Coupled climate-carbon cycle simulation of the Last Glacial Maximum atmospheric CO_2 decrease using a large ensemble of modern plausible parameter sets

Krista M.S. Kemppinen[1], Philip B. Holden[2], Neil R. Edwards[2], Andy Ridgwell[3,4], Andrew D. Friend[1]

[1]Department of Geography, University of Cambridge, Cambridge CB2 3EN, UK
[2]Environment, Earth and Ecosystem Sciences, The Open University, Milton Keynes, MK7 6AA, UK
[3]School of Geographical Sciences, Bristol University, Bristol BS8 1SS, UK
[4]Department of Earth Sciences, University of California, Riverside, California 92521, USA

Correspondence to: Krista M.S. Kemppinen (Krista.Kemppinen@asu.edu)

Abstract. During the Last Glacial Maximum (LGM), atmospheric CO_2 was around 90 ppmv lower than during the preindustrial period. The reasons for this decrease are most often elucidated through factorial experiments testing the impact of individual mechanisms. Due to uncertainty in our understanding of the real system, however, the different models used to conduct the experiments inevitably take on different parameter values, and different structures. In this paper, the objective therefore, is to take an uncertainty-based approach to investigating the LGM CO_2 drop by simulating it with a large ensemble of parameter sets, designed to allow for a wide range of large-scale feedback response strengths. Our aim is not to definitely explain the causes of the CO_2 drop but rather explore the range of possible responses. We find that the LGM CO_2 decrease tends to predominantly be associated with decreasing sea surface temperatures (SSTs), increasing sea ice area, a weakening of the Atlantic Meridional Overturning Circulation (AMOC), a strengthening of the Antarctic Bottom Water (AABW) cell in the Atlantic Ocean, a decreasing ocean biological productivity, an increasing $CaCO_3$ weathering flux, and an increasing deep-sea $CaCO_3$ burial flux. The majority of our simulations also predict an increase in terrestrial carbon, coupled with a decrease in ocean and increase in lithospheric carbon. We attribute the increase in terrestrial carbon to a slower soil respiration rate, as well as the preservation rather than destruction of carbon by the LGM ice sheets. An initial comparison of these dominant changes with observations and paleo-proxies other than carbon isotope and oxygen data (not evaluated directly in this study) suggests broad agreement. However, we advise more detailed comparisons in the future, and also note that, conceptually at least, our results can only be reconciled with carbon isotope and oxygen data if additional processes not included in our model are brought into play.

1 Introduction

Analyses of Antarctic ice core records suggest that the atmospheric CO_2 concentration at the Last Glacial Maximum (LGM), about 21 kyr ago, was around 190 ppmv, well below the preindustrial atmospheric concentration of around 280 ppmv. The most commonly accepted mechanisms to explain the atmospheric CO_2 decrease include lower sea surface temperatures, which increases the ocean CO_2 solubility (Martin et al., 2005; Menviel et al., 2012), enhanced ocean biological pump due to increased input of aeolian iron to the ocean (Bopp et al., 2003; Oka et al., 2011; Jaccard et al., 2013; Ziegler et al., 2013; Martínez-Garcia et al., 2014; Lambert et al., 2015), capping of air-sea gas exchange by expanding sea ice (Stephens and Keeling, 2000; Sun and Matsumoto, 2010; Chikamoto et al., 2012) and ocean circulation/stratification changes increasing the net CO_2 flux into the ocean (Adkins et al., 2002; Lynch-Stieglitz et al., 2007; Skinner et al., 2010; Lippold et al., 2012; Gebbie, 2014; Skinner et al., 2014; Tiedemann et al., 2015; de la Fuente et al., 2015; Freeman et al., 2015). These changes may in turn be due to a range of possible mechanisms such as increased brine rejection (Shin et al., 2003; Bouttes et al., 2010, 2011; Zhang et al., 2013; Ballarotta et al., 2014), a shift in/weakening of the westerly wind belt over the Southern Ocean (Toggweiler et al., 2006; Anderson et al., 2009; Völker and Köhler, 2013), and a reduced or reversed buoyancy flux from the atmosphere to the ocean surface in the Southern Ocean (Watson and Garabato, 2006; Ferrari et al., 2014). A process that is conversely assumed to have contributed to increasing atmospheric CO_2 is increasing salinity and ocean total dissolved inorganic carbon (DIC) concentration in response to decreasing sea level (Ciais et al., 2013).

A dominant assumption is also that the terrestrial biosphere carbon inventory was reduced (Crowley et al., 1995; Adams and Faure, 1998; Ciais et al., 2012; Peterson et al., 2014), in line with independent estimates of an ocean carbon inventory that was enhanced by several hundred petagrams (Goodwin and Lauderdale, 2013; Sarnthein et al., 2013; Allen et al., 2015; Skinner et al., 2015; Schmittner and Somes, 2016). The decrease in terrestrial carbon is generally attributed to unfavourable climatic conditions for photosynthesis, and the destruction of organic material by moving ice sheets (e.g. Otto et al., 2002; Prentice et al., 2011; Brovkin et al., 2012; O'ishi and Abe-Ouchi, 2013). The hypothesis that there was an increase in terrestrial carbon has, however, also been put forward (e.g. Zeng, 2003; Zimov, 2006), with some studies additionally suggesting little net change (e.g. Brovkin and Ganopolski, 2015). Processes proposed to be responsible for the terrestrial carbon increase include growth in 'inert' or permafrost carbon, slower 'active' soil respiration rates, continental shelf regrowth, and the preservation rather than destruction of terrestrial biosphere carbon in areas to be covered by the expanding Laurentide and Eurasian ice sheets (Weitemeyer and Buffett, 2006; Franzén and Cropp, 2007; Zeng et al., 2007; Zimov et al., 2009; Zech et al., 2011).

Other mechanisms which may have affected the LGM atmospheric CO_2 change include changes in carbonate weathering rate, through its control on the ocean ALK:DIC ratio and consequently the solubility of CO_2 (Munhoven, 2002; Jones et al., 2002; Foster and Vance, 2006; Vance et al., 2009; Brovkin et al., 2012; Crocket et al., 2012; Lupker et al., 2013; Simmons et al., 2016). The change in carbonate weathering rate would in turn have been caused by lower sea level, exposing previously

5   submerged rock, the presence of a greater amount of glacial flour, which is more susceptible to weathering (Kohfeld and Ridgwell, 2009), or potentially higher soil carbon content. The lower sea level may also have reduced shallow water carbonate deposition by decreasing the area of shallow ocean (Opdyke and Walker, 1992; Kleypas et al., 1997; Brovkin et al., 2007), and increased oceanic PO_4 inventory, alleviating the PO_4 limitation on marine production (Tamburini and Follmi, 2009; Wallmann, 2014, 2015). Other potential CO_2 mechanisms include decreasing dissolved organic carbon inventory due to a more

10   stratified deep ocean (Ma and Tian, 2014), and reduced marine bacterial metabolic rate in response to lower ocean temperatures. The lower metabolic rate acts to decrease the return rate of DIC from the remineralisation of organic material, and hence the concentration of CO_2 at the ocean surface (Matsumoto et al., 2007; Roth et al., 2014). The net flux of CO_2 into the ocean may also have increased due to enhanced diatom production caused by the leakageof silicic acid trapped in the Southern Ocean (Matsumoto et al., 2002, 2014), or increased Si inventory, caused by increased input of Si from wind-born

15   dust or enhanced weathering (Harrison, 2000; Tréguer and Pondaven, 2000).

Mechanisms put forward to explain the LGM atmospheric CO_2 decrease arise from paleo-data and model studies. The latter most often involve factorial experiments, introducing mechanisms one at a time. There is rarely any investigation of the impact of alternative assumptions regarding parameter values or model structure. An example of a relevant study is Bouttes et al.,

20   2011, which varied model parameters controlling the importance of iron fertilisation, brine rejection and stratification-dependent diffusion in an ensemble setting, assessing the agreement of the model output with data. Here, our aim is conversely to take an uncertainty-based approach to investigating the LGM CO_2 drop by simulating it with a large ensemble of parameter sets designed to allow for a wide range of large-scale feedback response strengths (Holden et al., 2013a). The objective is not to definitely explain the causes of the CO_2 drop but rather explore the range of possible responses. By *responses* we mean

25   physical and biogeochemical changes in the Earth System (e.g. change in global particulate organic carbon export flux) and how these might be linked to ΔCO_2 and to each other, rather than specific mechanisms (e.g. iron fertilisation). Knowledge of these relationships can in turn inform analysis, in the future, of the relationship between the ensemble parameters and model outputs, in order to isolate individual LGM CO_2 mechanisms. In this study, we furthermore seek to simulate the LGM atmospheric CO_2 drop with the simulated CO_2 feeding back to the simulated climate, which is still infrequently done in LGM

30   CO_2 experiments, and the first time it is done with GENIE-1. Moreover, rather than assuming that terrestrial carbon is destroyed by the LGM ice sheets, we assume that it is gradually buried. This assumption has not yet been implemented, in GENIE-1 or other models, in an equilibrium set-up.

