Influence of two atmospheric transport models on inferring sources and sinks of atmospheric CO₂

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ABSTRACT

Atmospheric transport models are a source of uncertainty in the diagnostics of the CO₂ sources and sinks. We propose here a protocol to compare two transport models: a 2-dimensional (2D) and a 3-dimensional (3D) model, based on 3 different experiments that reveal the ability of each model to account for the different components of the atmospheric carbon cycle. The 2D model we use is the one described by Tans et al. and the 3D model is the TM2 model, developed by Heimann et al. First, we conduct the same fossil fuel experiment in both models and show that the 2D model has a stronger inter-hemispheric mixing than the 3D model ($\sim 25\%$), even though the 2D model presents a weaker intra-hemispheric mixing above source regions (experiment A). The influence of year-to-year variability of transport on the latitudinal profile in fossilfuel CO₂ appears to be weak for the 1990s. We then use a set of "all but fossil fuel" fluxes, originally inferred from the 2D model, as an input to the 3D model (experiment B). Even if the main discrepancy on the resulting latitudinal CO₂ concentrations occurs between the 2D and 3D models in the tropics and at the mid-northern latitudes, the differences implied by three longitudinal distributions tested in the 3D model are important and can be explained by a few global transport mechanisms. Finally, we quantify the differences in latitudinal CO2 concentrations observed in experiment B in terms of net carbon fluxes at the surface. To do so, an inverse calculation of the CO₂ fluxes in latitude and time is performed with the 3D model, using as an input a smoothed latitudinal profile of atmospheric measurements for the period 1990-1993 (experiment C = A + B). We find with the 3D model that, averaged on the period 1990–93, the equatorial release is reduced by 40 Tmol yr⁻¹ (roughly 25% of the original source) compared with the initial 2D budget and is shifted southward by roughly 10°. The mid northern latitude sink is also reduced by 80 Tmol yr⁻¹ (roughly 25% of the original sink). In summary, this study shows that the changes in the carbon budget required when moving from the 2D model to this 3D model are important, but they are not radical changes.

1. Introduction

Carbon dioxide, the major anthropogenic greenhouse gas, is continuously exchanged between atmosphere, land and ocean. In addition, fossil fuel burning and changes in land use have introduced anthropogenic perturbations in the natural carbon cycle. The CO₂ growth rate is of 1.5 ppm yr⁻¹ for the 1980's with strong inter-annual variations (Conway et al., 1994; Francey et al., 1995; Keeling, 1995). On average, 50% of the anthropogenic source actually ends up accumulating in the atmospheric reservoir, the other half being absorbed either by the oceans or by land eco-

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systems. The residence time of CO_2 is much greater in the oceans than in land ecosystems, which could imply a different long-time response of the climate system depending on which one is the main reservoir. Thus, relating the spatial distribution of CO_2 as provided by the measurement network to sources and sinks is of great interest in balancing the carbon budget and devising future strategies for CO_2 emissions (IPCC, 1995).

Many studies have presented the inverse process of inferring sources and sinks of CO2 from concentration data. Two major schemes have been used thus far to carry out inverse calculations from concentration fields: the synthesis inversion (Enting et al., 1995, 1993; Heimann and Keeling, 1989) and the mass balance inversion (Enting and Mansbridge, 1991; Tans et al., 1989). The synthesis inversion starts with a first guess of the spatial distribution of each source and uses a transport model to calculate the spatial distribution of the CO₂ mixing ratio corresponding to each source. Then the best linear combination of sources, varying the overall strength but not spatial pattern of individual sources, is estimated so that the calculated concentration field matches the observed concentrations (Enting et al., 1993; Tans et al., 1990). Enting et al. (1993, 1995) described and improved this process by using a Bayesian technique to establish source combinations, which also takes into account independent and prior knowledge of sources with their estimated errors. The limitation of the method is the obligation to define an a priori spatial distribution of each source. In the Bayesian approach the prior "knowledge" might nudge the solution in the right direction, but also in the wrong direction if the prior knowledge is incorrect; the Bayesian inverse method is intentionally biased. In the mass-balance method, the surface concentrations of CO₂ are prescribed in an atmospheric transport model and the sources and sinks are then determined so that the modelled concentration fields at the surface match the observations. Ideally, the surface concentrations are described everywhere based on observations. This method, however, assumes that the CO₂ measurement network is representative of the spatial distribution of the concentrations, while in fact the number of monitoring sites is still insufficient especially in the southern hemisphere to fully determine the inversion and allow a reliable 3D inversion. This is the reason why most of the

studies of this type that have been conducted until now have been based on two-dimensional transport models (Conway et al., 1994; Enting and Mansbridge, 1991; Tans et al., 1989; Enting and Mansbridge, 1989) or on a zonally uniform inversion with 3d transport (Law et al., 1992).

All these studies agree that the north-south concentration gradient implies an important sink in the northern hemisphere. Enting and Mansbridge (1991) include the cycles of methane (CH₄) and carbon monoxide (CO) with no seasonality into the consideration of the north-south gradient, but that does not introduce much change in the above conclusion. However, the nature of this sink, whether it is oceanic or terrestrial, remains somewhat controversial (Heimann and Keeling, 1989; Tans et al., 1990), although recent work, based on δ^{13} C ratios, suggests, amongst other things, that the Northern Hemisphere land biosphere did absorb large quantities of carbon over the past few years (Francey et al., 1995; Keeling, 1995; Ciais et al., 1995a,b).

