

## Importance of fossil fuel emission uncertainties over Europe for CO<sub>2</sub> modeling: model intercomparison

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**Abstract.** Inverse modeling techniques used to quantify surface carbon fluxes commonly assume that the uncertainty of fossil fuel CO<sub>2</sub> (FFCO<sub>2</sub>) emissions is negligible and that intra-annual variations can be neglected. To investigate these assumptions, we analyzed the differences between four fossil fuel emission inventories with spatial and temporal differences over Europe and their impact on the model simulated CO<sub>2</sub> concentration. Large temporal flux variations characterize the hourly fields (~40% and ~80% for the seasonal and diurnal cycles, peak-to-peak) and annual country totals differ by 10% on average and up to 40% for some countries (i.e., the Netherlands). These emissions have been prescribed to seven different transport models, resulting in 28 different FFCO<sub>2</sub> concentrations fields.

The modeled FFCO<sub>2</sub> concentration time series at surface sites using time-varying emissions show larger seasonal cycles (+2 ppm at the Hungarian tall tower (HUN)) and smaller diurnal cycles in summer (−1 ppm at HUN) than when using constant emissions. The concentration range spanned by all simulations varies between stations, and is generally larger in winter (up to ~10 ppm peak-to-peak at HUN)

than in summer (~5 ppm). The contribution of transport model differences to the simulated concentration std-dev is 2–3 times larger than the contribution of emission differences only, at typical European sites used in global inversions. These contributions to the hourly (monthly) std-dev's amount to ~1.2 (0.8) ppm and ~0.4 (0.3) ppm for transport and emissions, respectively. First comparisons of the modeled concentrations with <sup>14</sup>C-based fossil fuel CO<sub>2</sub> observations show that the large transport differences still hamper a quantitative evaluation/validation of the emission inventories. Changes in the estimated monthly biosphere flux (F<sub>bio</sub>) over Europe, using two inverse modeling approaches, are relatively small (less than 5%) while changes in annual F<sub>bio</sub> (up to ~0.15% GtC yr<sup>−1</sup>) are only slightly smaller than the differences in annual emission totals and around 30% of the mean European ecosystem carbon sink. These results point to an urgent need to improve not only the transport models but also the assumed spatial and temporal distribution of fossil fuel emission inventories.



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## 1 Introduction

The combustion of fossil fuel since preindustrial time has caused an increase of the atmospheric CO<sub>2</sub> concentration of about 100 ppm, or 35 % of the preindustrial level. Currently about 50 % of the annual fossil fuel emissions is absorbed by the oceans and the terrestrial biosphere, which implies that without those sinks the current CO<sub>2</sub> level would approach 500 ppm (Canadell et al., 2007). An important effort in carbon cycle research is to quantify the spatial and temporal characteristics of the land and ocean sinks, and whether or not they will change in the future. A powerful approach to quantify the current sources and sinks of CO<sub>2</sub> is to infer these fluxes from atmospheric concentration measurements, using inverse modeling techniques. In the inversion framework it is commonly assumed that the uncertainty of fossil fuel emissions is negligible compared to the uncertainty of the sought net ocean and land fluxes. Furthermore, it is assumed that intra-annual variations of fossil fuel emissions are negligible compared with the large climatically-driven variations of the biosphere exchanges. These assumptions might not be critical when assessing the annual global carbon budget, except where fossil fuel emissions are important (industrialized regions). This is only partly confirmed by one global inverse modeling study by Gurney et al. (2005), who showed that the neglect of temporal variations in fossil sources caused monthly biases in regional budgets up to 50 % during parts of the year.

A recent development is to use atmospheric transport models with increased resolution over specific regions. This approach requires a dense measurement network and high frequency (hourly) sampling, which explains why these activities focus mainly on developed parts of the world, such as Europe (CaroboEurope-IP project) and North America (NACP project) where such measurement networks are in operation. At those higher resolutions, the spatial and temporal distributions of fossil fuel emissions become critical, in particular downwind of industrialized regions where the contribution of fossil fuel emissions to the overall carbon budget is relatively large. Although on the global and annual scale fossil fuel emissions are considered to be accurately known, its distribution within a year and between and within individual countries is still uncertain. The errors associated with the emission inventory estimates at these scales are expected to be rather systematic. However, besides the study of Gurney et al. (2005), almost no quantitative information exists on the importance of fossil fuel space-time distribution uncertainties for regional scale inverse modeling and how these errors compare with transport model uncertainties. If systematic errors in fossil fuel emission inventories are indeed significant, this would imply that regional scale CO<sub>2</sub> inversions combined with indirect fossil fuel CO<sub>2</sub> proxies, such as <sup>14</sup>C measurements, could potentially provide information to further constrain these emissions.

The objectives of this publication are to investigate (i) the magnitude of the uncertainties and biases in fossil fuel CO<sub>2</sub> (FFCO<sub>2</sub>) emissions and their intra-annual temporal variations, (ii) their contribution to the uncertainty in simulated CO<sub>2</sub> concentrations, and (iii) their impact on regional scale inverse modeling. We will focus our modeling activities on the European sources and sinks of CO<sub>2</sub>. Europe is a particularly interesting test case since the fossil fuel emissions are large ( $\sim 1.7 \text{ PgC yr}^{-1}$  for geographical Europe) compared to the net uptake by the terrestrial biosphere ( $\sim 0.2 \text{ PgC yr}^{-1}$ ). This doesn't necessarily imply a worst case scenario, however, since the European fossil fuel emissions are relatively well characterized compared with many other parts of the world.

The intra-annual temporal variations of FFCO<sub>2</sub> emissions are characterized by cyclic variations on the seasonal, weekly and diurnal time scales. All these variations will be taken into account, in contrast with Gurney et al. (2005), who only accounted for seasonal variations. Diurnal emission variations may be important because regional inversions commonly select afternoon measurements to reduce the impact of known errors in the simulation of the diurnal PBL dynamics. Furthermore, errors in the representation of the diurnal cycle affect the simulated diurnal rectifier (Denning et al., 1995), which may cause spurious concentration gradients on larger spatial and temporal scales.

Our approach to reach the above mentioned objectives is as follows: A set of state of the art FFCO<sub>2</sub> emission inventories is selected, with and without temporal variation as described in Sect. 2.1. These emission inventories define separate FFCO<sub>2</sub> tracers, which are transported forward using a suite of global and regional transport models outlined in Sect. 2.2. Simulated FFCO<sub>2</sub> concentrations are compared at selected European measurement locations, and differences are quantified either across the emission inventories or across the transport models (Sect. 3). The potential of using <sup>14</sup>CO<sub>2</sub> to validate fossil fuel CO<sub>2</sub> simulations is investigated based on a comparison with quasi-continuous <sup>14</sup>C-based fossil fuel CO<sub>2</sub> observations, currently available at only few selected sites. Finally, inverse modeling calculations are carried out for one year using the different FFCO<sub>2</sub> emission inventories to investigate the impact of assuming perfect and constant fossil fuel emissions on inversion derived CO<sub>2</sub> source and sink estimates (Sect. 4).

## 2 Model simulations

### 2.1 Emission inventories

Model simulations have been carried out for four partially independent fossil fuel CO<sub>2</sub> emission inventories (FFCO<sub>2</sub> maps) which differ in their spatial and temporal patterns. The FFCO<sub>2</sub> inventories represent different emission inventories as specified in Table 1, for the year 2000.

**Table 1.** Fossil fuel CO<sub>2</sub> emissions inventory descriptions.

| Tracer name  | Inventory                   | Time variation      | Hor. Resolution                                | ref                        |
|--------------|-----------------------------|---------------------|--|----------------------------|
| Transcom3    | CDIAC NDP-058A <sup>a</sup> | constant            | 1° × 1°  | Brenkert (1998)            |
| EDGAR Annual | Edgar FT2000                | constant            | 1° × 1°  | van Aardenne et al. (2005) |
| EDGAR Hourly | Edgar FT2000                | hourly <sup>b</sup> | 1° × 1°  | van Aardenne et al. (2005) |
| IER Hourly   | IER inventory               | hourly              | 10 × 10 km <sup>2</sup> – 1° × 1° <sup>c</sup> | Pregger et al. (2007)      |

<sup>a</sup> Gridded data were prepared for the Transcom Continuous Experiment (Law et al., 2008).

<sup>b</sup> Mean temporal profiles were used, representing average European conditions (provided by EMEP).

<sup>c</sup> <1° × 1° for Europe only; 10 × 10 km<sup>2</sup> over Germany.

### 2.1.1 “T3\_annual”

This emission inventory corresponds to what has been used in the Transcom-3 continuous experiment (Law et al., 2008, <http://www.purdue.edu/transcom/>). The emissions are based on Brenkert (1998) and are kept constant throughout the year. Initially defined for the year 1995, they were rescaled to the emission total for 2000, using the total source from the “EDG\_annual” emission inventory described below.

