Omega_a$  is the associated column. The column averaging kernel **a** is given



(1)

by  $\mathbf{t}^{\mathsf{I}}\mathbf{A}$ , where  $\mathbf{t}$  is the column integration operator that integrates a vertical profile to a column and the superscript T denotes the matrix transpose operation.

The tagged column contributions to the total CO<sub>2</sub> columns, corresponding to geographical regions in Fig. 3 and source types discussed above, are calculated by weight-<sup>5</sup> ing the model vertical profile by the column averaging kernel:  $\Omega_{tag} = \mathbf{a}[\mathbf{H}(\mathbf{x})]_{tag}$ .

- Model CO<sub>2</sub> CVMRs are determined by scaling each model column by its nearest GEOS-4 surface pressure value, taking into account unit changes. We used 1°×1.125° GEOS-4 surface pressure data to be consistent with a) the horizontal resolution of the ECWMF surface pressure data used in the SCIAMACHY retrieval, and b) the 2°×2.5° GEOS-4 meteorology used in the GEOS-Chem model.

#### Comparison of model and observed CO<sub>2</sub> columns and CVMRs 4

Figure 1 shows model  $CO_2$  columns (molec cm<sup>-2</sup>) are generally within 3% of the observed columns, consistent with (Barkley et al., 2006c), and describe more than 80% of the observed variability. As discussed earlier, column distributions are largely determined by changes in surface topography, and consequently a reflection of the surface pressure fields. However, it is clear that model and observed columns show the largest disagreement over the North and East during periods of biospheric uptake (denoted by red data in the Fig. 1 scatterplot). Model bias, used throughout this paper, is defined as:

bias = 
$$100\frac{1}{n}\sum_{i=1}^{n}\frac{\Omega_{i}^{m}-\Omega_{i}^{o}}{\max(\Omega_{i}^{m},\Omega_{i}^{o})}$$

where  $\Omega^{o}$  is the observed column,  $\Omega^{m}$  is the model column, and *n* is the number of observations.

Figure 2 shows the model and observed CVMRs (ppmv). Observed CVMRs generally show a larger East-West gradient (10–15 ppmv) than the model (5–6 ppmv). Model

(2)

CVMRs generally have a narrower dynamic range compared with the observations, largely confined between 360 to 390 ppmv. Differences between model and observed CVMRs during each month is approximately Gaussian centred away from zero (not shown). Unlike SCIAMACHY CO we find no significant correlation between model and

- data differences and the spectral fitting uncertainty (de Laat et al., 2007). On average the model is within 3% of the observed CVMRs, but this reflects a large positive bias of low observed CVMRs and small negative bias of high observed columns. The large positive bias is largely due to the model underestimating columns over the eastern US and at higher latitudes (denoted by red data points in Fig. 2 scatterplot), where vegeta-
- tion is predominant, but will also include an unquantified component from measurement uncertainty. On a continental scale, the model has relatively little skill in reproducing SCIAMACHY CVMRs, capturing only a few percent of the observed variability, which is determined mainly by the dipole in CO<sub>2</sub> column oriented NW-SE, characteristic of the seasonal biospheric uptake (Barkley et al., 2006b, c; Buchwitz et al., 2007). However, as we show in Sect. 4 the model does have skill in reproducing SCIAMACHY data at
- as we show in Sect. 4 the model does have skill in reproducing SCIAMACHY data at individual GLOBALVIEW stations.

Figure 6 shows the North American model and SCIAMACHY  $CO_2$  CVMRs and model surface VMRs expressed as a zonal mean. The zonal mean removes much of the valuable spatial structure but 1) highlights the zonal mean bias between the model and SCIAMACHY, and 2) reveals the dramatic 10 ppmv decrease in SCIAMACHY  $CO_2$  CVMR during the mid-summer months at latitudes between 50 to 70° N. The corre-

sponding decrease in model CVMR is only 5 ppmv. We also note that during midsummer when the biospheric uptake of  $CO_2$  peaks the model CVMR and surface  $CO_2$ concentrations converge, reflecting the increasing influence of land biosphere on the

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<sup>25</sup> lower tropospheric column. This implies that that measured columns will be most sensitive to surface processes during mid-summer when biospheric uptake is at its peak, which has implications for surface flux estimation. Previous studies of CO<sub>2</sub> column (e.g. Olsen and Randerson, 2004) have not reported this finding, which in our study is due to the averaging kernel peaking at near-surface altitudes (Fig. 5). As we show



later, outside of the peak North American growing period other  $CO_2$  sources and sinks play a comparable role in determining the column distribution.