Despite our ensemble varying many of the parameters thought to contribute to variability in glacial-interglacial atmospheric

CO_2, not all sources of uncertainty can be captured, and this is reflected in our simulated ΔCO_2 distribution. We estimate that up to ~60 ppmv of ΔCO_2 could be due to processes not included in our model and error in our process representations (see section 2.4 for details). We thus treat ΔCO_2 between ~-90 and -30 ppmv as "equally plausible", and focus on describing the physical and biogeochemical changes seen in the subset of simulations with this ΔCO_2. We also do an initial assessment of

5   how the subset mean and/or dominant (in terms of sign) responses compare against observations and paleo-proxies, including temperature, sea ice, precipitation, AMOC & AABW cell strengths, terrestrial carbon, ocean carbon, particulate organic matter export and deep-sea $CaCO_3$ burial.

Finally, to test the robustness of relationships derived from the analysis of the ensemble subset with ΔCO_2 between ~-90 and -

10   30 ppmv, we briefly compare the physical and biogeochemical changes seen therein with the changes seen in the ensemble with no ΔCO_2 filter, and the ensemble with a more negative ΔCO_2 filter (~-90 to -60 ppmv) (section 2.4). In general, the same dominant relationships between ΔCO_2 and the physical and biogeochemical changes are observed as in the subset with ΔCO_2 between ~-90 and -30 ppmv. In the case of the ensemble subset with ΔCO_2 between ~-90 and -60 ppmv, we additionally look at what proportion of the total terrestrial carbon change comes from within the ice sheet areas, and from there draw conclusions

15   for the rest of the ensemble.

The paper is organised as follows. Section 2 describes the model, the ensemble, the simulation set-up and the ensemble subsets to be analysed. Section 3 is the results and discussion section, which includes a brief evaluation of the preindustrial (control) spin-up simulation to verify reproducibility of Holden et al., 2013a. The majority of the section is devoted to the LGM

20   simulation: namely, diagnosis of the physical and biogeochemical changes (including potential causal relationships) seen in the subset with ΔCO_2 between ~-30 and -90 ppmv, and to a lesser extent, the ensemble with both more and less constrained ΔCO_2. Comparison of the first subset against observations and paleo-proxies is also included. Section 4 provides the key conclusions.

25   **2 Methods**

2.1 The model

The GENIE-1 configuration is as described in Holden et al. (2013a). The physical model consists of a three-dimensional frictional geostrophic ocean model (GOLDSTEIN) coupled to a thermodynamic/dynamic sea ice model (Edwards and

30   Marsh, 2005; Marsh et al., 2011) and a two-dimensional Energy-Moisture Balance Model (EMBM). Atmospheric tracers are a sub-component of the EMBM, with a simple module (ATCHEM) used to store the concentration of atmospheric gases and their relevant isotopic properties (Lenton et al., 2007). The model land surface physics and terrestrial carbon cycle are

represented by ENTS (Williamson et al., 2006). The ocean biogeochemistry model (BIOGEM) is as described in Ridgwell et al. (2007) but includes a representation of iron cycling (Annan and Hargreaves, 2010), and the biological uptake scheme of Doney et al. (2006). The model sediments are represented by SEDGEM (Ridgwell and Hargreaves, 2007). GENIE-1 also includes a land surface weathering model, ROKGEM (Colbourn, 2011), which redistributes prescribed weathering fluxes

5   according to a fixed river-routing scheme. The model is on a 36 x 36 equal-area horizontal grid, with 16 vertical levels in the ocean.

2.2 The simulation ensemble

The GENIE-1 ensemble consists of 471 parameter sets, varying 29 key model parameters over the ranges in Table 1. It

10   derives from the 471-member emulator-filtered plausibility constrained ensemble of Holden et al. (2013a), which varies 24 active parameters and 1 dummy parameter (as a check against over-fitting). The parameter values in Holden et al. (2013a) were derived by building emulators of eight preindustrial climate metrics and applying a rejection sampling method known as approximate bayesian computation (ABC) to find parameter sets that the emulators predicted were modern plausible. Two parameters were later added to the ensemble, in Holden et al. (2013b), to describe the un-modelled response of clouds to

15   global average temperature change (OL1), and the uncertain response of photosynthesis to changing atmospheric CO_2 concentration (VPC). The parameters are as described in Holden et al., 2013b. We add two further parameters here that represent uncertain processes specific to the LGM. The first (FFX) scales ice-sheet meltwater fluxes to account for uncertainty in un-modelled isostatic depression at the ice-bedrock interface due to ice sheet growth, and for assuming a fixed land-sea mask (Holden et al., 2010b). We vary the parameter in the ensemble to capture the uncertainty in the magnitude of

20   the glacial sea level drop and its effects on the carbon cycle. The second (GWS) scales the global average preindustrial carbonate weathering rates for the LGM, to account for uncertainty in carbonate weathering and un-modelled shallow water carbonate deposition rate changes. For both FFX and GWS, uniform random values were derived using the generation function runif in R.

Table 1. Ensemble parameters. Ranges are from (a) Holden et al. (2013a), (b) Holden et al. (2013b), and (c) Holden et al. (2010b), with the exception of GWS (see main text). The table also precludes the dummy parameter.

Module	Code	Description	Range	Ref.
EMBM	AHD	Atmospheric heat diffusivity ($m^2 s^{-1}$)	1118875 to 4368143	a
	AMD	Atmospheric moisture diffusivity ($m^2 s^{-1}$)	50719 to 2852835	a
	APM	Atlantic-Pacific moisture flux scaling	0.1 to 2.0	a
	OL0	Clear skies OLR reduction (W m^{-2})	2.6 to 10.0	a

	OL1	OLR feedback (W m^{-2} K^{-1})	-0.5 to 0.5	b
GOLDSTEIN	OHD	Isopycnal diffusivity (m^2 s^{-1})	312 to 5644	a
	OVD	Reference diapycnal diffusivity (m^2 s^{-1})	0.00002 to 0.0002	a
	OP1	Power law for diapycnal diffusivity depth profile	0.008 to 1.5	a
	ODC	Ocean inverse drag coefficient (days)	0.5 to 5.0	a
	WSF	Wind scale factor	1.0 to 3.0	a
	FFX	Freshwater flux scaling factor	1.0 to 2.0	c
SEA-ICE	SID	Sea ice diffusivity (m^2 s^{-1})	5671 to 99032	a
ENTS	VFC	Fractional vegetation dependence on vegetation carbon density (m^2 kgC^{-1})	0.4 to 1.0	a
	VBP	Base rate of photosynthesis (kgC m^{-2} yr^{-1})	3.0 to 5.5	a
	VRA	Vegetation respiration activation energy (J mol^{-1})	24211 to 71926	a
	LLR	Leaf litter rate (yr^{-1})	0.08 to 0.3	a
	SRT	Soil respiration activation temperature (K)	198 to 241	a
	VPC	Photosynthesis half-saturation to CO$_2$ (ppmv)	30 to 697	b
BIOGEM	PHS	PO$_4$ half-saturation concentration (mol kg^{-1})	5.3e-8 to 9.9e-7	a
	PRP	Initial proportion of POC export as recalcitrant fraction	0.01 to 0.1	a
	PRD	e-folding remineralisation depth of non-recalcitrant POC (m)	106 to 995	a
	RRS	Rain ratio scalar	0.02 to 0.1	a
	TCP	Thermodynamic calcification rate power	0.2 to 2.0	a
	PRC	Initial proportion of CaCO$_3$ export as recalcitrant fraction	0.1 to 1.0	a
	CRD	e-folding remineralisation depth of non-recalcitrant CaCO$_3$ (m)	314 to 2962	a
	FES	Iron solubility	0.001 to 0.01	a
	ASG	Air-sea gas exchange parameter	0.1 to 0.5	a
ROKGEM	GWS	Land-to-ocean bicarbonate flux scaling factor	0.5 to 1.5	n/a

2.3 Experimental set-up of the model

The preindustrial ensemble simulation results were repeated to verify reproducibility of Holden et al. (2013a). The simulations were performed in two stages, each lasting 10 kyr, on the Cambridge High Performance Computing (HPC) Cluster Darwin. The first stage involved spinning up the model with atmospheric CO$_2$ concentration relaxed to 278 ppmv and a closed biogeochemistry system. This means that there are no sediment-ocean interactions and the model forces the CaCO$_3$ weathering and deep sea sediment burial rates into balance. An initial CaCO$_3$ weathering is initially prescribed but this is subsequently rescaled internally to balance the modelled CaCO$_3$ burial rate and conserve alkalinity. In the second stage, atmospheric CO$_2$ was allowed to evolve freely, with interacting oceans and sediments, and the CaCO$_3$ weathering rate is set equal to the CaCO$_3$ burial rate diagnosed from the end of stage 1. To allow the sediments to reach equilibrium as fast as possible, no bioturbation was modelled in either stage 1 or stage 2.