### 2.1.2 “EDG\_annual”

The “EDG\_annual” emission inventory corresponds to the EDGAR FT2000 inventory for year 2000 (van Aardenne et al., 2005), which does not account for intra-annual variations. We only included emission categories accounting for fossil fuel usage and cement production, leaving out all categories accounting for biofuel emissions and emissions from organic waste handling (e.g. from agriculture).

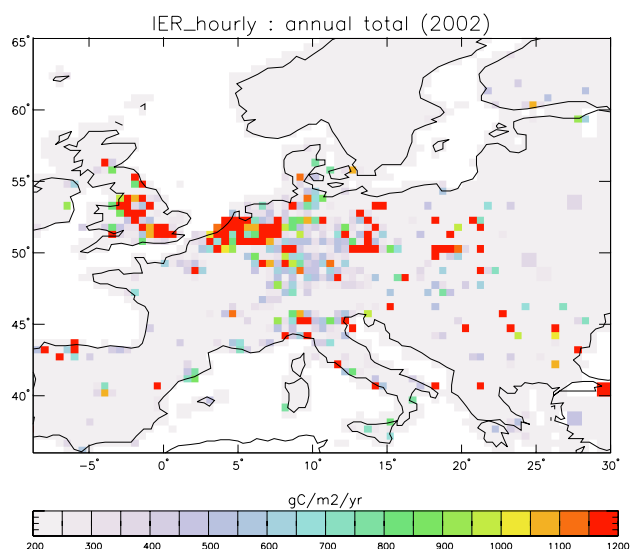
### 2.1.3 “EDG\_hourly”

The “EDG\_hourly” emission inventory is similar to “EDG\_annual” except that within Europe it has been convolved with diurnal, weekly and seasonal variations provided by EMEP (Vestreng et al., 2005). EMEP provides temporal anthropogenic emission variations for Europe per source category and for various chemical compounds. The seasonal variations are specified per country. For the daily and weekly variations only average time profiles were available which have been applied uniformly over Europe and throughout the year. As EMEP’s main priority is the forecast of pollution events, their emission inventories do not explicitly address CO<sub>2</sub>. To circumvent this problem the temporal profiles of the following tracers have been used for FFCO<sub>2</sub>: CO for traffic and SO<sub>2</sub> for industrial sources, power supply, and residential heating. These temporal profiles have been applied to the “EDG\_annual” inventory, after translation of the EMEP source categories (SNAP level 1) to the EDGAR grid.

### 2.1.4 “IER\_hourly”

The “IER\_hourly” emission inventory has been derived from the European emission inventory compiled by IER (Institut für Energiewirtschaft und Rationelle Energieanwendung) for the year 2000 (Pregger et al., 2007) at a relatively high spatial resolution of up to 10 km × 10 km over Germany, including diurnal, weekly and seasonal variations specified by country and time of the year for Germany. “EDG\_annual” emissions (without temporal variations) were used to complement the “IER\_hourly” emissions outside a European domain including western countries up to the black sea (excluding Russia).

The methodology that has been used to construct the “IER\_hourly” emission inventory can be briefly summarized as follows (for more details see Pregger et al., 2007): the IER emission model derives FFCO<sub>2</sub> emissions at high temporal and spatial resolution starting from of a database of annual emissions per country. These annual data are taken from the national reports to the United Nations Framework Convention on Climate Change (UNFCCC) for the year 2000. However, UNFCCC emissions for 2001 have been used in case emission reporting for 2000 were unavailable. In the IER model the national emissions are distributed over administrative units using statistical information, such as population density. Subsequently, the emissions are allocated at higher resolution accounting for point, line and area sources, using a geographic information system (GIS). Emissions are distributed in time according to process specific activity maps, accounting for temporal source variations on the diurnal, weekly and seasonal time scale. These temporal source variations represent, for example, traffic rush hours, the reduced power demand in weekends, domestic heating in winter, and air conditioning in summer. Temporal emission variations of some sources, such as domestic heating, depend on regional variations in climatic conditions. Note that the IER product uses more detailed and calibrated databases for Germany than for the rest of Europe and accounts for temperature dependencies in Germany only (based on measured temperatures), which leads to large weekly flux variations (see Fig. 2).



**Fig. 1.** Annual fossil fuel emissions from the “IER\_hourly” inventory.

Figure 1 shows a map of the annual European “IER\_hourly” FFCO<sub>2</sub> emissions. The IER source has been interpolated to  $0.5^\circ \times 0.5^\circ$  (large squares on the eastern part correspond to the “EDG\_annual” emission at  $1^\circ \times 1^\circ$ ). Large emissions associated with industrial areas and big cities are well represented by this inventory. Note that the emissions over Germany show the highest level of detail, owing to the fact that much information was available to IER for this country (see Fig. 2).

### 2.1.5 Comparison of the different emissions inventories

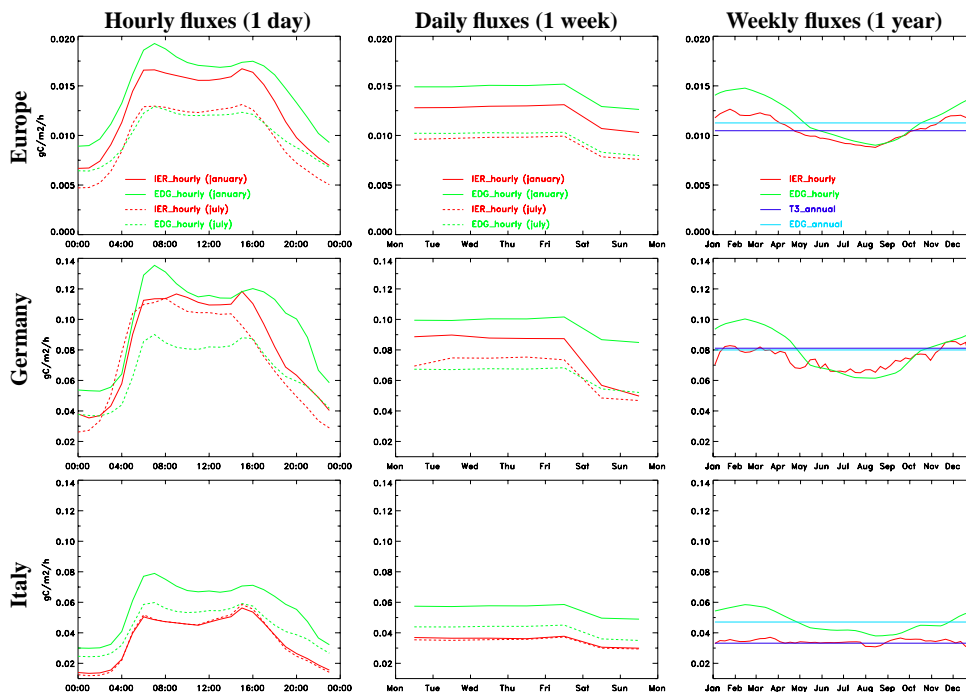
Table 2 presents a comparison of annual FFCO<sub>2</sub> emissions for selected European countries and geographical Europe for the “EDG\_annual” and “IER\_hourly” inventories discussed above and the data reported by Marland et al. (2006). The latter is only used for further verification of country level FFCO<sub>2</sub> emissions. These estimates include emissions from all fossil sources except international shipping and air traffic at cruise altitude (landing and take off cycles are included) and cement production. The comparison indicates that the difference between the national totals is generally around 10%. However, for some countries substantially larger differences are found, such as for the Netherlands, for which the difference between the estimates by EDGAR FT2000 and Marland et al. (2006) is 38%. Similar differences are found for Norway (57%), and Bulgaria (44%). These differences are likely explained by inconsistencies, such as the exact definition of source classes, data gaps, etc. These inconsistencies are difficult to trace without support of inventory experts. In a recent study, Ciais et al. (2010) specifically analyzes the magnitude, trends, and uncertainties in FFCO<sub>2</sub> emission for EU-25, and show greater consistency between the dif-

**Table 2.** Comparison of annual fossil fuel emission estimates for the year 2000.

| Country     | EDGAR FT2000<br>PgC | IER<br>PgC | Marland<br>PgC | Max-Min<br>(%) |
|-------------|---------------------|------------|----------------|----------------|
| Germany     | 0.262               | 0.234      | 0.224          | 15             |
| France      | 0.119               | 0.111      | 0.099          | 18             |
| Italy       | 0.130               | 0.126      | 0.122          | 6              |
| Spain       | 0.089               | 0.084      | 0.082          | 8              |
| England     | 0.162               | 0.148      | 0.154          | 9              |
| Netherlands | 0.057               | 0.047      | 0.039          | 38             |
| Europe      | 1.989               | 1.752      | –              | 13             |

ferent estimates (around 10%) when differences in system boundaries (e.g. counting or not bunker fuels, non-energy products) are taken into account. However, when FFCO<sub>2</sub> inventories are used by atmospheric modelers it is commonly assumed that they provide a systematic coverage of all fossil CO<sub>2</sub> sources, and that the reported uncertainties represent any deviations from that ideal situation. The accuracy of annual FFCO<sub>2</sub> emissions is therefore often assumed to be much better than 10% (see for example Rödenbeck et al., 2003; Baker et al., 2006; Bousquet et al., 2000). Our inventory comparison for Europe suggests that the differences can be substantially larger at the country scale (see also spatial differences between “IER\_hourly” and “EDG\_hourly” inventories, Fig. S1, Supplement). These differences give rise to what we refer to as “apparent uncertainty”, which is typically substantially larger than the expected intrinsic uncertainty of the underlying data (like for example energy statistics). The differences are likely explained by numerous possible inconsistencies arising from unaccounted sources,... In the end, however, the totals are most critical to atmospheric modelers and therefore the “apparent uncertainty” is critical when comparing models to atmospheric measurements, even though the numbers may be judged as unrealistically large by inventory experts.