Nevertheless, all such diagnostics of the global carbon budget rely to model the CO2 concentrations in the atmosphere, which raises the question of how sensitive the derived CO₂ budget is to the prescribed atmospheric transport. Apart from model validation with inert tracers like ²²²Radon and 85Krypton the only method we can use to tackle this problem is model comparison. In a first attempt to do so, (Rayner and Law, 1995, Transcom I) have run 12 transport models using the same sets of CO₂ fluxes, and compared the different modelled concentration fields. This comparison shows that atmospheric transport models predict very different concentration fields starting from the same prescribed source. In the present study, we compare in detail the transport patterns of two atmospheric models and the implication of the transport differences on the carbon budget of the 1990s. These models are both widely used in modelling atmospheric CO₂ (see Table 1). The first model is a bidimensional model (latitude-vertical) first developed by Plumb and Mahlman (1987) and further adapted by Tans et al. (1989) at the Climate Monitoring and Diagnostics Laboratory of the National Oceanic and Atmospheric Administration (NOAA/CMDL). It is used to determine sources and sinks of CO2 from the measurements of the NOAA/CMDL network, through an "inverse" calculation. Later modifications were made to include other trace gas (Ciais et al., 1995; Conway et al., 1994). In this model, the atmospheric transport is based on a Climatology of monthly air movements. The second model is an off-line 3D model developed by Heimann and Keeling (1989) at the Max-Planck-Institute fur Meteorologie of Hamburg, which has been extensively used to analyse the global CO₂ budget (Heimann and Keeling, 1989; Heimann et al., 1989; Keeling et al., 1989; Ramonet, 1994). It is an off-line transport model based on observed meteorological parameters with a 12 hour time step. Neither model includes a dynamic and explicit formulation of the planet boundary layer (PBL).

We present here a protocol to compare these models, based on three experiments (A, B, C) that make it possible to point out to the specific abilities of each model in simulating the mixing of atmospheric CO_2 .

Experiment A. We evaluate how the two models transport CO₂ emitted by the same source of fossil fuel emissions. This provides a simple basis of comparison which is directly relevant to the CO₂ problem and allows us to fully analyse transport patterns for the two models.

Experiment B. We use a CO₂ scenario including terrestrial and oceanic fluxes. This set of "all but fossil-fuel" CO₂ sources and sinks, which includes the full seasonal cycle, was inferred from the atmospheric NOAA/CMDL observations by Conway et al. (1994) with the 2d model we use here, run in an inverse mode. This 2D inverse method gives a set of fluxes containing all the implied processes but does not allow to fully separate them. For example, terrestrial part of this set includes photosynthetic and respiration fluxes as well as the release by biomass burning, but we cannot study each component separately. We perform different simulations with the 3D model, using different longitudinal distributions of sources and sinks. Comparing these runs with each other allows us to evaluate and discuss the impact of the longitudinal distribution of the sources and sinks on the zonal profile of CO₂. We also compare these runs with the results of the 2D model.

Experiment C. We deal with the full CO_2 budget in the atmosphere using a complete CO_2 scenario which includes fossil emissions as well as terrestrial and oceanic uptake (C=A+B). Specifically, we perform a mass balance inversion of the CO_2 fluxes in latitude and time with the 3D model using as an input the smoothed latitudinal profile of atmospheric measurements for the period 1990–1993.

After a brief description of the two models involved in this study (Section 2), the results of the fossil fuel simulation are analysed in terms of transport discrepancy between the two models (Section 3). Then, we deal with the other part of the atmospheric carbon cycle, an "all but fossilfuel" scenario (Section 4), before performing an inverse calculation of the complete latitudinal profile of CO₂ (section 5). Finally, we discuss the implications of several modelling uncertainties for the balance of the carbon budget.

2. Description of the two models

2.1. 2D model (PMT model)

This model initially developed by Plumb and Mahlman (1987) will be hereafter referred to as the PMT model. The same transport fields have also been used by Enting and Mansbridge (1989). The atmosphere is represented by 10 vertical pressure levels and 20 latitudinal bands of equal area (Table 1), with a current time step of 6 h. There are monthly fields of advective motion (stream function) and a spatially varying diffusion tensor, which describes the effects of eddy mixing via a flux-gradient parametrization. Together, they describe the average monthly and zonal mean transport of the GFDL general circulation model (Mahlman and Moxim, 1978), as determined by simulating two artificial tracers (Plumb and Mahlman, 1987). The lower vertical diffusivities between 1000 mb and 800 mb have been increased by a factor of 2 compared to the initial version of the PMT model as proposed by Tans et al. (1989), which has the effect to improve the simulated seasonal cycle of CO2 in the vertical dimension. In addition, a convective mixing was explicitly added later to the vertical transport at each time step (Brost and Heimann, 1991).