- 5 What surface fluxes determine model CO<sub>2</sub> CVMR variability over North America?
- 5 5.1 Continental-scale distributions

Figure 7 shows the land-based contributions to  $CO_2$  CVMRs over North America (Fig. 3 and Table 1). Many source and sink terms show large seasonal cycles in their CVMR contributions. Background  $CO_2$  CVMRs (January 2003 initial conditions in our calculations, Sect. 3) are typically greater than 350 ppmv (not shown).

- CO<sub>2</sub> columns over North America are determined largely by local sources and sinks, as expected. The North American land biosphere (BS NA) represents the single largest contribution to total CO<sub>2</sub>, with a minimum and maximum of -8 ppmv and 3 ppmv, respectively, corresponding to a maximum of 1.1% of the total column. This contribution, here determined by the CASA model (Sect. 3), is a source of CO<sub>2</sub> until late May, after which it becomes a sink peaking in July. During periods of uptake it is characterized by a dipole with uptake over the North and East and a source over the arid southwestern states Barkley et al. (2006b, c). A similar pattern is evident in model and observed total columns and CVMRs (Figs. 1 and 2). Fuel sources from North America (FL NA) are
- relatively constant in magnitude throughout the year (Table 1), with the largest CVMR
   contributions over the East coast (up to 0.5 ppmv). The North American biomass burning (BB NA) season starts in Canada in June reaching a peak in August with partial monthly mean columns of 1 ppmv; this contribution, in particular, is likely to be much larger on sub-monthly timescales and finer spatial scales.

We also show that CO<sub>2</sub> columns over North America are significantly influenced

<sup>25</sup> by Boreal Asia and mainland Asia and that in some months these column contributions are comparable in magnitude to North American fluxes. Column contributions

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from Boreal Asian fuel sources (FL BA) are largest over Alaska and northern Canada, reflecting the latitude of Boreal Asia and subsequent atmospheric transport. Similar spatial distributions are shown for biomass burning and the land-biosphere from Boreal Asia (BS BA), with the contribution from biomass burning peaking in mid-summer.

- <sup>5</sup> The land-biosphere is most positive during April (1.2 ppmv) and is most negative during July (-5 ppmv). The seasonal cycle of BS BA is similar to that of the North American biosphere (BS NA), which may compromise the ability of column observations to independently estimate fluxes from the North American and Boreal Asian biospheres despite exhibiting different spatial distribution in column space. The largest mainland
- <sup>10</sup> Asian fuel and biomass burning contributions (FL AS, BB AS) to North American CO<sub>2</sub> occur in March (not shown) and April over the west Coast, consistent with current understanding of the temporal continental outflow from that region (Liu et al., 2003). The biospheric signal from mainland Asia (BS AS) is delayed relative to North America with a negative peak in August. European column contributions from fuel, biomass burning and the land biogenerate (FL FLL PR FLL PR FLL PR FLL) are sublittingly similar to Parecel
- <sup>15</sup> ing, and the land biosphere (FL EU, BB EU, BS EU) are qualititively similar to Boreal Asia, reflecting similar high latitude atmospheric transport, but they are an order of magnitude smaller.

Many of these sources and sinks will be much higher on sub-monthly temporal scales and on finer spatial scales but our results reiterate previous studies that emphasize the importance of sub-1% precision column measurements if physically meaningful surface flux distributions of  $CO_2$  are to be estimated.