Figure 2 shows a comparison of FFCO<sub>2</sub> temporal patterns in the emissions for selected countries. Sizeable emission variations are found, related, in particular, to the seasonal cycle (~40% peak-to-peak) and the diurnal cycle (~80% peak-to-peak). The seasonal variations provided by EMEP (as used in “EDG\_hourly”) are generally larger than those of IER. As expected, the seasonal emission variation in the Mediterranean countries is less than in more northern countries owing to the mild Mediterranean climate in winter. This is illustrated by the difference between Italy and Germany in Fig. 2. This difference is more prominent for IER than for EMEP. Integrated over Europe the seasonal emission variations of IER and EMEP are in relatively close agreement, although slightly smaller for IER. Note that the relative good agreement is at least partly explained by a substantial contribution of Eastern Europe, where EDGAR FT2000 replaces



**Fig. 2.** Temporal variation of the aggregated fluxes over different regions: Europe (top), Germany (middle) and Italy (bottom). First and second columns represent the mean diurnal cycle and the mean weekly cycle, respectively, for “IER\_hourly” and “EDG\_hourly” in July and January; third column represents the seasonal variations (weekly means) for the four emissions inventories. Note that the y-range is different for Europe (much smaller).

missing IER estimates. In “EDG\_hourly” and “IER\_hourly” emissions the diurnal variation is larger than the weekly or seasonal variations all year long. The diurnal pattern of the EMEP emissions is less variable across different countries because the EMEP diurnal cycles do not include country specific information. For Germany, the IER emission variations are about 50 % larger than those of EMEP in July, and only slightly larger in January. The morning and afternoon emission maxima are mainly determined by the peak in traffic rush hours. The relative size of these maxima shows slight differences between IER and EMEP. Figure 2 also shows the weekly emission variations in July and January. Smaller emissions (around 15 %) occur during the weekend than during the rest of the week in both “EDG\_hourly” and “IER\_hourly” emissions. EMEP and IER weekly variations are in reasonable agreement, except for Germany where EMEP shows about 50 % less variation than IER. This suggests that the weekly emission variations in other countries might also be underestimated by EMEP, since the IER treatment of Germany is most realistic. All these differences are also illustrated for France and Spain in the Supplement (Fig. S2).

In summary, it can be concluded that the European fossil fuel emissions show significant temporal variation on various time scales ( $\sim 80$  % on diurnal,  $\sim 40$  % on seasonal, and  $\sim 15$  % on weekly, peak-to-peak). Furthermore, these vari-

ations do not seem to be well quantified given the substantial differences between the estimates provided by EMEP and IER. The large differences between the “IER\_hourly” and the “EDG\_hourly” emission variations over Germany indicate the importance of using country specific information such as rush hour traffic, vacation periods, regional climate variations,.... However, the important question is whether these variations give rise to significant variations in atmospheric FFCO<sub>2</sub> sampled at surface stations. This question will be investigated in the following sections.

## 2.2 Transport model simulations

The fossil fuel emission inventories defined in Sect. 2.1 were prescribed as separate FFCO<sub>2</sub> tracers to 7 transport models (see Table 3). Their horizontal resolutions vary between several square degrees (lat  $\times$  lon) for the global models (LMDZ, TM3) to  $0.5^\circ \times 0.5^\circ$  for the regional models, which only cover the European domain (DEHM, REMO, CHIMERE). TM5 reaches the highest resolution among the global models, because it is zoomed over Europe at  $1^\circ \times 1^\circ$ . CHIMERE slightly differs from the two other regional models, DEHM and REMO, as it only models the lower troposphere (up to 500 hPa) with a high vertical resolution (20 levels). COMET is a Lagrangian model in which the air mass trajectories are calculated from 3-hourly ECMWF meteorological fields at  $1^\circ \times 1^\circ$  horizontal resolution. Two vertical levels are

**Table 3.** Overview of participating atmospheric transport models.

| Model   | Domain     | Horizontal Resolution | Vertical levels           | Meteorology | Ref.                       |
|---------|------------|-----------------------|---------------------------|-------------|----------------------------|
| LMDZ    | global     | 3.75° × 2.5°          | 19 $\eta$                 | ECMWF       | Hauglustaine et al. (2004) |
| TM3     | global     | 4° × 5°               | 19 $\sigma$               | NCEP        | Heimann and Körner (2003)  |
| TM5     | global     | 3° × 2°               | 25 $\eta$                 | ECMWF       | Krol et al. (2005)         |
|         | Europe     | 1° × 1°               |                           |             | Krol et al. (2005)         |
| DEHM    | Europe     | 0.5° × 0.5°           | 20 $\sigma$               | ECMWF/MM5   | Geels et al. (2002)        |
| REMO    | Europe     | 0.5° × 0.5°           | 20 $\eta$                 | ECMWF       | Langmann (2000)            |
| CHIMERE | Europe     | 0.5° × 0.5°           | 20 $\sigma$ up to 500 hPa | ECMWF/MM5   | Schmidt et al. (2001)      |
| COMET   | Lagrangian | – <sup>a</sup>        | 2 <sup>b</sup>            | ECMWF       | Vermeulen et al. (2006)    |

<sup>a</sup> Trajectories calculation from meteorological fields at 1° × 1°.

<sup>b</sup> Layer boundary at dynamically calculated PBL Height.

considered in COMET representing the planetary boundary layer and the free troposphere. Note, that COMET was primarily designed to simulate observational points that are in the mixed PBL. The vertical model resolution near the surface varies substantially between the models. The depth of the first layer ranges from 150 m in LMDZ/TM3 to nearly 30 m in REMO/CHIMERE. More detailed model descriptions can be found in Geels et al. (2007) and Law et al. (2008).

Model simulations were performed for 3 yr covering the period 2000–2002 (following the Transcom-3 experiment), using analyzed meteorology. The models were initialized at 0 ppm and the first two years are only used for spin-up. In the last year, concentrations are extracted at the same measurement sites used in the Transcom-3 model inter-comparison and at hourly temporal resolution for all models (Law et al., 2008). Hourly fields from the TM3 (or LMDZ) model were used as lateral boundary condition for the regional models, DEHM and REMO (or CHIMERE) and TM5 results were used as background information for COMET. Note finally, that nearly all models employ the ECMWF wind fields, except TM3 that uses NCEP winds.

### 2.3 Description of the inversions set-up

Inverse modeling calculations were performed to investigate the impact of the differences between fossil fuel inventories on the net exchange of carbon by the European terrestrial biosphere, inferred as a “residual”. Recall that in conventional inversions which neglect uncertainties of fossil fuel emissions the actual errors in the a priori fossil fuel inventory are projected on the a posteriori derived terrestrial biosphere fluxes. The aim of our inverse modeling calculations is to quantify this error. Although the accuracy of current inversions is known to be primarily limited by the sparseness of the atmospheric network, and by unknown biases in transport models (Gurney et al., 2002; Stephens et al., 2007), systematic errors in fossil fuel space-time distribution might also turn out to be important.

**Table 4.** Set up of the two inversions.

|                 | LMDz inversion  | TM3 inversion         |
|-----------------|---|-----------------------|
| Flux resolution | Monthly × Pixel based                                 | Weekly × Pixel based  |
| Observations    | 70 sites; Monthly data                                | 70 sites × Flask data |
| Prior fluxes    | Biosphere model (ORCHIDEE)                            | No prior model        |
| Prior errors    | Based on NPP + spatial correlations based on distance |                       |

We conducted a series of inversions with two transport models (TM3 and LMDZ) out of the seven described above. Currently both inversions solve for CO<sub>2</sub> surface fluxes at the spatial resolution of the model grid, given certain assumptions on their prior error covariance matrix. The inverse set-ups follow from the study of Peylin et al. (2005) and ? for LMDZ and TM3, respectively. Both systems solve for the natural component of the terrestrial fluxes and for the ocean fluxes using atmospheric concentration measurements, atmospheric transport information, and prior information (including estimated a priori errors on the fluxes). The fossil fuel emissions are prescribed to the inversion, using either of the four inventories described in Sect. 2.1. The two systems are largely independent regarding their treatment of prior information, but adopt a similar selection of atmospheric stations (see Table 4 for details). The inversions are performed for the period 2000–2002, but we will only discuss the results for 2001, avoiding end effects (as caused both by the initial condition and the time lagged response of the fluxes at the stations).