Each parameter set was then applied to LGM simulations. The modelled preindustrial equilibrium states were used as initial conditions and the ensemble members were integrated for 10 kyr, with freely evolving CO_2. These 10 kyr simulations are variously referred to here as the "LGM equilibrium simulation" or "stage 3", and the LGM equilibrium state refers to the end of stage 3 (see S1 for more details). After application to stages 2 and 3, the original 471 ensemble members were filtered to 315 ensemble members to exclude those simulations with a stage 2 atmospheric CO_2 concentration outside of the range 268 to 288 ppmv (c.f. Prentice et al., 2001), those that entered a snowball Earth state in stage 3 (global annual SAT between ~-68 and -57 °C), or those that showed evidence of numerical instability (c.f. Holden et al., 2013b).

Boundary conditions applied in the LGM simulations included orbital parameters (Berger, 1978) and aeolian dust deposition fields (Mahowald et al., 2006). The atmospheric CO_2 used in the radiative code is internally generated, rather than prescribed but the radiative forcing from dust, and gases other than CO_2 was neglected. The model also requires a detrital flux field to the sediments, containing contributions from opal and material from non-aeolian sources (Ridgwell and Hargreaves, 2007). Weathering fluxes from the preindustrial simulation were applied, scaled by GWS (the land-to-ocean bicarbonate flux scaling factor).

The representation of the ice sheets is as described in Holden et al. (2010b), using the terrestrial ice sheet fraction and orography from the ICE-4G reconstruction of Peltier (1994). Rather than initialising the ensemble with the ice sheet extent and orography at 21 kyr BP, the ice sheets are configured to grow from their preindustrial to LGM extent in 1 kyr, at the beginning of the LGM simulation (i.e. years 0-1 kyr) in order to account for the impact of sea level change on ocean tracers. Following Holden et al. (2010b), only the Laurentide and Eurasian Ice Sheets are allowed to change from their preindustrial form (accounting for ~ 80% of global ice sheet change), and we also route the freshwater to build the ice sheets from the Atlantic, Pacific and Arctic, assuming modern topography, rather than extracting it uniformly. As the ice sheets grow, grid cells on land are gradually covered by ice and any carbon that remains, or has accumulated, is preserved underneath ("buried"). Once the ice covers a grid cell, there is no more exchange between the land carbon in that grid cell and the atmosphere. Prior to being buried, however, it is subject to the same forcings as carbon in any other grid cell. To determine how sensitive the burial carbon amount (i.e. the amount of carbon that is available for preservation underneath the ice) is to the duration of ice sheet build-up, we test the impact of varying the latter from 1 to 10 kyr for one ensemble member (extending the total simulation length to 11 kyr). Our assumption is that if the difference is negligle, applying the same ensemble member to a transient simulation of the full glacial cycle (and therefore a more realistic ice sheet build-up history) would not have yielded a dramatically different burial carbon inventory. We find that increasing the ice sheet build-up duration indeed changes the burial carbon amount only marginally: an increase of ~34 PgC. A limitation, however, is that we do not have a way of testing if the response of other ensemble members would be equally subdued.

2.4 Ensemble subsets

Although our ensemble varies many of the parameters thought to contribute to variability in glacial-interglacial atmospheric

5   CO_2, not all sources of uncertainty can be captured. We estimate, based on our expert opinion, that up to ~60 ppmv of ΔCO_2 could be due to error in our process representations and processes not included in our model, such as changing marine bacterial metabolic rate, wind speed (via its effect on gas transfer) and Si fertilization. This is not a comprehensive assessment, however, as our model also does not include processes such as the effect of changing winds on ocean circulation (Toggweiler et al., 2006), Si leakage (Matsumoto et al., 2002, 2013, 2014), the effect of decreasing SSTs on $CaCO_3$ production (Iglesias-

10 Rodriguez et al., 2002), or changing oceanic PO_4 inventory (Menviel et al., 2012). We focus our analyses on the subset of the ensemble with ΔCO_2 between ~-90 and -30 ppmv (Table 2), treating each value in this range as equally plausible. To test the robustness of diagnosed relationships, we also briefly compare the reponse of this subset (ENS_{104}) with the response of the ensemble with no ΔCO_2 filter (ENS_{315}), and the response of the ensemble with a more negative ΔCO_2 filter (ENS_{16}). In ENS_{16}, the upper ΔCO_2 limit is set to ~-60 ppmv, roughly equivalent to allowing for an extra atmospheric CO_2 decrease due to

15 changing marine bacterial metabolic rate, wind speed (via its effect on gas transfer) and Si fertilization, between the best and upper estimate of Kohfeld and Ridgwell (2009). The ΔCO_2 distribution in each subset or ensemble is shown in Fig. 1.

Table 2. Ensemble subsets, including ΔCO_2 and number of members in each.

Ensemble	ΔCO_2 range (ppmv)	Number of members
ENS_{315}	-88 to 74	315
ENS_{104}	-88 to -30	104
ENS_{16}	-88 to -59	16
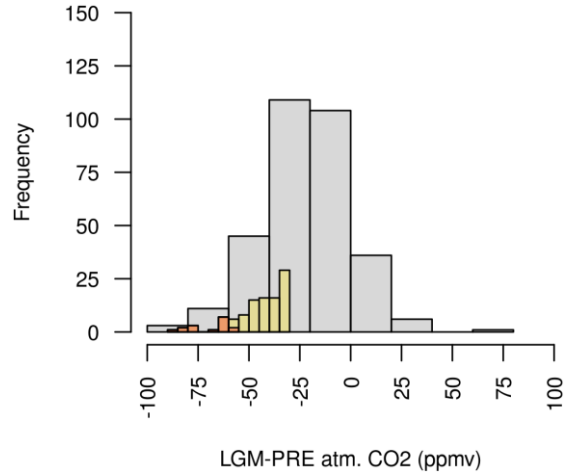
Fig. 1. LGM change in atmospheric CO$_2$ distribution. The ENS$_{315}$ response is shown in grey, the ENS$_{104}$ ensemble response in yellow and the ENS$_{16}$ ensemble response in orange. The same colour legend applies to all figures in the manuscript.

3 Results and discussion

3.1 Preindustrial simulations

Comparison of the preindustrial response of ENS$_{315}$ (i.e. the original, non-ΔCO$_2$ filtered ensemble) against the preindustrial ensemble response of Holden et al., 2013a confirms that the two are very similar. We additionally evaluate ENS$_{315}$ against a few additional preindustrial metrics (see S2) and find responses that can be deemed plausible, following the design principles for the ensemble, outlined in Holden et al., 2013a.

3.2 LGM simulations

3.2.1 Climate, sea level and ocean circulation

Temperature

The ENS$_{104}$ mean LGM surface air temperature (SAT) anomaly (ΔSAT) is -4.6 $\pm$ 1.7, and the range is -2.5 to -10.4 °C. The mean is close to the observed ΔSAT of -4 $\pm$ 1 °C (Annan and Hargreaves, 2013), and the range roughly equivalent to the range

of previous model-based estimates (Kim et al., 2003; Masson-Delmotte et al., 2006; Schneider von Deimling et al., 2006; Braconnot et al., 2007; Holden et al., 2010a; Brady et al., 2013). The ENS_{104} mean LGM SST anomaly (ΔSST) is -1.8 ± 0.8 °C, and the range is -4.5 and -0.7 °C. The mean is again close to an observational data-constrained model estimate (Schmittner et al. (2011), and within the range of estimates inferred from proxy data (MARGO Project Members 2009 in Masson-Delmotte et al., 2013). There is a positive correlation between ΔSAT and ΔCO_2 (r = 0.75, 0.05 significance level herefroth), most likely reflecting the radiative impact of atmospheric CO_2 on SAT, as well as the effect of changing SAT on ΔCO_2. As suggested above, decreasing SST may contribute to decreasing CO_2 via the CO_2 solubility temperature dependence. Changing SAT may also affect ΔCO_2 via its effects on sea ice, ocean circulation, terrestrial and marine productivity (see below). The positive correlation is reproduced in ENS_{315} (r = 0.74), and as showin in Fig. 2, ΔSAT and ΔSST tend to be less negative in ENS_{315} than in ENS_{104}. In ENS_{16}, ΔSAT and ΔSST are from the extreme or at least lower end of the ENS_{104} range.