#### 5.2 Temporal distributions at individual sites

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Figures 8 and 9 show the CO<sub>2</sub> flux signatures that determine the variability of CO<sub>2</sub> at two measurement sites: the WLEF television tower, 12 km east of Park Falls in
<sup>25</sup> Wisconsin and Wendover in Utah. Earlier, in Fig. 4, we showed that GEOS-Chem had some skill in reproducing the seasonal cycle of CO<sub>2</sub> at both these sites, but predicted premature uptake of CO<sub>2</sub> at the Parks Falls site. We chose these two sites for this analysis because they exhibit different seasonal cycles.

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As in Fig. 4 we sample the model at the location of the two ground-based sites and at the SCIAMACHY overpass time when data is available. The WLEF site shows a seasonal cycle with a peak-to-peak range of 20 ppmv, which is captured reasonably well by GEOS-Chem. The corresponding model CO<sub>2</sub> columns vary by  $3 \times 10^{20}$  molec cm<sup>-2</sup>, representing a change of order 4% in the column. SCIAMACHY reproduces the broad-scale seasonal cycle observed at the surface (and the tower data at this site (Barkley et al., 2007)) but because of noise, due to the retrieval and the relatively coarse spatial colocation (Barkley et al., 2007), it is difficult to assess whether SCIAMACHY reproduces the later onset of the uptake observed by surface measurements. We use a 30-point running mean to effectively reduce random noise. The resulting smoothed

- observed columns, even after accounting for the bias, show a larger drawdown of  $CO_2$  during midsummer. Model and observed CVMRs show greater discrepancy during midsummer months. Figure 8d shows the seasonal contributions of different monthly sources and sinks to model CVMRs >0.5 ppmv at some time during the year. Fuel
- <sup>15</sup> combustion from North America, Europe and mainland Asia increase throughout the year, as expected, with a mean gradient of 1.5 ppmv/year. The North American biosphere at this site makes a significant contribution to the total CO<sub>2</sub> CVMR, with smaller but significant contributions from Boreal Asia, Europe and mainland Asia. The different continental biosphere signals peak at different times, due to differences in seasonal cy-
- <sup>20</sup> cles and atmospheric transport. Biomass burning from Boreal Asia plays only a small role in determining CO<sub>2</sub> CVMRs at this site, peaking in the Spring. Based on this calculation it is difficult to attribute differences between model and observed CO<sub>2</sub> CMVRs to bias in the magnitude or timing of different continental biosphere fluxes. However, as we discuss in the next section these subtle differences may help to spatially disagre-<sup>25</sup> gate CO<sub>2</sub> fluxes using formal inverse models.

Figure 9 shows model and observed columns and CVMRs at Wendover, Utah. The seasonal cycle at this site is weaker than at WLEF, with a peak-to-peak range of 10 ppmv. SCIAMACHY (smoothed) columns have a negative bias similar in magnitude to observed columns at the WLEF site. Model and observed CVMRS are gen-



erally much noisier than at WLEF, reflecting rapid variations in relatively small values of GEOS-4 surface pressure (790–840 hPa compared with 960–990 hPa at WLEF). Apparent drawdown of observed and model CO<sub>2</sub> columns and CVMRs at this site is much weaker than at the WLEF site. Figure 9d shows the seasonal contributions of

different monthly sources and sinks to model CVMRs >0.5 ppmv at some time during the year. As at WLEF there is a strong fuel signature originating from North America, Europe, and mainland Asia with a similar gradient through the year. From our analysis the weak seasonal cycle is determined by biospheric signals from Boreal and mainland Asia, which is not obvious from interpreting total column data.

#### 10 6 Implications for surface flux estimation

The ultimate goal of space-borne CO<sub>2</sub> data are to locate and quantify natural sources and sinks of CO<sub>2</sub> so that more detailed studies can assess their durability with changes in climate. Generally, an inverse model is required for that purpose. While such a study is outside the scope of this paper, and will be the subject of forthcoming work, we calculate the monthly mean Jacobian matrix corresponding to our forward model calculations to illustrate the ability of these column data to infer individual sources and sinks of CO<sub>2</sub>. In general the Jacobian matrix, describing the sensitivity of total CO<sub>2</sub> columns to changes in surface sources and sinks, attributes differences between forward model (GEOS-Chem) and observed quantities to specific surface sources and sinks.