For each model, we performed four inversions using the four different fossil fuel emission inventories. Note that in the case of LMDZ the diurnal cycle of the FFCO<sub>2</sub> emissions is not used but only the day to day variations. In each case, only the land and ocean “residual” fluxes are optimized, while the fossil fuel component and its space-time distribution is assumed perfect and thus kept fixed. In a *perfectly constrained inverse problem*, i.e. with all fluxes

being independently constrained by atmospheric measurements, the differences between the inverted biosphere carbon fluxes would correspond to the differences in the input fossil fuel emissions. However, because of the under-constrained nature of current inversions (i.e., only few observations for a large number of unknown fluxes) the impact of fossil fuel differences might be significantly different, both spatially and temporally. These differences will also be spread over adjacent poorly constrained regions, including the oceans. We will thus compare the posterior fluxes (mainly over Europe) in order to investigate the sensitivity of the calculated biosphere flux to fossil fuel apparent uncertainties and the neglect of time variations in the prior fossil fuel emissions. The use of two different inverse approaches is important to determine the sensitivities of the FFCO<sub>2</sub> induced emission biases to the choice of inversion procedure.

### 3 Results: forward modelling

#### 3.1 FFCO<sub>2</sub> Concentration time series

CO<sub>2</sub> concentration time series were simulated for all European measurements sites (see site location at <http://www.carboeurope.org/>). For the sake of brevity, the discussion is illustrated with the results for one station, the Hegyhatsal tall tower (115 m) in Hungary (referred to as “HUN”). Additional figures for HUN and for a second site Schauinsland (SCH, a mountain station in Germany that is usually incorporated in inversions) can be found in the Supplement. We restricted ourselves to these two sites as they can be considered representative of several European stations. To deal with the large number of factorial simulations, 7 transport models × 4 FFCO<sub>2</sub> emission inventories, we reduce the number of time series by displaying means across models and means across emissions, in order to compare the effect of emission pattern differences versus transport model differences on the simulated concentrations.

##### 3.1.1 Seasonal cycle

Figure 3 (top) displays the daily mean FFCO<sub>2</sub> concentrations averaged across all models for each emission inventory at HUN. Like in most inversion set-ups, we selected daytime values (average over 10:00 h to 17:00 h LT), because existing transport models are known to have difficulties in simulating the stability of the nocturnal planetary boundary layer (PBL) (Geels et al., 2007). The simulated time series show large synoptic variations, up to 5 ppm, superimposed on a seasonal cycle of roughly the same size and a trend of few ppm yr<sup>-1</sup> due to the accumulation of emitted FFCO<sub>2</sub>. These features are common to all stations (Fig. S3, Supplement), but the amplitude of the synoptic events and the seasonal cycle varies depending on the location of the site to major industrialized regions. All tracers show a seasonal cycle, which in the case

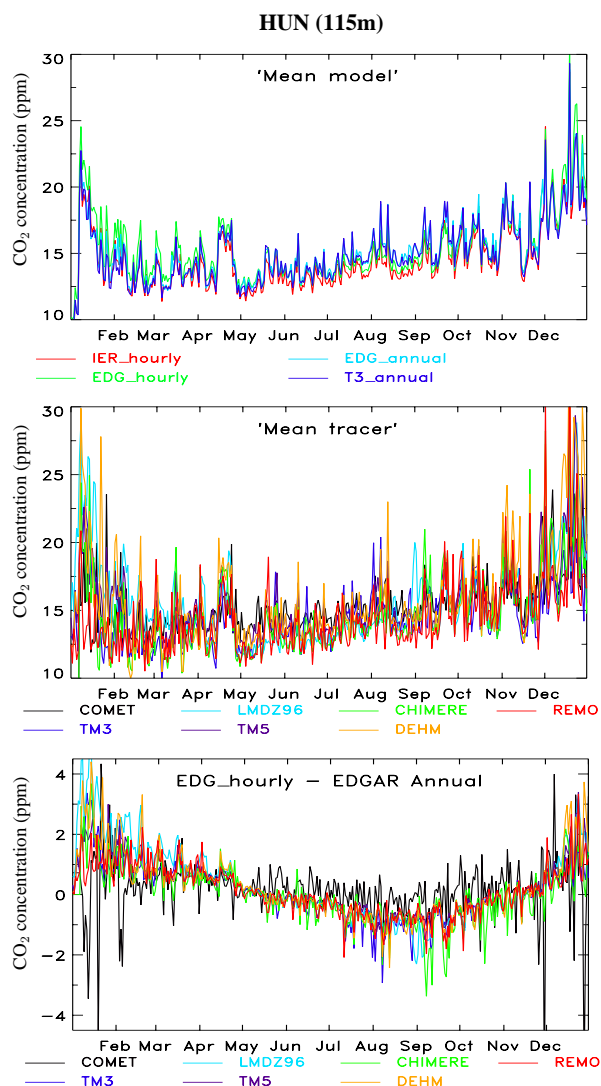
of constant emissions reflects seasonal changes in the atmospheric transport, especially stronger mixing during summer than during winter over Europe. At HUN, the phase and amplitude of the synoptic events are rather similar for all tracers, which indicates that the variation of atmospheric transport is the dominant factor causing day to day variations of FFCO<sub>2</sub> at this site. Note that the observed amplitude of the synoptic CO<sub>2</sub> variations at HUN is roughly two times larger than the one obtained using FFCO<sub>2</sub> only.

Time series for the average across all emission inventories for each transport model (Fig. 3, middle), show similar seasonal and synoptic patterns but with much less agreement for the amplitude and the timing of the synoptic events. On average the amplitude of the synoptic events is larger for the mesoscale models (REMO, DEHM, CHIMERE and COMET) and TM5 (zoomed model) than for the coarse global models (TM3 and LMDZ) and the differences between models are largest in winter. Overall, the transport model spread dominates over the spread induced by the four different fossil fuel emissions. Similar results are found at all European stations (Supplement).

The effect of neglecting temporal variations in fossil fuel emission, is illustrated with the differences in simulated concentration between “EDG\_hourly” and “EDG\_annual” emissions at HUN (Fig. 3 bottom). We observe a marked seasonality for all transport models with positive values in winter (up to 3 ppm) and slightly negative values in summer (up to -1 ppm). This difference combines (i) the seasonality of the “EDG\_hourly” source with (larger emissions in winter due to larger heating sources (~50 %) compared to the constant “EDG\_annual” source; Sect. 2.1), and (ii) the seasonality of the atmospheric vertical mixing with the strongest mixing during summer time. Both effects act in the same direction and the amplitude of the resulting seasonal variation ranges from ±0.5 ppm at remote stations like Pallas in Finland up to ±5 ppm at stations close to industrial areas (i.e., the Cabauw tower in the Netherlands). Note that the covariance between seasonal variations in emissions and transport contributes about 1 ppm to the “seasonal rectifier effect” described for CO<sub>2</sub> by Keeling et al. (1989). The concentration differences between “IER\_hourly” and “EDG\_annual” emissions (not shown) show more complicated temporal patterns, indicating that spatial differences are as important as the effect of neglecting the temporal variations in the emissions.

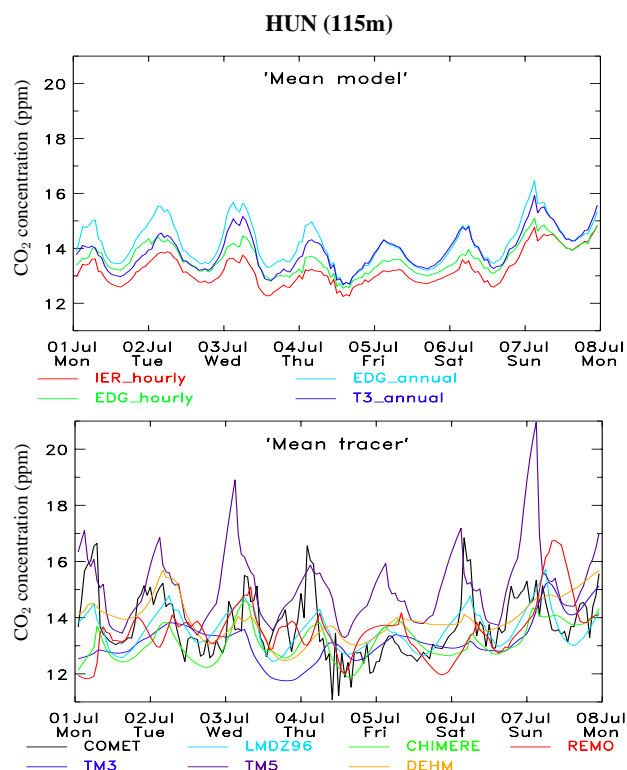
##### 3.1.2 Diurnal cycle

Figure 4 (top) displays the hourly concentrations averaged across all transport models for each tracer at HUN for one week in July. A large diurnal cycle of up to 2 ppm is observed, with larger concentrations during nighttime than during daytime. For the constant emission fields (“T3\_annual” and “EDG\_annual”), the simulated diurnal variations are fully explained by diurnal variations in the PBL height. For the time varying fluxes, increased fossil emissions during