Table 1. Main cl	haracteristics o	f the F	PMT and t	he TM2 model

Characteristics	PMT model (2D)	TM2 model (3D) 7.5° \times 7.5° (48 \times 25 grid points)		
horizontal resolution	20 latitudinal sinus bands (same area)			
vertical resolution	10 equidistant sigma layers	9 sigma layers		
winds	climatology	ECMWF observed winds		
advection	advective/diffusive scheme (Plumb and Mahlman, 1987)	slope scheme (Russel and Lerner, 1981)		
convection	adjustment (Brost and Heimann, 1991)	convective clouds from (Tiedtke, 1989)		
vertical diffusion	advective/diffusive scheme (Plumb and Mahlman, 1987)	stability dependent diffusion (Louis, 1979)		
winds timestep	monthly mean (interpolated)	12 h		
computing timestep	6 h	3 h		

2.2. 3D model (TM2 model)

Originally developed at NASA-GISS by Russel and Lerner (1981), this model has been further revised by Heimann et al. (1989-TM1, 1995-TM2). The version of the TM2 model used in this study has 9 vertical levels in sigma coordinates that extend from the surface to 10 mb. The horizontal resolution is of 7.5° by 7.5° (Table 1) with a time step of 3 h. It is an off-line transport model based on meteorological fields analysed by the European Center for Medium Weather Forecast (ECMWF) every 12 h. Both shallow and deep convective mixing together with vertical diffusion are calculated at each time step (Louis, 1979; Tiedtke, 1989).

2.3. Main differences

There are important specific differences between the two models. First, in a 2D model, the zonal mixing of air masses is assumed to be fast compared to meridional mixing. This is the main justification for two-dimensional modelling of atmospheric transport. Such an assumption is not necessary in the TM2 model where the longitudinal air flow is explicitly accounted for. Secondly, the PMT model has climatological wind fields whereas TM2 has analysed ones, based on meteorological observations. As a consequence, the PMT model has no inter-annual differences in the atmospheric transport. Thirdly, both models differ in their advection schemes. The PMT model diffusive transport coefficients are 4-element ten-

sors, of which the anti symmetric part contributes to the effective advective transport, and the symmetric part represents purely diffusive mixing (Plumb and Mahlman, 1987). The TM2 model uses only the horizontal advection fields from the ECMWF meteorological analysis, with the vertical advection being calculated from mass conservation in each grid box. Last, the 2D-model has a simple parametrisation of convective mixing (Brost and Heimann, 1991) whereas the TM2 model includes a more realistic deep and shallow convection based on clouds mass flux scheme (Tiedtke, 1989), and vertical diffusion (Louis, 1979)

2.4. Validation of the two models with inert tracers

The vertical transport of the PMT model has been tested with the attenuation of the seasonal cycle of CO2 and the TM2 model has been tested using the ²²²Rn measurements compiled by Liu et al. (1984). The vertical diffusivities of the PMT model were also compared to those derived by Liu et al. (1984). In the PMT model, Tans et al. (1989) observed a better agreement with the observations when the vertical diffusivities in the lowest two model layers were doubled. In the TM2 model, Ramonet (1994) found that the vertical attenuation of ²²²Rn concentrations is rather well represented in summer but that the model overestimates the observations above 6 km in winter. Using detailed airborne measurements made in the campaign TROPOZ II, Ramonet et al. (1996) have also shown that TM2 reproduced most of the observed synoptic variations in ²²²Rn, although it overestimates the concentrations in the mid-to-high troposphere. This discrepancy indicates a too vigorous vertical mixing in the TM2 model. This tendency is confirmed by a recent inter-comparison of several cumulus parametrizations in chemical transport models (Mahowald et al., 1995).

The large-scale transport in the two models has been tested against 85Kr measurements (Heimann and Keeling, 1989; Tans et al., 1989). Generally, good agreement with observations was found. For the PMT model, the inter-hemispheric exchange time (i.e. the difference of the 85Kr inventory in both hemispheres divided by the flux across the equator) is very close to the value of 1.1 year obtained by Jacob et al. (1987) with the GISS transport model (Prather et al., 1987). For the TM2 model, no 85Kr calculation was published, but the figure is close to TM1 (Ramonet, unpublished results) with a value of 1.3 years, suggesting that the mixing between both hemispheres is slightly faster in the real world than as represented by the model (Heimann and Keeling, 1989). Note that a tracer like 85Kr is not analogous to CO₂ because it is emitted only at a few specific locations with no seasonality, although it gives a good idea of inter-hemispheric mixing in atmospheric models. However, 85Kr may be a close match to the fossil-fuel CO₂ tracer for which we calculate the inter-hemispheric exchange times in Section 3.

3. Experiment A, fossil fuel simulation

We run both models with the same fossil fuel source of CO_2 prescribed by Tans et al. (1989). In the TM2 model, we distribute this zonal source in longitude according to the distribution of the fossil fuel emissions calculated by Marland et al. (1985). The total magnitude of this source is 508 Tmol yr⁻¹ (6.09 GtC yr⁻¹-1 Tmol= 10^{12} mol=0.012 GtC). We have run both models during four years, following the protocol of Transcom I (Rayner and Law, 1995). The first three years are a spin-up and the results are presented for the fourth year of simulation. For TM2, we repeat identically the 1990 meteorological winds and convection during the four years of simulation.