For illustration only, Fig. 10 shows the monthly mean columns of the Jacobian matrix for North America, based on Fig. 7 and Table 1. These calculations show that the North America and Boreal Asia land biosphere signals are among the strongest signals that can potentially be retrieved independently. While the initial goal of inversions of space-

<sup>25</sup> based CO<sub>2</sub> data may be to estimate total fluxes on a continental scale, it is clear that the superposition of different continental flux signatures (some which represent 1% of total CVMRs) complicates the interpretation of such data. However, as we discussed



earlier and show in Fig. 7 the distributions of many of the dominant flux signatures are sufficiently separated in space and time to permit independent estimation of individual fluxes; this needs to be confirmed with inversion calculations. Many of the sources and sink of CO<sub>2</sub> shown here will have much stronger signatures on finer temporal and <sup>5</sup> spatial scales and that should also be considered.

The e-folding lifetime of these individual flux contributions is typically 3 to 4 months, with e-folding lifetimes exceeding 6 months for Asian sources, consistent with Bruhwiler et al. (2005). All sensitivities converge to a background sensitivity (20) beyond which individual source and sink signatures are well mixed. In practice, the inversion will use a Jacobian matrix for a specific surface grid box to avoid aliasing and to capture the sharp temporal gradients in  $CO_2$  during the onset and decline of the growing season.

### 7 Conclusions

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We have used the GEOS-Chem global 3-D CTM, driven by a priori sources and sinks of CO<sub>2</sub>, to interpret variability of SCIAMACHY CO<sub>2</sub> columns. We have shown that GEOS-Chem has some skill in reproducing observed distributions of surface VMR at sites over 15 North America. The magnitude and distribution of model CO<sub>2</sub> columns, accounting for the SCIAMACHY averaging kernel, are determined largely by surface pressure and show good agreement with SCIAMACHY (r=0.9) as expected but with a 3% positive bias. Model CO<sub>2</sub> CVMRs show much less agreement, partly driven by a large positive bias in drawdown of CO<sub>2</sub> during the growing season. We show that model CVMRs 20 and surface VMRs converge during peak growing season months, a result amplified by the use of the SCIAMACHY averaging kernels that describe how instrument sensitivity increases as a function of depth in the troposphere. This suggest that SCIAMACHY and upcoming instruments sensing CO<sub>2</sub> at NIR wavelengths will be most sensitive to periods of intense biospheric uptake (Barkley et al., 2007). 25

We have used a tagged approach to interpret variability of CVMRs in terms of individual source and sink terms. In general, we find local sources provide the largest



contributions to CVMR variability, with the North American land biosphere representing more than 1% during peak growing season. Fuel sources are relatively constant, while biomass burning makes only a significant contribution in mid-burning season. Our calculations show that surface fluxes from Boreal Asia, mainland Asia and Europe also

- <sup>5</sup> represent significant contributions to CVMR variability over North America, with, for instance, the Boreal Asia land biosphere responsible for almost 1% of the total CVMR in mid-summer. While there are significant overlaps in the CVMR distributions from local and non-local fluxes, there is also sufficient separation of these contributions in time and space that with careful analysis should permit independent flux estimation.
- Analysis of data from individual sites within the US provided further insight into the superposition flux signatures. At the WLEF GLOBALVIEW site near Park Falls, Wisconsin we showed that the seasonal cycle (peak-to-peak surface VMR of 29 ppmv) was driven by North American biospheric uptake (-4 ppmv peak) but also biospheric uptake signatures from Boreal Asia, Europe and to a lesser extent mainland Asia. In contrast, the site at Wendover Utah, with a smaller peak-to-peak seasonal cycle of 10 ppmv had
- the site at Wendover Utah, with a smaller peak-to-peak seasonal cycle of 10 ppmv had large contributions from biospheric uptake signatures originating from Boreal Asia and mainland Asia, both peaking in late summer with CVMRs of -2 ppmv.