The ENS_{104} mean ΔSAT and ΔSST spatial distributions are shown in Fig. 3. In line with observations (Annan and Hargreaves, 2013), the largest SAT decreases (> 10 °C) are simulated over the Laurentide and Eurasian Ice Sheets. The equator to pole temperature gradient is also broadly reproduced. The largest SST decreases (≥ 4 °C) are found in the North Atlantic and northeast Pacific, with more limited cooling (≤ -2 °C) in the tropics and polar regions, again consistent with observations. However, the largest SST decreases ought to also be found in the southern hemisphere mid-latitudes whereas the simulated cooling is more moderate.
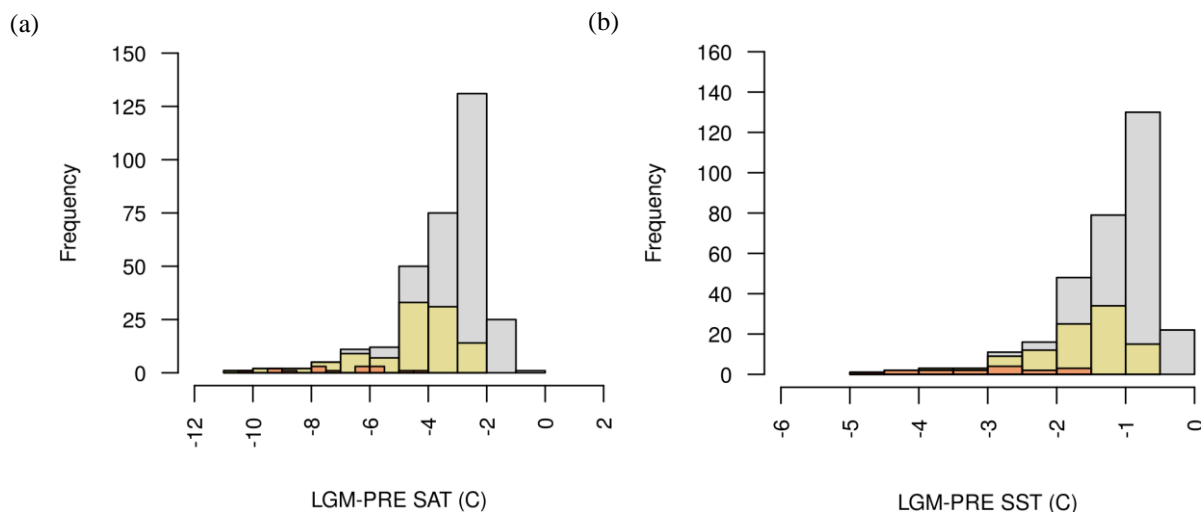
Fig. 2. LGM change in surface air temperature and sea surface temperature (a-b) distributions.
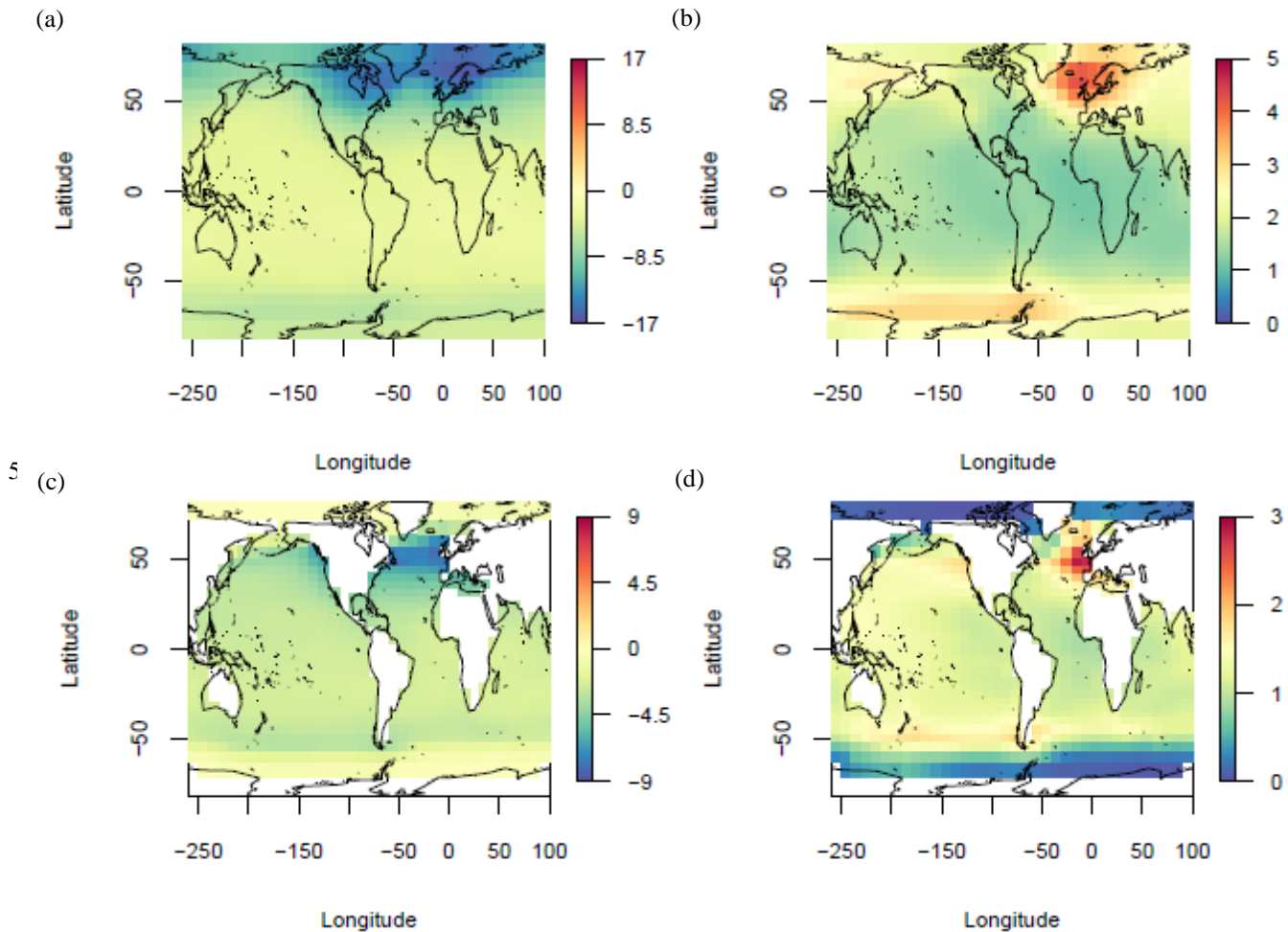
Fig. 3. LGM change in surface air temperature (a-b) and sea surface temperature (c-d) (°C) ENS_{104} mean (left) and standard deviation (right).

Salinity

The ENS_{104} mean percentage increase in LGM salinity (and DIC, ALK, PO_4, etc) due to decreasing sea level is 2.84 ± 0.62 %S and the range is 2 to 4 %S. There is no significant relationship between %S and ΔCO_2 in either ENS_{104} or ENS_{315}, and the distribution of %S is similar in ENS_{104} and in both ENS_{315} and ENS_{16} (Fig. 4).
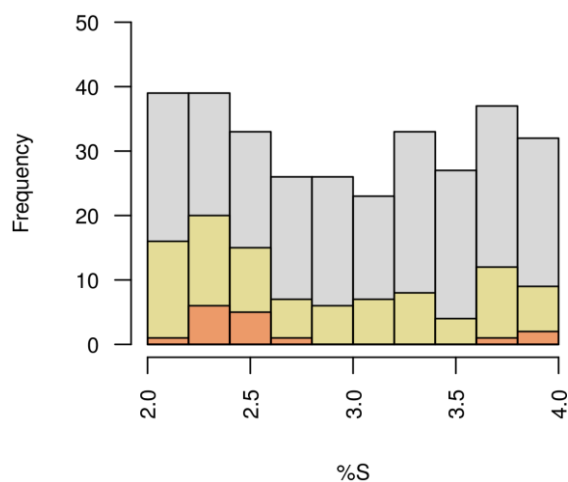
Fig. 4. Percentage increase in LGM salinity due to decreasing sea level distribution.

Sea ice

The ENS_{104} mean LGM global annual sea ice area anomaly (ΔSIA) is 18.6 ± 7.4 million km^2, and the range is 9.9 to 44 million km^2. There is a negative correlation between ΔSIA and ΔSAT (r = -0.97) and between ΔSIA and ΔCO_2 (r = -0.74). The negative correlation between ΔSIA and ΔCO_2 likely reflects the impact of changing atmospheric CO_2 on ΔSIA but may also include a smaller contribution from changing sea ice area to ΔCO_2. Increasing LGM sea ice area could for instance have capped the outgassing of CO_2 from the ocean, particularly in the Southern Ocean, and also reduced the net ocean-atmosphere CO_2 flux by decreasing the AMOC strength (see below). The negative correlation between ΔSIA and ΔSAT, and between ΔSIA and ΔCO_2, is reproduced in ENS_{315} (r = -0.96 and r = -0.74 respectively). ΔSIA in ENS_{104} also tends to be higher than in ENS_{315}, and smaller than in ENS_{16} (Fig. 5).

As shown in Fig. 6, fractional sea ice cover increases in all regions where sea ice is present in preindustrial simulations, although the largest increases take place in the North Atlantic.
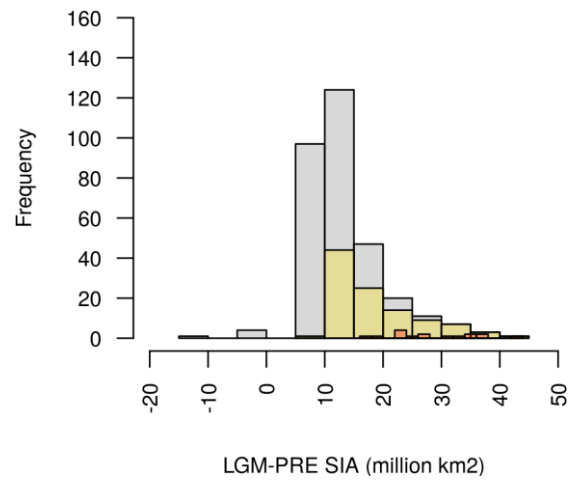
Fig. 5. LGM change in global sea ice area distribution.