**Fig. 3.** Day-time mean simulated FFCO<sub>2</sub> concentration at the Hungarian tall tower (HUN). Top: mean across all mean simulated FFCO<sub>2</sub> concentration difference at HUN between “EDG\_hourly” and “EDG\_annual” fluxes transport models for each emission inventory; middle: mean across all emission inventory for each transport model; bottom: mean concentration difference between “EDG\_hourly” and “EDGAR\_annual”.

daytime oppose this effect and reduce the diurnal cycle in the simulated summer concentrations by up to 1–2 ppm depending on the station. Similar results are seen for ssuaplen at all stations close to source regions. At remote stations or mountain stations (SCH, Fig. S5, Supplement) the time series display almost no diurnal cycle in summer. In winter, no clear diurnal cycle is observed at HUN and SCH (see Supplement): synoptic events appear to be the dominant source of FFCO<sub>2</sub> short term variability, and both spatial and temporal differences between the emission inventories cause significant concentration differences (up to 4 ppm at HUN).

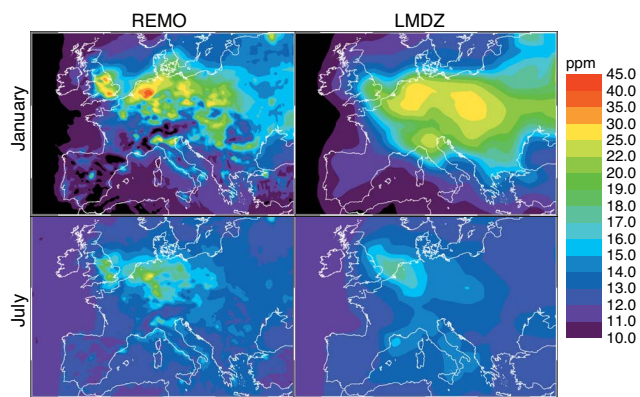


**Fig. 4.** Hourly simulated concentrations at HUN for 1 week in July: top: mean across all transport models for each emission inventory; bottom: mean across all emission inventory for each transport model.

Figure 4 (bottom) shows similar time series but now for the average across all tracers for each transport model. The scatter between the different transport models is much larger at all stations, with model to model differences up to 6 ppm, and complicated temporal patterns. For example, TM5 and partly COMET have a large diurnal cycle in summer with elevated FFCO<sub>2</sub> concentrations at night compared to daytime (amplitude of nearly 5 ppm), unlike TM3 and LMDZ. In winter (see figures in Supplement), no clear coherent variations can be discerned between the models at the daily time scale: synoptic events are clearly visible but their amplitudes strongly differ between models (from 2 ppm in TM3/LMDZ to 10 ppm in the other models).

### 3.2 Surface concentration fields

In order to further analyze the differences induced by transport models and emission inventories, we compare horizontal distributions of monthly mean mixing ratios at the surface for the full European domain sampled at 12:00 local time for January and July. We re-gridded the Eulerian model results for all tracers on a common resolution of 0.1 × 0.1 degree and for a layer between the surface and ~ 150 m (to account for differences in vertical resolution). Figure 5 displays the

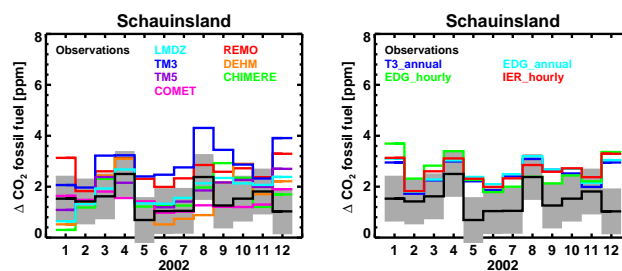


**Fig. 5.** Comparison of fossil fuel CO<sub>2</sub> fields as calculated by the highest (REMO) and the lowest resolution model (LMDZ) included in the inter-comparison, using “IER\_hourly” emission inventory. The numbers represent monthly averaged surface concentrations sampled at 12:00 local time. The surface layer is defined as 0–150 m above the ground.

concentration fields (averaged for the four emission inventories), for January and July, for REMO and LMDZ.

The high resolution model, REMO, resolves the spatial gradients caused by the FFCO<sub>2</sub> emissions much better than the coarser resolution model, LMDZ. Individual cities are resolved (i.e., Madrid, Paris, London) and orography is clearly visible in REMO, while only the main emission regions are visible in LMDZ. In summer, FFCO<sub>2</sub> hot spots are less pronounced due to enhanced vertical mixing during daytime. As a direct consequence, the estimated fluxes from atmospheric inversion will be less sensitive to the spatial resolution of the FFCO<sub>2</sub> emissions in summer. The two models agree on a larger trapping of FFCO<sub>2</sub> in the PBL in winter, but the Eastward shift of the maximum concentration compared to the emission map (Fig. 1) is more pronounced in the coarse resolution model (LMDZ).

Two effects can explain the model differences. First, coarser models represent the FFCO<sub>2</sub> emission at coarser resolution, thereby losing their ability to resolve individual cities. Secondly, higher resolution models better resolve the effects of mountains and land-sea transitions on winds and vertical mixing. To separate the two effects, the TM5 model was run with the emission resolution coarsened to the LMDZ resolution (see Supplement). The use of coarsened FFCO<sub>2</sub> emissions in TM5 already explains some of the differences between TM5 and LMDZ: for instance, the distinct FFCO<sub>2</sub> concentration maxima over the Netherlands and UK is lost when TM5 uses the coarser emissions. In conclusion, the higher spatial resolution of the emissions explains some, but not all of the differences observed between the various models.



**Fig. 6.** Comparison of monthly-integrated fossil fuel CO<sub>2</sub> (relative to Jungfraujoch) at Schauinsland based on <sup>14</sup>CO<sub>2</sub> observations with simulations of all transport models using the “IER\_hourly” emission inventory (left panel) and with simulations of the regional model REMO using the four different emission inventories (right panel). An uncertainty estimate of observed monthly mean fossil fuel CO<sub>2</sub> is included (grey shading).

### 3.3 Comparison with FFCO<sub>2</sub> based on <sup>14</sup>CO<sub>2</sub> observations

Monitoring of fossil fuel CO<sub>2</sub> is in principle possible with radiocarbon (<sup>14</sup>CO<sub>2</sub>) measurements in the PBL over the continent (Levin et al., 2003). Spatial (or temporal) gradients of <sup>14</sup>CO<sub>2</sub> reflect the excess fossil fuel CO<sub>2</sub> that has been released in the air mass, given that fossil fuel CO<sub>2</sub> is free of <sup>14</sup>C. The current European network of stations with quasi-continuous time series of two-weekly or monthly-integrated <sup>14</sup>CO<sub>2</sub> consists of seven stations, located in remote as well as in more polluted areas. Monthly-integrated FFCO<sub>2</sub> concentrations from all model simulations are compared with <sup>14</sup>CO<sub>2</sub>-based fossil fuel CO<sub>2</sub> observations for the year 2002. Figure 6 presents the results for the mountain station Schauinsland (SCH), which is often incorporated in inversions, but additional results for the urban site Heidelberg (HEI) are provided in the Supplement (Fig. S8). Long-term <sup>14</sup>CO<sub>2</sub> measurements exist at both sites and regional fossil fuel CO<sub>2</sub> estimates are derived from these data in Levin et al. (2008). Analogous to the observations, the regional FFCO<sub>2</sub> offset at each station was determined for the simulations using Jungfraujoch high mountain station (Switzerland) as a background reference level.

At SCH the observed mean regional fossil fuel CO<sub>2</sub> component is 1.5 ppm in 2002 and shows no significant seasonal cycle (Fig. 6). The simulation results of all transport models using the “IER\_hourly” emissions show a large spread (Fig. 6, left panel) with annual mean values between 1.4 and 2.9 ppm and root mean square deviations from observations ranging from 0.5 to 1.6 ppm. The differences caused by the emission inventories, on the other hand, are significantly smaller (less than 0.5 ppm) than the deviations from the observations (see left panel of Fig. 6 for REMO model).