Fig. 1 presents the zonal annual surface concen-

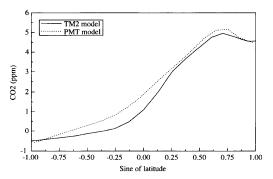


Fig. 1. Zonal annual mean surface concentration in fossil CO₂ (experiment A) for the fourth year of simulation. The PMT model (dashed line) is compared to the TM2 model (solid line). Curves are relative to the global mean mixing ratio for January which explains negative concentrations.

tration in fossil CO₂ as calculated in both models. The concentrations are calculated relative to the global mean atmospheric mixing ratio found by the models in January of the 4th year of simulation. This reference is identical in both models. Mixing ratios in the PMT model and the TM2 model are interpolated at the same 950 mb pressure level. North of 30°N, the two models transport fossil CO₂ in a relative similar manner at the surface. Across the equator, the TM2 model produces a steeper decline in fossil CO₂ than the PMT model, indicating that at the surface level, the north/south mixing in the inter-tropical zone is weaker in TM2. In the southern extra-tropics and at high southern latitudes, the opposite behaviour is observed since the TM2 model appears to mix fossil CO₂ more vigorously than the PMT model.

To fully compare the large-scale meridional transport in the two models, we must consider all the vertical layers. It is common practice to use vertical column averages of the north to south fluxes to estimate the strength of the transport. However, in this steady state experiment, where sources are in equilibrium, the model fluxes across any vertical zonal column are identical in both models. The resulting latitudinal profile is the profile that is necessary to produce such a flux for both models. Thus, we have calculated in Table 2 the interhemispheric exchange time defined as the north minus south difference in mean concentration divided by the flux across the equator. Table 2

Table 2. Inter-hemispheric exchange time for both models (years), defined as the difference between the concentration means in the two hemispheres (global) or the concentration means at surface in the two hemispheres (surface), divided by the concentration flux across the equator

Model	Global	Surface		
TM2 model	1.24	1.56		
PMT model	0.97	1.36		

shows the exchange times both for the global atmosphere and also for the surface level only. Table 2 indicates that the PMT model has a faster north/south mixing than TM2 not only at the surface level ($\sim +15\%$) but also averaged through the vertical ($\sim +25\%$). Fig. 2a compares the modelled concentration fields in both hemispheres. The PMT model exhibits a smaller global north to south difference than the TM2 model (~20% and 40% smaller respectively at 500 mb and 200 mb). This difference is only 15% at the surface (Fig. 1) and is fully consistent with the differences in 85Kr exchange times (section 2). Fig. 2b, c display the zonal annual concentration in fossil CO₂ for both models. At mid-northern latitudes, above the main source region, CO2 emitted at the surface penetrates higher in altitude in TM2 than in PMT, resulting in a smaller gradient across the tropopause for TM2. This means a stronger intrahemispheric mixing for TM2 than for the PMT model, above main source region. We miss here a specific tracer of the intra-hemispheric exchange to quantify more precisely this effect. At the equator, the southward flow of CO2 is detected for TM2 mostly in the mid-to-high troposphere (σ 0.2 to 0.6), whereas the PMT model instead exhibits a tongue of northern hemisphere air flowing to the south at sigma ~ 0.2 . Note also that, across the equator, the isolines are closer to one another for TM2 than for the PMT model. This means that TM2 also exhibits the "braking" effect that was seen at the surface (Fig. 1) along the whole vertical. These differences in transport patterns are consistent with the remarks made previously about horizontal and vertical validation of the two models (Heimann and Keeling, 1989; Tans et al., 1989).

Apart from the annual average transport pat-

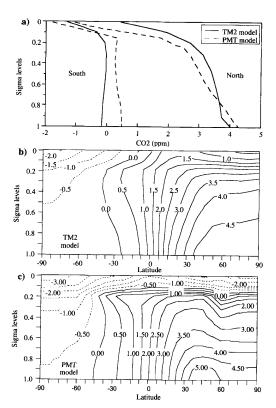


Fig. 2. Vertically intagrated annual mean concentration in fossil CO_2 for the fourth year of simulation (in ppm). (a) Annual northern and southern hemisphere mean concentration for the PMT model (dashed line) and for TM2 (solid line). The zonal annual mean concentration for the TM2 model (b) is also compared to the one for the PMT model (c). All the curves are relative to the global mean mixing ratio for January, which explains negative concentrations.

terns, we examined the variations in the north/south CO₂ profile due to inter-annual changes in the ECMWF fields used in TM2. Fig. 3 plots the annual zonal mean concentrations in fossil CO₂ at the surface obtained with the same fossil fuel source but with specific ECMWF fields from 1990 to 1994. We find that the maximum difference over the five-year period does not exceed 0.2 ppm and is maximum over mid-north latitude source region. This difference maybe either due to climate variations or to ECMWF analysis of meteorological fields (ECMWF analysis model has changed in 1993). We have also performed a sensitivity test to check the respective influence of

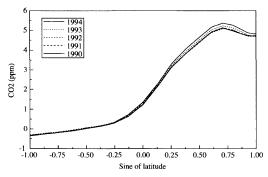


Fig. 3. Influence of different years of the ECMWF meteorological fields on the modelled zonal annual surface mean concentration in fossil CO₂ (experiment A). The model used is the TM2 model. Input fluxes are fossil fuel emissions from Tans et al. (1989), distributed in longitude according to Marland et al. (1985). All curves are relative to the global mean mixing ratio for January of the corresponding year.

winds and convection on these variations. Roughly, we keep either convection fields or wind fields constant during the simulation to evaluate the respective part of each field in the differences of latitudinal profiles. Averaged over the 5-year period, it appears that this influence for both winds and convection is of the same order.