(a)   (b)
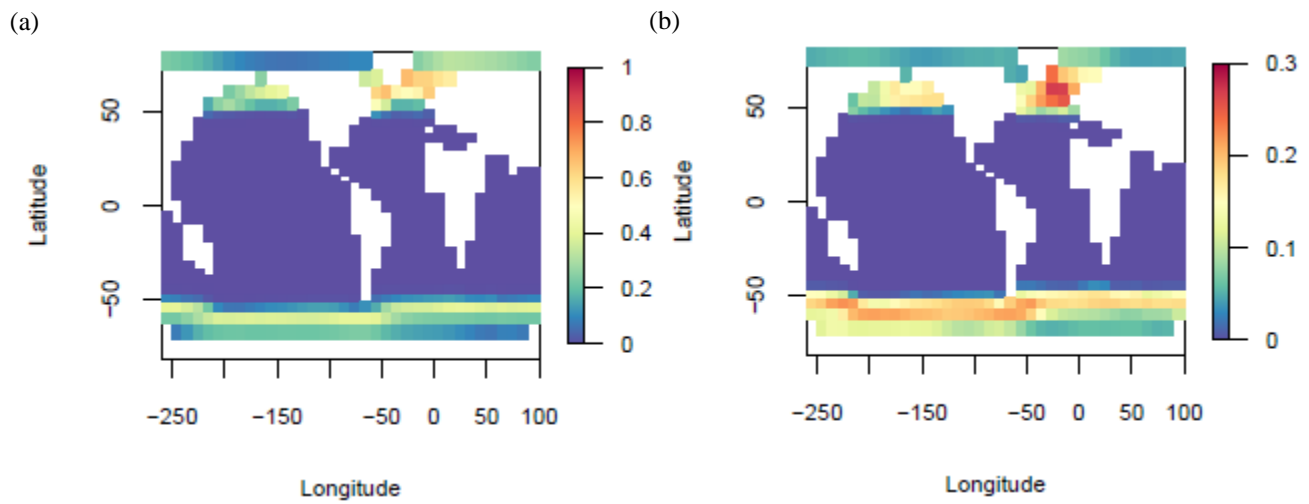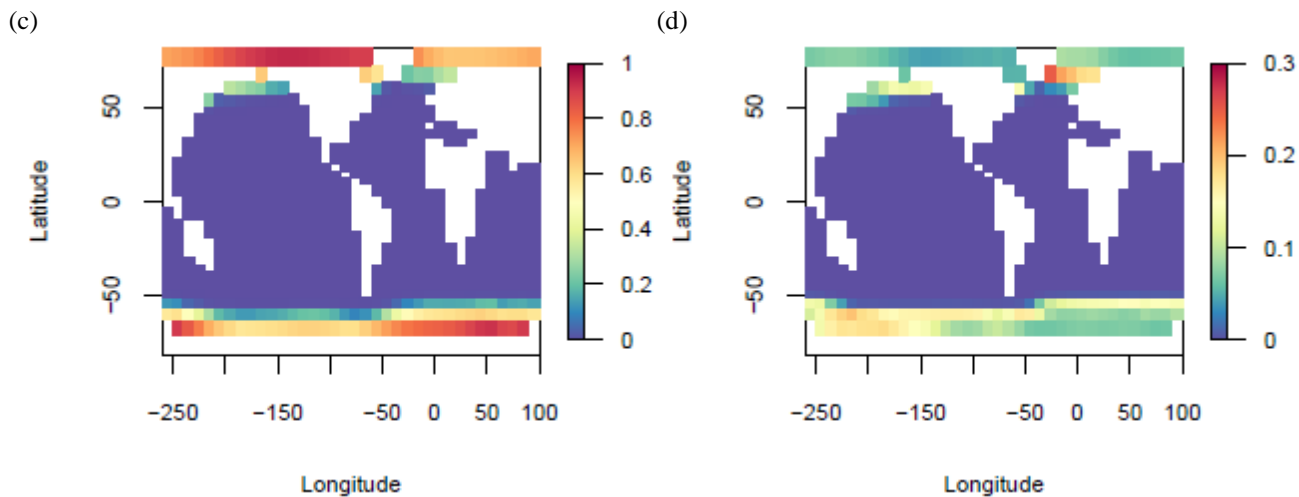
Fig. 6. LGM-PRE (a-b) and PRE (c-d) fractional sea ice cover ENS$_{104}$ means (left) and standard deviations (right).

Precipitation

The ENS$_{104}$ mean spatial distribution of the LGM precipitation rate anomaly (ΔPP) is shown in Fig. 7. The LGM changes are mostly negative but regions of positive ΔPP do exist, notably over Siberia and Australia. The largest LGM precipitation decreases (> 1.5 mm day $^{-1}$, with a maximum of 2.25 mm day $^{-1}$) are found over northern North America, and from around the eastern North Atlantic to northwest Asia, coinciding with the location of the Laurentide and Eurasian Ice Sheets (and the largest increases in fractional sea ice cover) respectively. Relatively large precipitation decreases (> 0.75 mm day $^{-1}$) are also simulated in eastern Asia, equatorial Africa and other regions of enhanced fractional sea ice cover. Comparison against a pollen-based precipitation reconstruction (Bartlein et al., 2011; Alder and Hostetler, 2015) suggest that the simulated precipitation changes over Europe and equatorial Africa are of the right direction, while precipitation changes over western Siberia at least ought to be negative. The sign of the precipitation changes over North America is mostly consistent with observations, which record negative changes over most of the continent. However, positive changes, which are also observed, are not captured. Although not shown here, comparison of the ENS$_{104}$ mean against the ENS$_{315}$ mean suggests that the precipitation patterns in the two are very similar, but the decreases generally tend to be higher in the ENS$_{104}$ mean. The precipitation decreases in ENS$_{104}$ conversely tend to be smaller than in ENS$_{16}$.

(a)   (b)
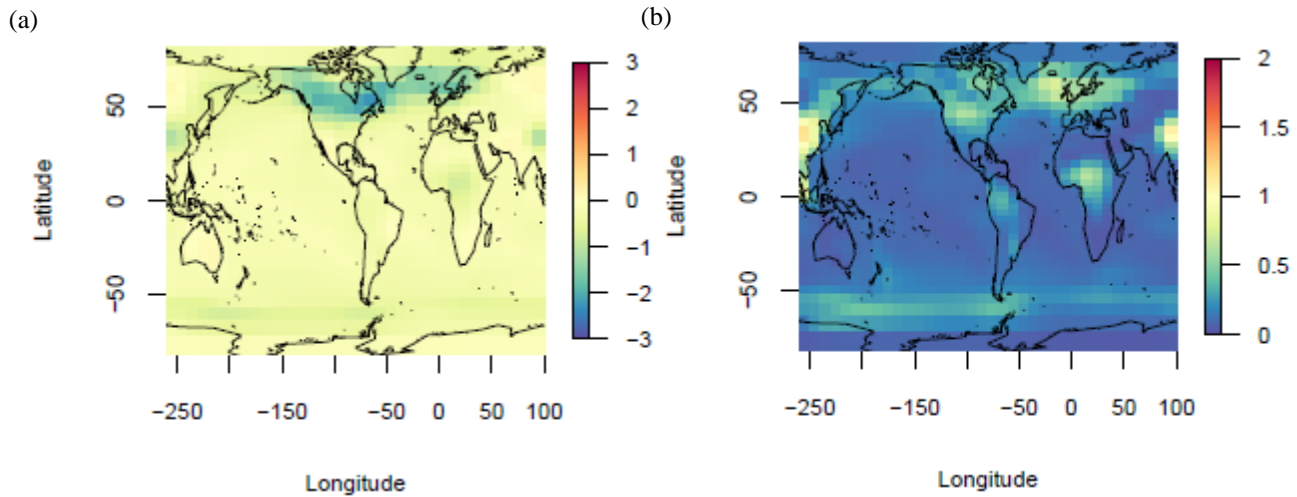
Fig. 7. LGM change in precipitation rate (mm day^{-1}) ENS$_{104}$ mean (a) and standard deviation (b).