A quantitative evaluation of the transport model performances using <sup>14</sup>C-based fossil fuel CO<sub>2</sub> observations is difficult because of compensating effects between transport

model deficiencies, spatial resolution, and emission errors. For instance, LMDZ simulations show relatively good agreement with the <sup>14</sup>C data despite the coarse horizontal and vertical resolution of the model. On the other hand, high resolution models, which are more sensitive to the exact location of emission sources in the vicinity of a station, and which presumably better resolve transport characteristics, tend to deviate more. This is even more obvious at the Heidelberg urban site, where the the REMO simulations are almost twice the <sup>14</sup>C-based fossil fuel CO<sub>2</sub> observation. The spread between all transport model simulations at Heidelberg is also larger than the deviations from the observations. There is also a clear seasonal cycle at this station both in the observations and the model simulations. While the coarse resolution models are generally not very sensitive to differences between FFCO<sub>2</sub> emission inventories, even at a polluted site, the high-resolution models show a clear improvement of the seasonal cycle at HEI if the inventory includes temporal variability. This result opens for further applications of the <sup>14</sup>C approach.

#### 4 Impact on inversion of ecosystem fluxes

In this section, we investigate the significance of the differences between the fossil fuel emission inventories by quantifying their impact on the optimized biosphere fluxes. We compare the inverted ecosystem fluxes (F<sub>bio</sub>) from different inversions for 2001, using the four different fossil fuel emission inventories. We use the “EDG\_annual” constant FFCO<sub>2</sub> inversion as the “reference” case since this represents the commonly applied assumption in global inverse modelling. We then investigate the differences obtained when using the other inventories. We first discuss the annual mean of F<sub>bio</sub> over Europe and then spatial differences (Fig. 7).

##### 4.1 Monthly F<sub>bio</sub> fluxes

For all inversions, the monthly European F<sub>bio</sub> flux shows a large seasonal cycle (as expected) with a maximum carbon uptake in June (see Supplement). The amplitude of the seasonal cycle is roughly 1 GtC month<sup>-1</sup> integrated over Europe (12.10<sup>6</sup> km<sup>2</sup>). Differences between fossil fuel inventories (each case versus the reference) induce F<sub>bio</sub> differences of less than 0.04 GtC month<sup>-1</sup>, which is very small compared to the seasonal cycle and much lower than the estimated Bayesian uncertainty returned by the inversions (in the order of 0.1 GtC month<sup>-1</sup>). Logically, accounting for temporal variations on the fossil fuel emissions (“EDG\_hourly” versus “EDG\_annual”) decreases the estimated biosphere flux in winter and increases it during summer, as a compensation for the seasonality imposed on the fossil fuel emissions (“EDG\_hourly”). If we consider smaller regions, like the “western part” of Europe, the impact of the temporal variations of fossil fuel emissions on the derived monthly F<sub>bio</sub>

fluxes becomes slightly larger when compared to the amplitude of the seasonal cycle but remains below 5%. These results are consistent across the two inverse set ups (LMDZ and TM3).

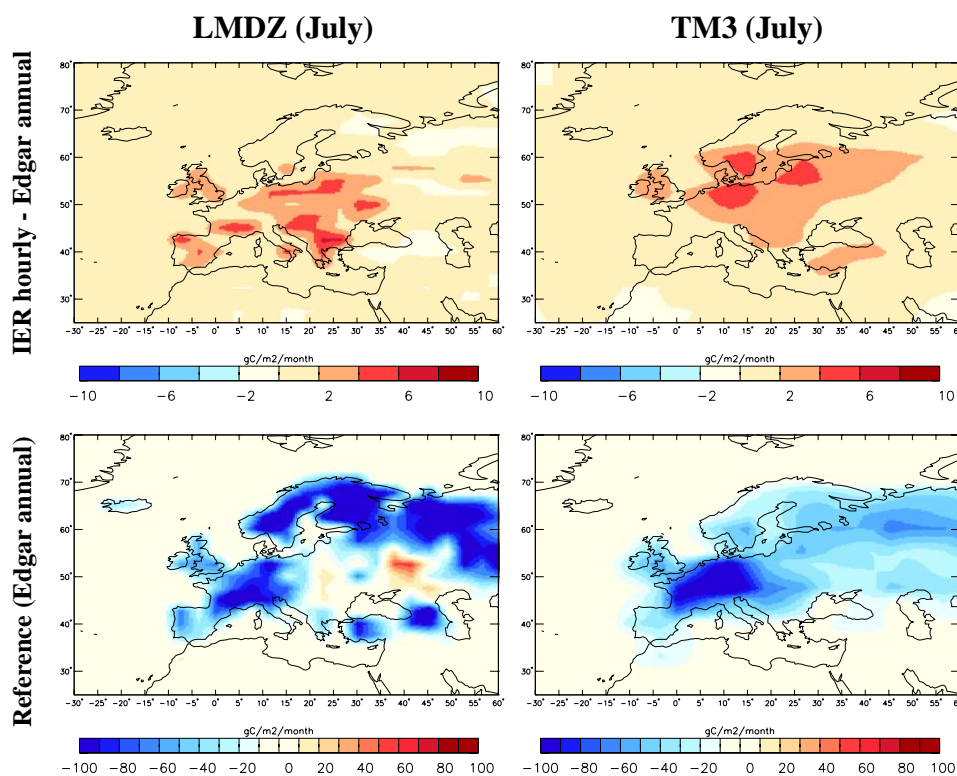
Figure 7 now illustrates for July the spatial distribution of the impact of fossil fuel emission inventories on F<sub>bio</sub>. We compare the results using “EDG\_annual” (reference case, bottom panel) to the differences between using “IER\_hourly” and “EDG\_annual” (top panel). For this particular month, the differences obtained with the “LMDZ” or “TM3” inversions appear to be on the order of 2 to 6 gC m<sup>-2</sup> month<sup>-1</sup> across a large part of Europe (with maximum values close to 10 gC m<sup>-2</sup> month<sup>-1</sup>) while the reference F<sub>bio</sub> shows carbon uptake between 20 and 100 gC m<sup>-2</sup> month<sup>-1</sup> in the same area. On a country scale, a change of fossil fuel emission inventory could thus significantly affect the F<sub>bio</sub> flux: for each country the averaged impact can reach in our case 20% in July. The same calculation obtained between using “EDG\_hourly” and “EDG\_annual” (not shown) show smaller differences in LMDZ but similar differences in TM3. The TM3 result indicates that temporal variations in fossil fuel emissions can induce regionally significant differences in the estimated monthly F<sub>bio</sub>. The smaller difference with LMDZ comes from the fact that this inversion system did not account for the diurnal variations in FFCO<sub>2</sub> emissions (see Sect. 2.3). These F<sub>bio</sub> differences can directly be compared to the differences between the emission maps themselves. The differences between “IER\_hourly” and “EDG\_annual” fossil fuel sources for July (Fig. S1, Supplement) can reach ± 100 gC m<sup>-2</sup> month<sup>-1</sup> over industrial areas (i.e., Western Germany). This result confirms that the inversions tend to smooth these large FFCO<sub>2</sub> emission differences and distribute them spatially over adjacent regions. These results hold for all months and reflect the under-constrained nature of current inversions.

##### 4.2 Annual F<sub>bio</sub> fluxes

Integrated over the year, the differences in estimated F<sub>bio</sub> become much more significant than at the monthly time scale (Table 5). The effect of accounting for temporal variations in fossil fuel emissions (“EDG\_hourly” versus “EDG\_annual”) on the F<sub>bio</sub> estimates is limited to less than 5% (integrated over Europe or its “Western part”), but the effect of switching emission patterns and magnitudes lead to much larger differences. For instance, using the “IER\_hourly” emission inventory changes the mean value of F<sub>bio</sub> by ~0.15 GtC yr<sup>-1</sup> for the whole Europe and by ~0.05 GtC yr<sup>-1</sup> for the Western part. These numbers are slightly smaller than the annual total European differences in fossil fuel emissions themselves (0.23 GtC yr<sup>-1</sup> for Europe, Table 2) because part of the fossil fuel difference is compensated by F<sub>bio</sub> (and F<sub>ocean</sub>) flux adjustments outside Europe (see Fig. 8). The use of the “T3\_annual” emissions induces smaller changes (less than 20% integrated over Europe). Overall, the largest fossil

**Table 5.** Annual inverse estimate of the net biological fluxes (F<sub>bio</sub>, in GtC yr<sup>-1</sup>) based on the Edgar annual fossil fuel CO<sub>2</sub> emissions inventory (including the estimated posterior uncertainty for total Europe  $\pm 1\sigma$ ) and differences in F<sub>bio</sub> resulting from the use of the other three inventories, for the LMDZ and TM3 inversions. (\*): not estimated.