CO<sub>2</sub> flux estimation relies partly on quantifying the difference between model and observed CO<sub>2</sub> quantities. Prescribed error covariance matrices describe only the random
 error associated with the model and observations. Uncharacterized systematic error could be mis-attributed to surface source and sinks. Estimating systematic bias with a model is of little value because our current quantitative understanding of the carbon cycle is incomplete. Dedicated calibration-validation efforts are underway for upcoming spaceborne missions. A particular focus, owing to spatial nature of the column data, is

the estimation of regional biases (on spatial scales of 100 km), a length scale lying between undetectable effects due to noise and large-scale biases detectable with precise and accurate ground-based FTS. Unfortunately, no such measurements were available during 2003. Recent studies have shown that SCIAMACHY CO<sub>2</sub> columns VMRs during 2004 are within 2% of the ground-based FTS column measurements at Park Falls,



Wisconsin, capturing only the monthly mean variability (Barkley et al., 2007). This suggests that  $CO_2$  CVMR anomalies might be more effective than  $CO_2$  CVMRs as the measurement vector.

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GLOBALVIEW-CO<sub>2</sub>: GLOBALVIEW-CO<sub>2</sub>: Cooperative Atmospheric Data Project – Carbon

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**Table 1.** Monthly mean regional CO<sub>2</sub> fluxes (Tg CO<sub>2</sub>/month) for the forward model analysis (Sect. 3 and Fig. 3). BB denotes biomass burning; FL denotes the sum of fossil fuel and biofuel combustion; and BS denotes the land biosphere. ROW includes only land-based sources and sinks; the ocean biosphere is an annual global net sink of -8050 Tg CO<sub>2</sub>/yr. Boreal Asia (BA) is defined by 72.5° E–172.5° W, 45° N–88° N; mainland Asia (AS) is defined by 72.5° E–152.5° E, 8° N–45° N; Europe (EU) is defined by 17.5° E–72.5° W, 36° N–88° N; North America (NA) defined by 172.5° E–17.5° E, 24° N–88° N; and the rest of the world (ROW) is the remaining region.

	Jan	Feb	Mar	Apr	Мау	Jun	Jul	Aug	Sep	Oct	Nov	Dec
BB												
BA	0	0	21	124	486	233	196	80	26	13	1	0
AS	29	37	93	89	15	5	4	5	5	4	3	9
EU	0	0.5	6	21	17	6	14	39	34	30	0.3	0.2
NA	2	1	3	6	7	44	36	95	22	14	9	1
ROW	895	463	360	262	891	774	801	853	669	427	360	668
FL												
BA	53	47	53	51	53	51	53	53	51	53	51	53
AS	808	730	808	730	808	730	808	808	730	808	730	808
EU	570	514	570	551	570	551	570	570	551	570	551	570
NA	563	508	563	545	563	545	563	563	545	563	545	563
ROW	475	429	475	460	475	460	475	475	460	475	460	475
BS												
BA	374	401	563	657	64	-1469	-1818	-952	459	770	542	408
AS	288	484	763	797	243	-363	-916	-1141	-456	-12	127	180
EU	534	455	333	-98	-1068	-1491	-1284	-307	651	892	772	630
NA	703	709	729	496	-248	-1692	-1981	-1167	33	834	838	747
ROW	-101	-322	-350	119	-139	-1385	-1431	-578	952	1363	1099	771

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**Fig. 1.** Monthly mean SCIAMACHY (left) and GEOS-Chem (middle)  $CO_2$  columns  $(10^{21} \text{ molec cm}^{-2})$  over North America during April to September 2003 averaged over the GEOS-Chem  $2^{\circ} \times 2.5^{\circ}$  grid. The model is sampled at the time and location of the observed scenes, and using the SCIAMACHY averaging kernel as outlined in the main text. The RHS panels show scatterplots of the monthly mean data, with the number of data points *n*, correlation coefficient *r*, and the model bias inset. Red data denote columns over the region defined by latitudes >50° N and longitudes >100° W (as shown in top LHS panel). We exclude 1) cloudy scenes, identified by instrument polarization devices, 2) scenes with solar zenith angles >75°, 3) scenes with a retrieval errors of ≥5%, and 4) scenes that correspond to CVMRs outside of the range 340–400 ppmv. 7362





during April to September 2003 averaged over the GEOS-Chem 2°×2.5° grid. The model and data descriptions are as Fig. 1. The nearest ECMWF (1.125°×1.125°) and GEOS-4 (1°×1.125°) surface pressure data are used to convert from observed and model columns to CVMRs, respectively.