Consequently, the influence of inter-annual variability of meteorological ECMWF fields on the annual mean CO₂ latitudinal profile is weak compared to the differences between the two models.

4. Experiment B, "All but fossil-fuel" simulation

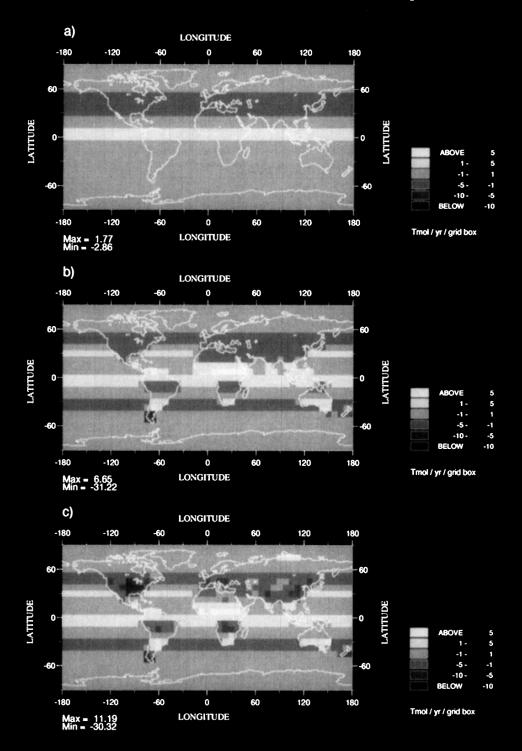
The goal of this section is to evaluate the influence of the longitudinal distribution of CO₂ sources and sinks in the 3D model, using an "all but fossil-fuel" scenario which includes both terrestrial and oceanic fluxes with their respective seasonal cycles.

We have used the CO₂ sources and sinks inferred from the atmospheric NOAA-CMDL observations, using the PMT model run in an

inverse mode. A detailed presentation of the NOAA-CMDL CO₂ measurements is given in Conway et al. 1994. The inverse calculation of the fluxes from flasks measurements was developed by Tans et al. (1989), and has been further used by Conway et al. (1994) and by Ciais et al. (1995). Briefly, the individual time series of flask data at each site of measurement is first smoothed in the time domain using the curve fitting and data extrapolation method detailed in Masarie and Tans (1995). Gaps in the data are filled by using stable characteristics of nearby sites. A weekly latitudinal fit of the smoothed time series at each site is then constructed, in which a greater weight is given to sites with a higher number of sample pairs. We subtract the well known fossil fuel emissions from the inferred surface fluxes to obtain a 2D-set of "all fluxes excepting fossil fuel" (terrestrial biosphere + ocean). This zonal source is plotted on Fig. 4a: the equatorial release and the midnorthern latitude sink are clearly identified, the others latitudinal regions being small sources or sinks.

We apply these zonal fluxes to the TM2 transport for four consecutive years, using a three year spin up, and archiving the simulated CO₂ concentrations in the subsequent four years. These years correspond to the period 1990-93 period for 1/the annual meteorological fields and 2/the CO₂ zonal fluxes deduced from the NOAA/CMDL observations. Running zonal CO₂ fluxes in a 3D model raises the problem of the longitudinal distribution. Because the meridional transport across the Equator is not uniform in longitude (Barry and Chorley, 1987), the simulated CO₂ latitudinal profiles in TM2 should depend strongly upon the sources and sinks positions in longitude. In order to examine such interactions between fluxes and southward transport, we have performed 3 simulations. In run B1, we distribute the zonal fluxes inferred from the 2D inversion evenly in longitude (Fig. 4a). In run B2 we use two uniform distributions in longitude, one for land and one for the oceans (Fig. 4b). The separation of the terrestrial

Fig. 4. Annual mean flux scenarios for the 3d simulations (year 1992): in run B1 (a) we distribute the zonal fluxes inferred from the 2D inversion evenly in longitude. In run B2 (b) we also use a uniform distribution in longitude but make a distinction between ocean and land fluxes based on independent information brought by δ^{13} C measurements. In run B3 (c), we distribute terrestrial fluxes proportionally to the annual mean NPP from Ruimy et al. (1994), keeping zonal oceanic fluxes.



fluxes is done according to a double deconvolution of δ^{13} C measurements by Ciais et al. (1995b). In run B3, we distribute terrestrial fluxes proportionally to the annual mean NPP from Ruimy et al. (1994), keeping the oceanic fluxes zonal (Fig. 4c). This represents a step towards a more realistic geographical distribution of the CO₂ fluxes.