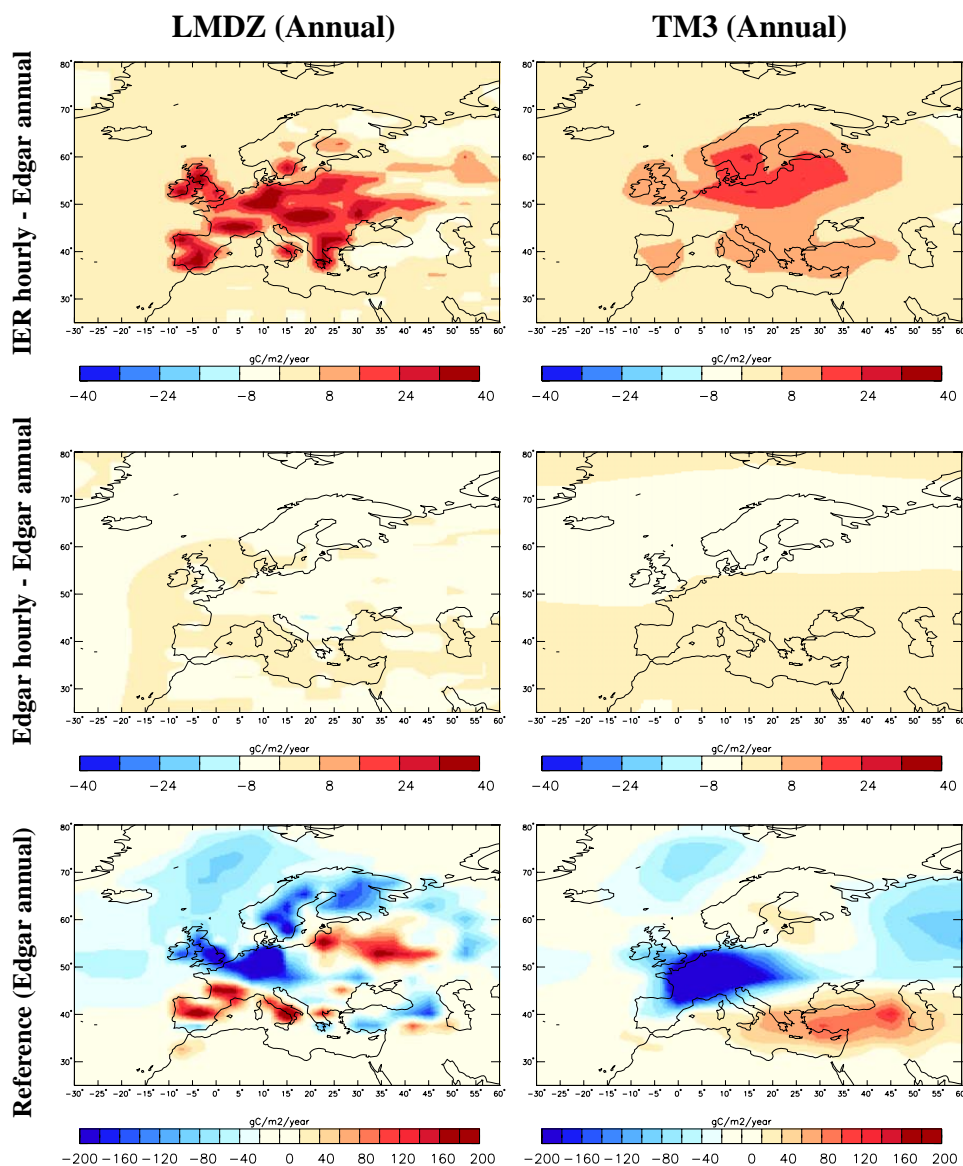
|                  | Flux using<br>Edgar_ann | Flux differences        |                       |                         |
|------------------|-------------------------|-------------------------|-----------------------|-------------------------|
|                  |                         | Edgar_hr<br>– Edgar_ann | IER_hr<br>– Edgar_ann | Transcom<br>– Edgar_ann |
| LMDZ Tot Europe  | -0.35 ( $\pm 0.33$ )    | -0.01                   | 0.14                  | 0.06                    |
| LMDZ West Europe | -0.03 (*)               | -0.00                   | 0.05                  | 0.02                    |
| TM3 Tot Europe   | -0.57 ( $\pm 0.25$ )    | 0.01                    | 0.15                  | 0.11                    |
| TM3 West Europe  | -0.41 (*)               | 0.00                    | 0.03                  | 0.01                    |



**Fig. 7.** July biosphere fluxes estimated with the LMDZ and TM3 inversions (see text for methodology) for a case using “EDG\_annual” fossil fuel emissions (lower panels) and the difference between using “IER\_hourly” and “EDG\_annual” emissions (upper panels).

difference corresponds to 26 % difference and 40 % difference of the annual F<sub>bio</sub> for Europe estimated for that particular year (2001) in the two inversions completed in this study, respectively. The posterior Bayesian uncertainties on F<sub>bio</sub> fluxes estimated by the two inversion systems (only calculated for total Europe, Table 5) indicate that (i) the two different estimates are statistically compatible (i.e. within the 0.3 GtC yr<sup>-1</sup> estimated uncertainty) and (ii) the differences induced by using different fossil fuel inventories are also within 1 sigma of the posterior error. Note that the two inversion-derived annual F<sub>bio</sub> fluxes for Europe are of the same magnitudes than the mean fluxes estimated by Janssens et al. (2003).

If we now consider the spatial distribution of the annual F<sub>bio</sub> fluxes (Fig. 8), larger differences than for July are found. First, the mean flux with the “EDG\_annual” FFCO<sub>2</sub> emission (Fig. 8-bottom) presents much larger regional variations in the LMDZ inversion (than in TM3) that are related to the strong influence of the prior flux distribution in this system (taken from a biogeochemical model, see Sect. 2.3). A detailed analysis of the differences between the two systems is beyond the scope of this paper. The F<sub>bio</sub> differences between using “IER\_hourly” and “EDG\_annual” FFCO<sub>2</sub> emissions are significant, and up to 50 gC m<sup>-2</sup> yr<sup>-1</sup> over specific regions like the Netherlands while the original flux FFCO<sub>2</sub> flux difference is around 250 gC m<sup>-2</sup> yr<sup>-1</sup> (i.e.,



**Fig. 8.** Annual biosphere fluxes estimated with the LMDZ and TM3 inversions (see text for methodology) for a case using “EDG\_annual” fossil fuel emissions (lower panels) and the differences between using “IER\_hourly” and “EDG\_annual” emissions (upper panels) and between using “EDG\_hourly” and “EDG\_annual” emissions (middle panels).

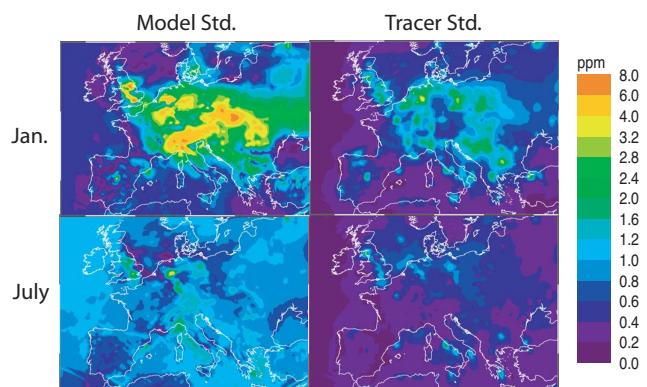
0.01 GtC yr<sup>-1</sup>, Table 2). However, the difference between using “EDG\_hourly” and “EDG\_annual” is proportionally much smaller (unlike for July fluxes), which indicates that the temporal variations in FFCO<sub>2</sub> emissions have a negligible impact on the annual F<sub>bio</sub> flux, at least given the resolution of transport models used in the two inversions.

Overall these sensitivity tests highlight the increasing impact of uncertainties (mainly biases) in fossil fuel emission inventories on the estimated biosphere fluxes from the continental to the regional scale. However, further investigation need to be carried out with inverse systems at higher spatial resolution (at least 0.5 degree) in order to use all the informa-

tion contained in the new high resolution FFCO<sub>2</sub> emission inventories (i.e., “IER\_hourly”). These systems will be more adapted to investigate separately the effect of diurnal, day to day, and seasonal variations in fossil fuel emissions on the estimated F<sub>bio</sub> fluxes.

## 5 Discussion: transport versus FFCO<sub>2</sub> emission errors

We have shown the impact of differences in current fossil fuel emission inventories on modeled FFCO<sub>2</sub> concentrations at European stations and further assessed the impact on



**Fig. 9.** Standard deviation of monthly averaged fossil fuel CO<sub>2</sub> concentrations. Standard deviations are calculated either for the mean FFCO<sub>2</sub> emission inventories across the transport models (left), or for the mean transport model across the FFCO<sub>2</sub> emission inventories (right). Monthly mean averaged surface concentrations are calculated as in Fig. 5.

two state of the art atmospheric inversions. In Sect. 3.1 it was demonstrated that the atmospheric transport model differences have a substantially larger impact on FFCO<sub>2</sub> concentrations than the differences between emission inventories. To investigate this issue further, we calculated the mean concentration field and the corresponding standard deviation (std-dev) when varying either the emissions or the atmospheric transport. The computation involves two steps. In the first one, we compute the std-dev of the concentrations obtained with a given transport-model (FFCO<sub>2</sub>-tracer) and all FFCO<sub>2</sub>-tracers (transport-models). In the second one, we average the different standard deviations to obtain a mean value. We verified that the ratios between the two std-devs (transport vs. emissions, as discussed below) are robust and not sensitive to the small sample sizes (7 transport models and 4 emissions), using the spread of the concentration fields as a metric. The results, analyzed for January and July, at 12:00 local time (Fig. 9) clearly confirms the findings from Sect. 3.1. Standard deviation from the transport models ( $\sigma_{\text{trsp}}$ , left panels) are substantially larger than std-dev from the emissions ( $\sigma_{\text{emis}}$ , right panels), both in January and in July.