[ppmv]

400

SCIAMACHY CO\_ GEOS-Chem CO

360

360

360

APR

MA

JUN

JUL

AUG

SEP

340

360

380

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**Fig. 3.** Source regions for the tagged  $CO_2$  simulation. The regions are denoted boreal Asia (BA), mainland Asia (AS), Europe (EU), North America (NA) and the rest of the world (ROW). See Table 1 for latitude and longitude region definitions and associated flux estimates.





**Fig. 4.** Comparison of observed (GLOBALVIEW-CO<sub>2</sub>, 2006) and model surface CO<sub>2</sub> concentrations (ppmv) over North America during 2003. Model concentrations, averaged on a  $2^{\circ} \times 2.5^{\circ}$ , have been sampled at the overpass time of SCIAMACHY when data are available.

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**Fig. 5.** The mean averaging kernel  $(0-70^{\circ} \text{ solar zenith angle, SZA})$  for the retrieval of CO<sub>2</sub> from SCIAMACHY NIR measurements (Barkley et al., 2006c) and applied to the GEOS-Chem model. Individual averaging kernels, representative of a particular SZA, have been generated brute-force by perturbing the US standard atmosphere by 10 ppmv at 1 km intervals between 10 km and at 5 km intervals above 10 km.

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**Fig. 6.** Monthly mean latitude gradients of SCIAMACHY and GEOS-Chem  $CO_2$  CVMRs (ppmv) and GEOS-Chem surface VMR (ppmv) over North America during April–September 2003 binned every 5° latitude. Model concentrations, averaged on a 2°×2.5°, have been sampled at the overpass time of SCIAMACHY when data are available. Filled triangles denote mean values and open circles denote median values. Vertical lines denote the 1-standard deviation about the mean values.



**Fig. 7.** Monthly mean GEOS-Chem  $CO_2$  CVMR contributions (ppmv) from continental sources and sinks during April to September 2003, averaged over the GEOS-Chem  $2^{\circ} \times 2.5^{\circ}$  grid. See Fig. 3 for source region definitions and Table 1 for regional  $CO_2$  flux estimates.



Interactive Discussion



**Fig. 8.**  $CO_2$  surface concentrations, columns, and CVMRs at the WLEF television tower, Wisconsin USA (45.94° N, 90.27° W, 442 m above sea level) during 2003. **(A)** GLOB-ALVIEW and GEOS-Chem model, averaged on a 2°×2.5° grid, surface  $CO_2$  concentrations (ppmv), **(B)** SCIAMACHY (raw and 30-point running average) and GEOS-Chem  $CO_2$  columns  $[10^{21}$  molec cm<sup>-2</sup>], **(C)** SCIAMACHY (raw and 30-point running average) and GEOS-Chem CVMR (ppmv), and **(D)** GEOS-Chem CVMR contributions greater than 0.5 ppmv.





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**Fig. 9.**  $CO_2$  surface concentrations, columns, and CVMRs at Wendover, Utah USA (39.9° N, -113.72° W, 1320 m above sea level) during 2003. Individual panels follow Fig. 8.







**Fig. 10.** Monthly mean columns of the Jacobian matrix (ppmv/Tg  $CO_2$ ), scaled by  $10^5$  for presentation, calculated using a priori flux estimates (Table 1) and the corresponding GEOS-Chem CVMR contributions, averaged on a  $2^\circ \times 2.5^\circ$  grid over North America during 2003 (Fig. 7). Colours denote specific months . Each point represents the monthly mean sensitivity of North American  $CO_2$  columns to specific continental sources and sinks. Lines connecting the points have no physical significance.