Ocean circulation

The ENS$_{104}$ mean LGM AMOC strength anomaly ($\Delta\psi_{max}$) is -2.8 ± 2.8 Sv, and the range is -8 to 4.7 Sv (Fig. 8). These
estimates lie at the low end of the $\Delta\psi_{max}$ predicted by 9 PMIP2 (Weber et al., 2007) and 8 PMIP3 (Muglia and Schmittner,
2015) coupled model simulations. However, they do not include the more negative $\Delta\psi_{max}$ predicted by Völker and Köhler
(2013) for instance. The ENS$_{104}$ mean LGM-PRE AABW cell strength in the Atlantic Ocean ($\Delta\psi_{min}$) is 0.1 ± 1.2 Sv. A
positive $\Delta\psi_{min}$ represents an LGM decrease in cell strength as we keep the original (negative) sign for anticlockwise flow of
Antarctic water. A negative $\Delta\psi_{min}$ conversely represents an LGM increase in cell strength. However, the difference
between the LGM and PRE Atlantic AABW here is not statistically significant. The range of $\Delta\psi_{min}$ is -4.3 to 4.3 Sv,
roughly comparable to the range of $\Delta\psi_{min}$ predicted in Weber et al. (2007) (see also Muglia and Schmittner, 2015), but
excluding the much larger ψ_{min} increase predicted by Kim et al. (2003) for example. As shown in Fig. 9, the northern limit
of the ENS$_{104}$ mean LGM AABW cell is roughly at the same latitude as in the preindustrial simulations. The maximum
depth reached by the ensemble mean AMOC base is also similar to preindustrial. Observations (Lynch-Stieglitz et al., 2007;
Lippold et al., 2012; Gebbie, 2014; Böhm et al., 2015), conversely, suggest that the LGM AMOC shoaled to less than 2 km,
raising its base depth by 2500 and 600 m at the north and south end of the return flow respectively. The LGM AABW, in
turn, is thought to have filled the deep Atlantic below 2 km, reaching as far north as 65 °N, which is ca. 25 degrees north of
its modern northern limit (Oppo et al., 2015).

Although not shown here, the ENS_{16} ensemble members tend to exhibit a shoaling of the AMOC and enhanced penetration of AABW. With regard to $\Delta\psi_{max}$ and $\Delta\psi_{min}$, one can see from Fig. 8 that these tend to be more negative (i.e. weaker AMOC and stronger AABW) than in ENS_{104}. The $\Delta\psi_{max}$ and $\Delta\psi_{min}$ in ENS_{315} tend to conversely be more positive. In ENS_{104}, we also find a positive relationship between $\Delta\psi_{max}$ and ΔCO_2 (r = 0.57) and a negative relationship between $\Delta\psi_{min}$

5   and ΔCO_2 (r = -0.42). The relationships are reproduced in ENS_{315} (r = 0.59 and r = -0.36 respectively). We additionally find, in both ENS_{104} and ENS_{315}, negative correlations between $\Delta\psi_{max}$ and $\Delta\psi_{min}$ (r = -0.62 and -0.63), $\Delta\psi_{min}$ and ΔSAT (r = -0.4 and -0.4) and $\Delta\psi_{max}$ and ΔSIA (r = -0.62 and -0.66), as well as positive correlations between $\Delta\psi_{max}$ and ΔSAT (r = 0.68 and 0.66), and $\Delta\psi_{min}$ and ΔSIA (r = 0.37 and 0.42). Based on these relationships, we hypothesise that increasing LGM AABW strength led to an expansion of the AABW cell. The latter in turn restricted the AMOC to lower depths, and reduced

10   its overturning rate (e.g. Shin et al., 2003). The increase in AABW strength was likely driven by increases in sea ice enhancing brine rejection. Sea ice increases in the North Atlantic may have additionally weakened the AMOC cell by locally reducing deep convection.

The relationships between $\Delta\psi_{max}$, $\Delta\psi_{min}$ and ΔCO_2 are also consistent with increasing ψ_{min} (decreasing ψ_{max}) contributing

15   to decreasing atmospheric CO_2. The replacement of NADW by AABW in the North Atlantic would, for instance, have led to a dissolution of deep sea sediment $CaCO_3$ due to AABW having a lower bottom water CO_3^{2-} concentration than NADW (see e.g. Yu et al., 2014). The increased $CaCO_3$ dissolution flux would in turn have raised the whole ocean alkalinity, lowering the atmospheric CO_2. Enhanced AABW production would also have caused the deep ocean to become more stratified, allowing more DIC to accumulate at depth, and promoting further $CaCO_3$ dissolution. A decrease in NADW formation could

20   have additionally lowered atmospheric CO_2 by reducing CO_2 outgassing at the ocean surface, and reducing the burial rate of deep sea $CaCO_3$ due to the concomitant increase in deep sea DIC accumulation. Further investigation is, however, required to confirm these causal relationships.

Fig. 8. LGM change in ψ_max and ψ_min (a-b) distributions.

(c)   (d)
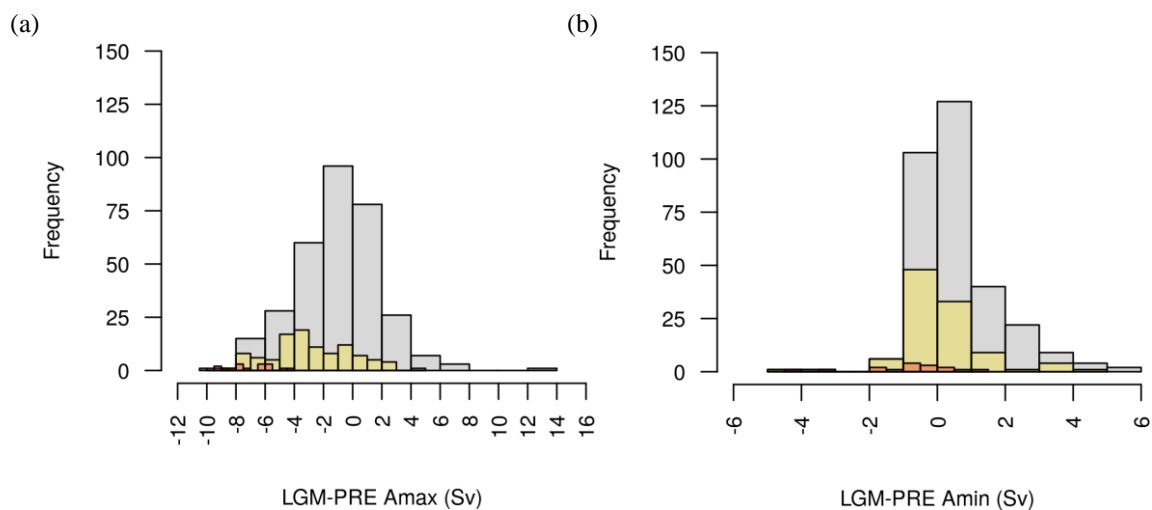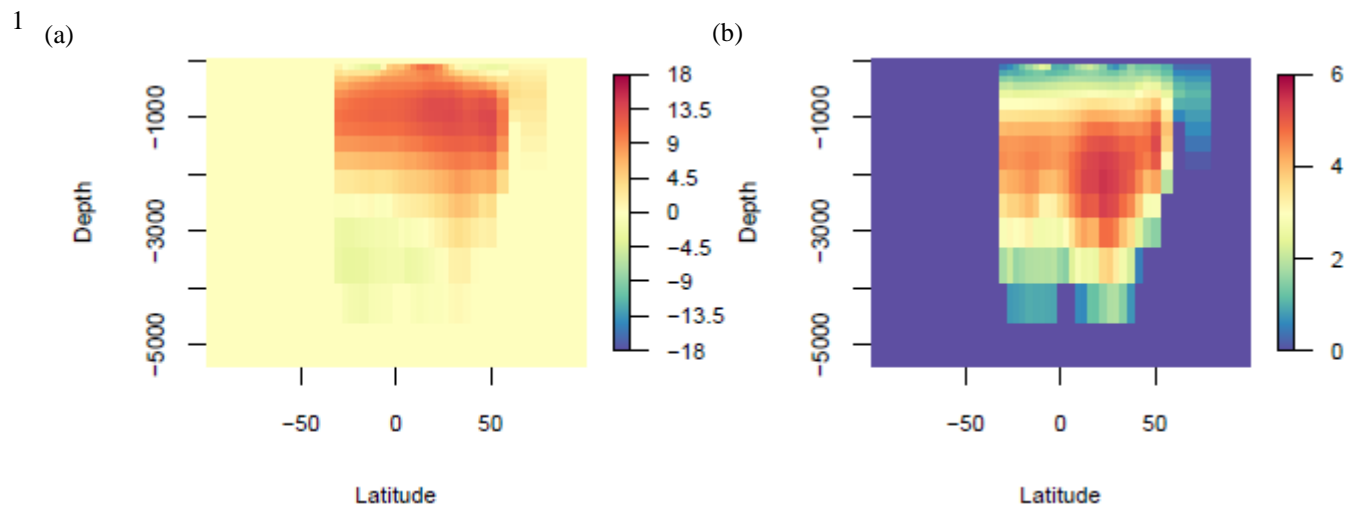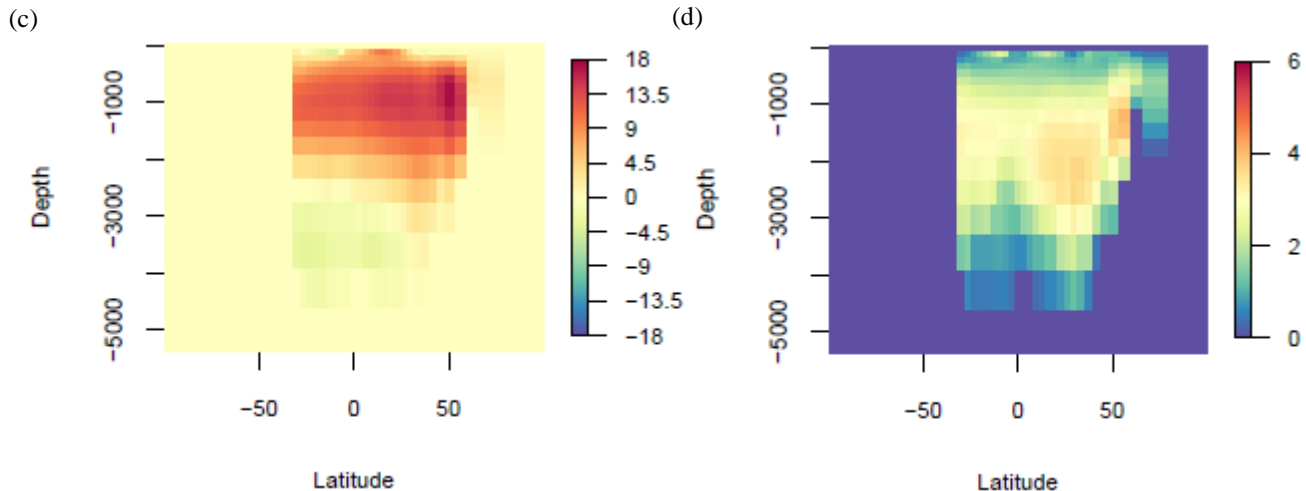
Fig. 9. LGM (a-b) and PRE (c-d) Atlantic overturning stream functions (Sv) ENS$_{104}$ means (left) and standard deviations (right).