Fig. 5a plots the zonal mean surface CO₂ profile obtained in the PMT model and in the three TM2 runs. All runs B1, B2 and B3 exhibit zonal concentration fields relatively close to each other but which differ significantly from the PMT model run. The largest difference between TM2 and PMT occurs at mid-northern latitudes (0.7 ppm between PMT and run B1 and 0.5 ppm between PMT and runs B2/B3). Another significant discrepancy can be observed in the tropics where the 3D runs are very close to each other but differ from the 2D run by 0.5 ppm around the equator. This behaviour corresponds to a weaker inter-tropical hori-

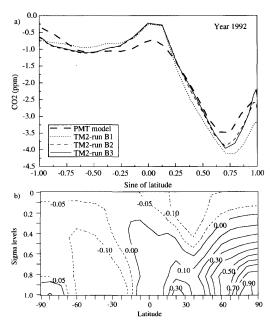


Fig. 5. Zonal annual mean concentration of CO₂ for the different "all but fossil-fuel" simulations (year 1992). a) Latitudinal surface concentrations in ppm. We compare the PMT model (bold dashed line) with TM2-run B1 (dashed line), TM2-run B2 (dotted line) and TM2-run B3 (solid line). b) Vertically integrated differences between TM2-runB3 and TM2-run B1 (ppm). All the curves are relative to the global mean mixing ratio for January 1992.

zontal mixing in TM2, and a higher northern midlatitude convection compared to the PMT model, as underscored in section 3. Consequently, matching the observed CO₂ latitudinal profile with the TM2 transport would require a smaller sink at mid-northern latitudes and a smaller source in the tropics than those deduced by Conway et al. (1994) and Ciais et al. (1995b) with the PMT model. We will quantify those concentrations differences in term of CO₂ fluxes in Section 5.

Furthermore, the impact of longitudinal distribution of the sources and sinks is not negligible. Run B2 and B3 are close to each other but they differ significantly from run B1 in extra-tropical regions. This suggests that the ocean versus continent partitioning has a greater effect on the interhemispheric CO₂ latitudinal profile than the partitioning as a function of NPP within the continents as it implies greatest differences in the initial fluxes (see Fig. 5). So, we restrict our discussion now to runs B1 and B3. Some possible mechanisms can be found to explain the differences between runs B1 and B3. At mid-northern latitudes, biospheric uptake has a strong seasonality, with a maximum in summer when vertical mixing over the continents is strongest. Moreover, convection is much greater above land areas than above the oceans at these latitudes. Therefore, distributing the midnorthern sink mainly on the continents (run B3) induces a stronger vertical dilution of this sink and consequently reduces the depletion of surface concentrations compared to zonal run B1. To illustrate this point, Fig. 5b show the vertical section of the zonal annual mean difference between run B3 and run B1. The surface and the low troposphere in mid and high northern latitudes are less depleted in "all but fossil fuel" CO₂ in run B3 than in run B1 (strong positive anomaly) due to the vertical dilution by convection. Consequently, a small negative anomaly is found in the rest of the atmosphere. In the tropics, a second effect occurs which could compensate the first one. In fact, the strong inter-tropical source (see Fig. 4) is located more over equatorial Africa in run B3, instead of being distributed on both oceans and continents for the run B1. Now, if we look closely at the position of the ITCZ in the tropics (Barry and Chorley, 1987), we find that for a large part of the year, especially in boreal summer, the equatorial Africa is at the north of the equator trough. In contrast, the ITCZ is more stable over oceans, and corresponds to a preferential injection of equatorial fluxes into the southern hemisphere. Thus, more tracer is kept in the northern tropics in run B3 than in run B1; this mass is vertically diluted by strong equatorial Africa convection and transport northward by Hadley cell. Finally, by distributing the equatorial source in longitude we reduce the efficiency of inter-hemispheric exchange in TM2. This reduction can be observed in Fig. 5a where one may notice a flip-flop effect at the surface between the two hemispheres: values for run B3 are higher than those for run B1 in the northern hemisphere but lower in the southern hemisphere. This effect is weak but qualitatively significant.

5. Experiment C, full CO₂ cycle experiment

The goal of this section is to evaluate the influence of modelled transport on the carbon budget using a complete CO₂ scenario which includes fossil emissions as well as terrestrial and oceanic fluxes.

We use the same ocean and land CO₂ sources and sinks as in experiment B3, adding fossil fuel emissions prescribed by Tans et al. (1989), distributed in longitude over the continents (experiment A) and actualised for the years 1990–1993 (Conway et al., 1994). We run this complete CO₂ scenario with TM2 (run C=run B3+run A). We also run the corresponding zonal scenario, inferred from the PMT inverse model, in the forward version of the same PMT model to verify that we obtain the observed latitudinal profile from which we originally started.

Fig. 6 plots the zonal annual surface concentration of CO₂ obtained in the PMT model (observed meridional profile) and in the TM2 model (run C), for the year 1992. Fig. 6 thus combines the differences outlined in Fig. 1 and Fig. 5. In comparing Fig. 6 to Fig. 5, we find differences between the 2d and 3d model in the northern hemisphere more or less as expected from the discussion above. However, the discrepancy between the TM2 and PMT model in the tropics is not so apparent in Fig. 6. The fact that TM2 keeps more tracer emitted locally in the tropics (see Fig. 5) is partially compensated by a weaker advection of fossil CO₂ coming from northern hemisphere at the surface (see Fig. 1). It is important to translate

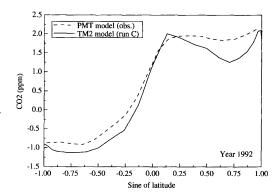


Fig. 6. Zonal annual surface mean concentration of CO₂ for the PMT model and the TM2 model (year 1992): we compare observations (dashed line) to the TM2-run C (solid line). Both curves are referred to the global mean mixing ratio for January 1992.

such differences in the modelled CO₂ concentrations between the TM2 and the PMT model in terms of net surface fluxes. In other words we must estimate what zonal CO₂ fluxes are needed in the TM2 model to match the observed zonally averaged latitudinal profile. We describe below an iterative mass balance inversion of the smoothed observed CO₂ latitudinal profile using the TM2 winds. The question is to determine what zonal sources in the 3D model give the same CO₂ zonal mean as the original 2D profile.