Moreover, the std-dev are larger in winter compared to the summer, due to enhanced wintertime trapping of the emissions. Away from large emission sources,  $\sigma_{\text{emis}}$  and  $\sigma_{\text{trsp}}$  are rather small, although the transport models show considerable disagreement over the Atlantic Ocean in summer ( $\sigma_{\text{trsp}} \sim 1$  ppm). This is linked to large differences in PBL mixing and wind fields between the models in summer. Interestingly, the largest variability among the transport models is not always found just over the emission areas, but for instance over the Alps, where  $\sigma_{\text{trsp}}$  reaches up to 8 ppm in winter. Obviously, high resolution models resolve the emission, orography, and the associated transport patterns better than coarse

**Table 6.** Annual averaged standard deviation of Hourly/monthly averaged fossil fuel CO<sub>2</sub> concentrations (ppm) at a few stations for the whole year. Standard deviations were calculated either for the mean CO<sub>2</sub> emission tracer across the transport models, or for the mean transport model across the CO<sub>2</sub> emission tracers.

| station | Transport      | Tracer         |
|---------|----------------|----------------|
|         | Hourly/Monthly | Hourly/Monthly |
| BSC     | 0.99/0.58      | 0.50/0.46      |
| CMN     | 1.07/0.90      | 0.23/0.22      |
| HUN115  | 1.46/0.94      | 0.59/0.51      |
| MHD     | 0.75/0.52      | 0.24/0.22      |
| SCH     | 1.13/0.73      | 0.35/0.29      |
| SAC     | 2.34/1.69      | 1.16/1.07      |

resolution models. Concerning  $\sigma_{\text{emis}}$ , the largest variability appears in areas with large emissions (see Fig. 1). It is indeed at these locations that the emission inventories differ in their spatial and temporal patterns. Depending on the location, the ratio between  $\sigma_{\text{trsp}}$  and  $\sigma_{\text{emis}}$  varies between 2 and 8 (larger model differences) with maximum ratios in January.

If we now consider the station locations where current CO<sub>2</sub> measurements take place, Table 6 compares  $\sigma_{\text{trsp}}$  and  $\sigma_{\text{emis}}$  computed for the whole year using hourly or monthly mean values. For the sites that are currently used in most atmospheric inversion (HUN, Mace Head (MHD), Schauinsland (SCH), Monte Cimone (CMN)) the hourly FFCO<sub>2</sub> spread caused by the transport model differences (between 1 and 2 ppm) appears to be  $\sim 3$  times larger than the spread caused by the emission inventories. Using monthly mean concentrations reduce the difference to a factor 2.5, with  $\sigma_{\text{trsp}}$  and  $\sigma_{\text{emis}}$  around 0.7 ppm and 0.3 ppm, respectively. These numbers indicate that although transport model uncertainties dominate over Europe, differences in annual fossil fuel estimates or neglecting their temporal variations also play a critical role. If we now consider stations that are closer to anthropogenic emission areas, like Black Sea Coast (BSC) and Saclay (SAC) near Paris, the ratio between transport model spread and emission spread becomes on the order of two or even less. The assimilation of observed concentrations at these sites would increase the sensitivity of inverse modeling-derived biosphere fluxes to fossil fuel uncertainties.

## 6 Conclusions

We analyzed the importance of differences between fossil-fuel CO<sub>2</sub> emission inventories and the importance of sub-annual variations in these emissions for tracer transport modelling and regional scale inverse modelling of the European C-cycle, by testing four alternative fossil fuel inventories. Although fossil-fuel emissions are often considered as a “well known” term in the terrestrial carbon balance,

annual differences between emission inventories are typically ~10% at the country level reaching up to 40% for some European countries. These differences increase with decreasing length scale, and correspond to systematic errors due to inconsistent accounting systems (i.e. see for instance Ciais et al. (2010)). Seasonal and diurnal variations in fossil fuel emissions, which are commonly neglected, reach amplitudes close to 40% and 80%, respectively.

The significance of these emission differences for inverse modelling depends on how they relate to other sources of uncertainty. We have investigated their relative importance in comparison with transport model uncertainties, which also addresses the question of whether fossil fuel CO<sub>2</sub> could be used as a diagnostic tracer for testing atmospheric transport or if atmospheric CO<sub>2</sub> inversions can be used to evaluate fossil fuel CO<sub>2</sub> emissions. The impact of the fossil-fuel emission uncertainties on modeled FFCO<sub>2</sub> concentrations at the European stations is on the order of 0.4 ppm (std-dev calculated with the same model but different emissions) while the impact of using several transport models with the same emission is 2–3 times larger, depending on the location and period of the year. We additionally quantified the impact of fossil fuel uncertainties on two state of the art global inversions. Monthly changes in estimated biosphere fluxes at the European scale are small and less than 4% but annual changes become critical, as expected from the differences in annual emission totals. Differences up to 0.15 GtC yr<sup>-1</sup> are of similar magnitude as the total European carbon sink estimated by Janssens et al. (2003). However these impacts and especially the impacts from incorrect specification of fine temporal and spatial emission distributions could potentially be much larger with meso-scale inversion systems.

These results indicate that uncertainties in fossil fuel emission inventories cannot be ignored in applications of inverse modelling of the European C-cycle, and that in order to advance our understanding of the net carbon exchange of the European terrestrial biosphere, the consistency of the European fossil fuel inventories needs substantial improvement. Not only the national and annual scales but also finer spatial and temporal scales need to be improved to aid regional modelling studies. Sub-annual FFCO<sub>2</sub> emission variations lead to significant changes in the seasonal and diurnal concentration variations at the European stations of up to few ppm (~2 ppm at HUN).

We have used emission inventories for one particular year (2000) but there is a need for similar high-resolution inventories for subsequent years to account for changing emissions associated to the economic development and for CO<sub>2</sub> emissions that are dependent on the meteorological conditions such as domestic heating. Within the North American Carbon Project (NACP), the “VULCAN” project (Gurney et al., 2009) is going in this direction with a recent release of a new emission inventory for North America at hourly time scale on a 10 km grid. Several efforts are also ongoing in Europe within EDGAR and IER groups but also within

national agencies. These efforts need to be continued, harmonized, and validated at several levels of the data processing chain. For example, the IER emission inventory used in this study is much more precise for Germany than for other countries, which can lead to systematic FFCO<sub>2</sub> concentration differences between stations and induce critical biases in the inversion results. We also anticipate that country specific information for rush hour traffic, vacation periods, or the type of consumed energy (fossil, renewable, nuclear) will directly impact the temporal emission distributions. The use of higher resolution transport model (such as REMO) will produce larger temporal and spatial concentration gradients (see Sect. 3.2), which will in turn directly impact the retrieved biosphere fluxes.

Finally, monitoring of fossil fuel CO<sub>2</sub> is in principle possible with radiocarbon (<sup>14</sup>CO<sub>2</sub>) measurements in the PBL over the continent (Levin et al., 2003). Currently <sup>14</sup>CO<sub>2</sub> is measured quasi-continuously only at very few stations in Europe and mostly integrated over time periods of one or several weeks. From first comparisons of the model simulations with monthly <sup>14</sup>C-based fossil fuel CO<sub>2</sub> observations it was not yet possible to discriminate between the four FFCO<sub>2</sub> emission inventories. Moreover, the large differences between simulated and observed FFCO<sub>2</sub> call for a further systematic evaluation of the transport characteristics in the models. High-resolution time series of FFCO<sub>2</sub>, which are based on a combination of hourly CO measurements with weekly-integrated <sup>14</sup>CO<sub>2</sub> measurements (Levin and Karstens, 2007), will become available at several stations and will allow a more detailed analysis of diurnal to synoptic scale differences. However, current observation systems do not allow yet to accurately attribute observed CO<sub>2</sub> concentration variations on daily/weekly timescales. Overall, improvements of the transport models are clearly needed before an independent verification of emission inventories through comparisons of simulated and observed fossil fuel CO<sub>2</sub> might become feasible.

**Supplementary material related to this article is available online at:**

**<http://www.atmos-chem-phys.net/11/6607/2011/acp-11-6607-2011-supplement.pdf>**

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