3.2.2 Terrestrial biosphere, ocean and lithospheric carbon

As shown in Fig. 10, most of the ensemble members in ENS$_{104}$ predict an LGM increase in terrestrial biosphere (ΔTerrC), and lithospheric[1] (ΔLithC) carbon inventory and a decrease in ocean carbon inventory (ΔOceanC). The remaining ensemble members predict one of four other scenarios of carbon partitioning, with the second most common scenario (11% of ensemble members) being increasing terrestrial carbon and decreasing ocean and lithospheric carbon (Table 3). Similar patterns can also be observed in ENS$_{315}$ and ENS$_{16}$. A likely explanation for scenario 1 (increase in terrestrial biosphere and lithospheric carbon, decrease in ocean carbon) is that reduced soil decomposition (see below) causes a flux of CO_2 from the atmosphere to the land, leading to an immediate outgassing of CO_2 from the ocean to remove the atmospheric pCO_2 difference. The CO_2 outgassing also leads to an increase in surface $[CO_3^{2-}]$ and subsequently deep ocean $[CO_3^{2-}]$, which reduces $CaCO_3$ dissolution (and increases lithospheric carbon). The increase in $CaCO_3$ burial in turn decreases $[CO_3^{2-}]$ and increases $[CO_2]$, which is communicated back to the surface, with a resultant increase in atmospheric CO_2 (Kohfeld and Ridgwell, 2009). The above explanation is of course only part of the explanation for this dominant carbon partitioning

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[1] The ΔLithC stems from changes in the deep-sea $CaCO_3$ burial flux and/or $CaCO_3$ weathering/shallow water deposition flux and was initially calculated to ensure that carbon was being conserved over the LGM simulation.

scenario, with physical mechanisms also expected to play a role, in addition to any changes in ocean productivity and changes in land carbonate weathering (see below).

(e)
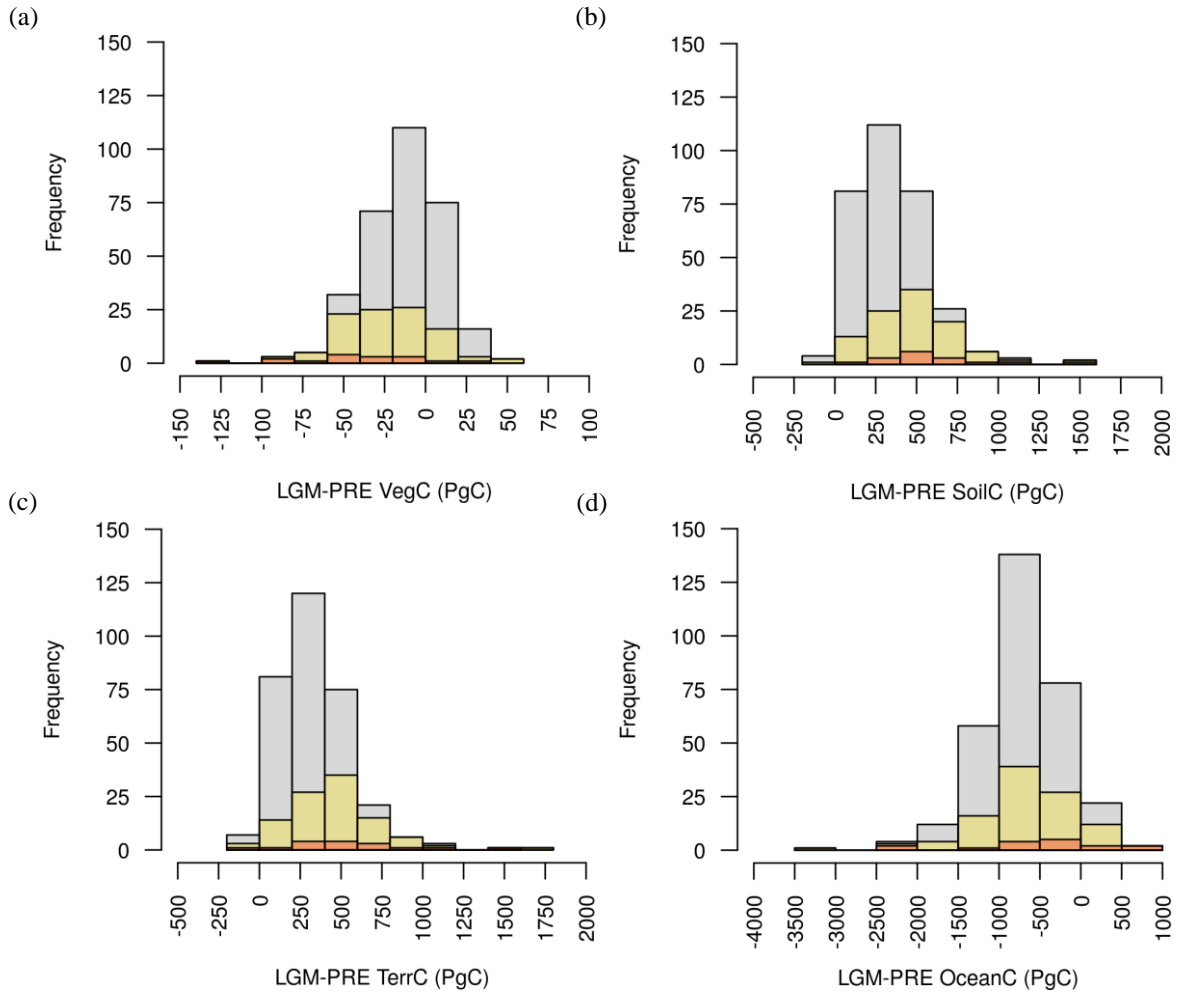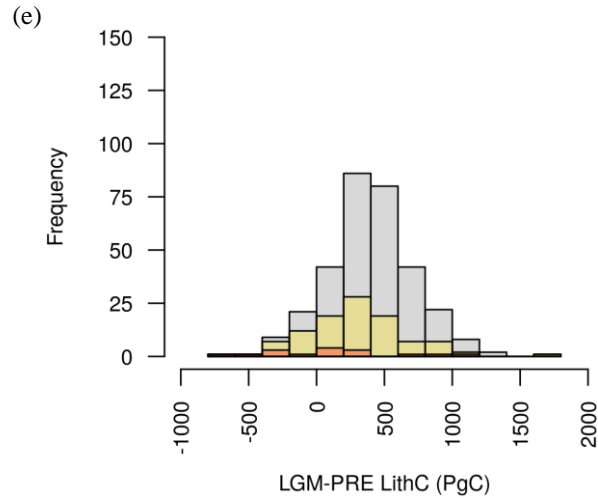
Fig. 10. LGM change in vegetation (a), soil (b), terrestrial (vegetation + soil) (c), ocean (d) and lithospheric (e) carbon inventory distributions.

Table 3. LGM-PRE carbon partitioning scenarios in ENS_{315}, ENS_{104} and ENS_{16}.