The inverse calculation is constrained by weekly zonal meridional profiles in the CO_2 mixing ratio C_{2d} (λ,t), where λ represents the different latitude bands and t the weekly interval. For every TM2 model time step (3 h), we calculate the instantaneous zonal profile C_{3d} (λ,t) in the 3D model, from which we subtract C_{2d} (λ,t) to obtain a flux correction factor β defined as:

$$\beta = (C_{3d})(\lambda, t) - C_{2d}(\lambda, t) \times f \times \Gamma_{m}$$

where f is the conversion factor between ppm and GtC (2.122 GtC.ppm⁻¹) and $\Gamma_{\rm m}$ is the air mass contained in the latitude band λ divided by the total mass of the atmosphere. The value of β in each latitude band λ is distributed evenly in longitude over the TM2 model grid in order to correct the source field and to yield the required atmospheric concentrations $C_{\rm 2d}$ (λ ,t). This flux correction starts in the first year of spin-up to ensure a steady state regime after the fourth year.

Numerically, our flux correction proved to be unstable when the initial value of β was too large, roughly of the order of the source to be corrected. To avoid this problem, β is attenuated during spin-up, by 50% on the 1st year of correction and by 25% on the 2nd year. The corrected fluxes are saved at each time step for other possible iterations. In order to minimise the difference between the inverted concentrations and the observed "target" concentration fields, we iterate this process several times with the sources as in run C.

Using this methodology, we obtain a zonal carbon budget with TM2 which is compared, for the year 1992, to the sources inferred by Conway et al. (1994) with the PMT model (Fig. 7). Table 3 provides the resulting fluxes averaged over wide latitude bands for 1990–1993. In the northern hemisphere, Fig. 7 shows that the position in latitude of the sources and sinks is approximately the same in the two models. However, its strength is different. North of 65°N, the initial source is reduced by 35 Tmol yr⁻¹ and becomes a small sink (15 Tmol yr⁻¹). The CO₂ uptake at midnorthern latitude is 80 Tmol yr⁻¹ smaller as given by TM2 than by the PMT model for period 1990–93. This difference almost reaches 100 Tmol

yr⁻¹ in 1992. The equatorial source is also reduced by 40 Tmol yr⁻¹ over the period 1990-93 when inferred by TM2. In addition, TM2 shifts the equatorial source southward by roughly 10° (from 10°N to 0°) compared to PMT. Since TM2 has a weaker surface transport across the equator (Fig. 1), the inverse calculation must inject CO₂ further to the south to match the observations in this latitude band. The CO2 uptake at mid northern latitudes and the release in the northern tropics as inferred by mass balance calculations are correlated because their relative strength depends on the intensity of the mixing within the Northern Hemisphere. Thus, Fig. 7 suggests, as Fig. 2, that the PMT model has a weaker intra-hemispheric mixing than TM2, although it has a stronger transport across the equator. In the southern extra-tropics, the fluxes derived from both models do not differ by more than 15 Tmol yr $^{-1}$. Finally, note that running experiment C with (B1+A)instead of (B3+A) leads to differences in the inferred carbon budget lower than 15 Tmol yr⁻¹. The differences observed in experiment B on the latitudinal profiles and due to the longitudinal distribution of fluxes are smoothed by the zonal inversion performed here.

Table 3. Zonal carbon budget inferred from the TM2 model for the period 1990-1993

Year 1990	90S-20S	20S-0	0-20N	20N-65N	65N-90N	GLB	ACC
PMT model	-120	40	120	-360	35	-285	225
TM2 (run C)	-130	90	35	-270	-10	-285	225
Year 1991							
PMT model	-125	-25	160	-365	40	-315	200
TM2 (run C)	-135	40	60	-280	< 5	-315	200
Year 1992							
PMT model	-125	-25	160	-410	15	-385	125
TM2 (run C)	-120	10	60	-315	-20	-385	125
Year 1993							
PMT model	-110	< 5	120	-350	< 5	-340	175
TM2 (run C)	-115	45	50	-310	-20	-340	175

GLB represents the global natural sink (Tmol yr^{-1}) and ACC the annual mean accumulation in the atmosphere. Fossil fuel emissions are, respectively, of 508, 516, 508 and 513 Tmol yr^{-1} (6.09, 6.19, 6.09 and 6.15 GtC yr^{-1} , respectively) for the years 1990, 1991, 1992 and 1993. Main differences are in bold. We do not write figures smaller than 5 Tmol yr^{-1} .

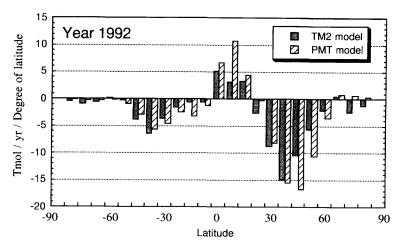


Fig. 7. Corrected CO₂surface fluxes to match observed zonal concentration with the TM2 model (Tmol yr⁻¹ degree⁻¹). Annual means for year 1992. Fossil fuel emissions have been subtracted. Dashed bars represent the initial CO₂ fluxes found by Conway et al. (1994). Plain bars are the result of a zonal mass balance inversion performed in this study with the TM2 model.

6. Discussion

This work shows that there are important changes in the global carbon budget required when moving from one atmospheric transport model (PMT) to another (TM2). This result is very important as it implies that the uncertainty due to modelled transport is a major uncertainty for the inversion studies as well as the scarcity of the measurement network. Future 3d inversions should take into account this result. Particularly, inter calibrations between transport models must be pursued to establish more rigorously the mixing behaviour of different models in the vertical dimension. Even more importantly, more data are needed in the vertical to constrain the models better. Dealing almost exclusively with observed surface mixing ratios makes the inferred carbon budget too model-dependent. As an example, if we only refer to the surface layer, we have compared two relatively similar models when looking at the wide range of variations between Transcom models (Rayner and Law, 1995). But, by analysing their behaviour on the vertical, we showed that they lead to different structures of CO₂ concentrations and thus to different carbon budget.

Recently, another cause of uncertainty in the modelled transport has been raised by Denning et al. (1995). They show that the simulated north/south CO₂ latitudinal profile due to sea-

sonal exchange with terrestrial biota (2 ppm from pole to pole) is nearly half as strong as that imposed by the fossil fuel emissions (4.5 ppm) when using a GCM (CSU GCM) including a parametrisation of the Planet Boundary Layer (PBL). Neither of the two models in this study has an explicit and complete implementation of the PBL. However, one can say that the TM2 model has a crude boundary layer representation because the vertical diffusion coefficients calculated with the scheme of Louis et al. (1979) are dependent on the stability of air. The effect of this is limited both by the large time interval of ECMWF meteorological fields (12 hours) and by the relatively coarse vertical resolution of this version of the TM model close to the ground (roughly two levels between 0 and 1.2 km). We expect that the addition of a PBL in TM2 (or even just a few more levels close to the surface) would increase significantly the mid-northern latitude sink of CO₂ inferred by the inversion because of the co-variation of vertical transport and the biological CO₂ source/sink. When the vertical mixing is strong during summer CO₂ sinks prevail, whereas during winter the CO₂ sources dominate while the mixing is weak, allowing substantial build-up in the PBL. Rayner and Law (1995) show a tendency for the modelled latitudinal profiles to fall into two groups, with or without

an explicit PBL, when dealing with seasonal exchange between atmosphere and land biota.

Finally, dealing with these two model uncertainties and different sets of recent δ^{13} C measurements, it seems that the idea of a strong biospheric sink of CO₂ in the northern hemisphere for the 1990s is not so controversial at the present time (GAIM conference, Garmish Partenkirshen, Germany, September 1995). The problem is to simulate properly the exchanges between atmosphere and land ecosystems for this period that seems very different from the 1980's for the carbon budget. We show that the uncertainty due to modelled atmospheric transport needs to be considered as well as other uncertainties, on sources and sinks or on measurements. In order to fully understand the atmospheric carbon cycle during the 1990's, we must reduce the uncertainty due to modelled transport and continue to work Biogeochemical mechanisms explaining ocean and terrestrial biosphere CO₂ global uptake. This protocol is a step in this direction that allows to understand and quantify the transport differences existing between two models. An improvement would be to infer partitioned fluxes between ocean and land with TM2. To do so, the information given by δ^{13} C measurements (Ciais et al., 1995) should be integrated in the TM2 model.

7. Conclusions

In this paper, we evaluate one uncertainty introduced by modelled atmospheric transport on the balance of the carbon budget. To do so, we propose a protocol to compare the ability of two atmospheric transport models to account for the different components of the atmospheric carbon cycle. Using only fossil fuel emissions (experiment A) lead us to conclude that the PMT model has a stronger north/south mixing than TM2 by about 25% for the global atmosphere. Vertical mixing above source regions is found to be much weaker in the PMT model than in TM2. Analysing "all but fossil experiment" (experiment B) provide us with two important results. First, using the 3D transport of TM2 to carry sources and sinks inferred from the inverse PMT model leads to major differences in surface concentrations in the tropics and at mid-northern latitudes. Secondly, differences between the TM2 simulations we performed show that the influence of the distribution of sources and sinks in longitude has a significant effect on surface concentrations on both sides of the equator. This result implies that the zonal assumption made in 2D studies is not so robust even if the effect on surface concentrations is not as important as the previous effect of modelled transport. Finally, owing to a set of full CO2 fluxes (experiment C), we find that using a 3D model with a weaker large-scale transport, we reduce the equatorial release by about 40 Tmol yr⁻¹ and the mid the northern latitude sink by about 80 Tmol yr⁻¹ for the years 1990-1993 when comparing to the initial 2D budget. These differences between 2D and 3D transport do not strictly speaking constitute an error, but rather a range of variation between two given models. We note however that this range is comparable in magnitude to the global data-based error range derived by Ciais et al. (90 Tmol yr⁻¹) and by Enting et al. (125 Tmol yr⁻¹ for oceans and 105 Tmol yr⁻¹ for biota) on the carbon budget as inferred by ¹³C isotopes.

This three-step protocol allows to derive the main differences on large-scale transport for two models and to quantify the discrepancy between atmospheric latitudinal profiles in terms of net CO_2 surface fluxes.

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