	Scenarios		ENS_{315} Total counts	(% of total)	ENS_{104} Total counts	(% of total)	ENS_{16} Total counts	(% of total)
1. ΔTerrC(+)	ΔOceanC(-)	ΔLithC(+)	279	(89)	82	(79)	10	(63)
2. ΔTerrC(+)	ΔOceanC(+)	ΔLithC(-)	16	(5)	11	(11)	3	(19)
3. ΔTerrC(+)	ΔOceanC(-)	ΔLithC(-)	11	(3)	8	(8)	2	(13)
4. ΔTerrC(-)	ΔOceanC(+)	ΔLithC(+)	1	(1)	1	(1)	0	(0)
5. ΔTerrC(-)	ΔOceanC(+)	ΔLithC(-)	5	(2)	2	(1)	1	(6)
6. ΔTerrC(-)	ΔOceanC(-)	ΔLithC(+)	1	(1)	0	(0)	0	(0)
7. ΔTerrC(+)	ΔOceanC(+)	ΔLithC(+)	2	(1)	0	(0)	0	(0)

The ENS$_{104}$ mean ΔTerrC, ΔOceanC and ΔLithC, the signs of which are consistent with scenario 1, are reported in Table 4, alongside previous estimates from observational data- and model-based studies. From here we can see that the mean ΔTerrC is only aligned with a handful of estimates and no studies so far report a negative ΔOceanC. Instead, ΔOceanC is estimated to be positive, primarily based on carbon isotope data. The loss of hundreds of petagrams of carbon from the ocean in response

5   to terrestrial carbon growth has, however, been previously proposed (e.g. Zimov et al., 2006). Moreover, if we assume that 90% of the atmospheric CO_2 perturbation caused by the increase in terrestrial biosphere carbon reported in Table 4 gets removed by the ocean and sediments, the change in ocean carbon would be negative, even after adding the remaining carbon to be lost from the atmosphere to the ocean. We discuss what these results would likely mean for carbon isotope data in section 3.2.6.

The positive ΔTerrC studies in Table 4 attribute the increase in terrestrial carbon to different factors: Zimov et al., 2009 and Zech et al., 2011 predict large increases in permafrost carbon while Zeng et al., 2003 ignores permafrost. Instead, the author attributes the glacial terrestrial carbon increase to the preservation rather than destruction of carbon in areas to be covered by the LGM ice sheets, lower soil respiration rates (in the active carbon pool) caused by a colder climate, as well as storage of

15   carbon on exposed continental shelves. Here, neither the latter carbon accumulation mechanism, nor that of permafrost growth, are included. However, our model does attempt to capture the very slow rates of soil decomposition characteristic of permafrost (Williamson et al., 2006). We attribute the terrestrial carbon increase in our ensemble to a higher soil carbon inventory caused by a decreasing soil respiration rate. As can be seen from Fig. 10, vegetation carbon tends to conversely decrease at the LGM. As in Zeng (2003), we also do not assume that as the ice sheets expand over terrestrial carbon, they

20   destroy it. The lack of this potential loss term means that our ΔTerrC estimates may be higher than in many previous studies, irrespective of what the response of the terrestrial biosphere is to the LGM climate and CO_2 forcings. O'ishi and Abe-Ouchi (2011) for instance estimated that the LGM climate is responsible for the loss of 502 PgC of terrestrial carbon, while another 388 PgC is removed by the ice sheets. Zeng (2003) conversely proposed that 431 PgC is preserved under the ice sheets at the LGM. This number includes 315 PgC present during the interglacial, and another 116 PgC accumulated in response to the

25   glacial climate forcings, prior to insulation of the terrestrial carbon from the atmosphere by the ice sheet coverage. Here, analysis of ENS$_{16}$ suggests that during the 1000 years of LGM ice sheet build-up, the terrestrial carbon inventory in the areas to be occupied by the ice sheets increases by between 6 and 444 PgC, yielding LGM "ice-sheet or burial" carbon inventories between 318 and 1341 PgC (Table 5). This increase accounts for less than half of the total LGM change in terrestrial carbon (i.e. ΔTerrC) in the majority of simulations. However, if this burial carbon were to have been destroyed rather than

30   preserved, ΔTerrC would be negative in all but 3 simulations, as opposed to positive in all but one simulation (Table 5).

Table 4. LGM-PI difference in terrestrial (ΔTerrC), ocean (ΔOceanC) and lithospheric (ΔLithC) carbon inventory (PgC) in this study (ENS$_{104}$ mean, standard deviation and range) and previous studies. CR95 = Crowley et al. (1995), AF98 = Adams and Faure (1998), Z03 = Zeng, 2003, ZI09 = Zimov et al. (2009), PR11 = Prentice et al. (2011), ZE11 = Zech et al. (2011), BR12 = Brovkin et al. (2012), CI12 = Ciais et al. (2012), GL13 = Goodwin and Lauderdale (2013), OA13 = O'ishi and Abe-Ouchi (2013), SA = Sarnthein et al. (2013), PE14 = Peterson et al. (2014), AL15 = Allen et al. (2015), BG15 = Brovkin and Ganopolski (2015), SK15 = Skinner et al. (2015), SS16 = Schmittner and Somes (2016), ME17 = Menviel et al. (2017), JE18 = Jeltsch-Thömmes et al., 2018.

	This study	Previous studies	Ref.	Details
ΔTerrC	467.5±286.5 [-51.6,1603.8]	[-1160, 530]	CR95	Pollen database
		-1500	AF98	Ecological data
		-850	JE18	Simulation with Bern3D
		[-694, -550]	PR11	Simulation with LPX
		-600	BR12	Simulation with CLIMBER-2
		-597	OA13	Simulation with MIROC-LPJ
		-511	PE14	Benthic foraminiferal δ^{13}C records
		-378	ME17	Simulation with LOVECLIM
		-330	C12	Benthic foraminiferal, ice core and terrestrial δ^{13}C records + simulation with LPJ land ecosystem model
		0	BG15	Simulation with CLIMBER-2 (+ permafrost, peat, glacial burial carbon)
		547	Z03	Simulation with a coupled atmosphere-land-ocean-carbon model
		[200, 400]	ZE11	Soil carbon measurements
		<1000	ZI09	Soil carbon measurements
ΔOceanC	-664±626.9 [-3187.7, 662.4]	[730, 980]	SA13	Ocean radiocarbon records
		687	SK15	Ocean radiocarbon records
		654	A15	Ocean $[CO_3^{2-}]$ reconstructions + benthic foraminiferal δ^{13}C records
		[570, 970]	GL13	Ocean $[CO_3^{2-}]$ reconstructions
		520	C12	Benthic foraminiferal, ice core and terrestrial δ^{13}C records + simulation with LPJ land ecosystem model
		[510,670]	SS16	Simulation with MOBI 1.5 coupled to Uvic
ΔLithC	292.5±373.9 [-654.9,1700.9]	n/a	n/a	n/a

Most of the terrestrial carbon increase in areas to be covered by the ice sheets in ENS$_{16}$ is due to soil carbon, with vegetation carbon decreasing in all but one simulation. The range ofterrestrial carbon increases and the associated burial carbon amounts includeZeng (2003)'s estimates. Our LGM burial carbon estimates would also accommodate an additional 250-550

PgC (Franzen, 1994) from increased glacial peat accumulation (Zeng, 2003). No observational data-based estimates of the LGM burial carbon inventory are available since only limited evidence exists for organic material being preserved by ice during glaciations (Franzen, 1994 and references in Weitemeyer and Buffett, and Zeng, 2007). Outside of the ice sheets, increases in the terrestrial carbon inventory in ENS_{16} are mostly due to soil carbon, which increases in all simulations.

5   Vegetation carbon, conversely, decreases in the majority of simulations. Our range of carbon changes outside of the ice sheet areas include the 198 PgC increase predicted by Zeng (2003) as a result of reduced soil respiration.

Although not evaluated directly, it is likely that similar ice sheet/non-ice sheet terrestrial carbon proportions than in ENS_{16} are found in ENS_{104} and ENS_{315} because of the similar climate change distributions in all three instances (see earlier

10   sections). Although not shown here, the spatial distribution of $\Delta TerrC$ in ENS_{16} is also similar to that of the ENS_{104} (and ENS_{315}) mean. The spatial distribution of $\Delta TerrC$ in ENS_{104} is shown in Fig. 11.

The largest increases in terrestrial carbon (≥ 20 kgC m^{-2}) are found in North America and Europe/western Asia, both within and south of the Laurentide and Eurasian ice sheet margins (Fig. 11). Regions with smaller but still relatively large (≥ 10

15   kgC m^{-2}) increases include the Andes and Patagonia regions, the southern tip of the African continent, eastern north Siberia and the grid cells just south of the Tibetan plateau. The largest LGM decreases in terrestrial carbon (≥ 10 kgC m^{-2}) conversely tend to be found in northwest North America, Beringia and the Tibetan plateau region. Other regions with relatively large (≥ 5 kgC m^{-2}) decreases include equatorial Africa and the deserts in central Asia. Everywhere else the LGM terrestrial carbon density increases by between 0 and 10 kgC m^{-2}. Comparison against paleoecological reconstruction

20   studies (Crowley et al., 1995) suggests that the simulated terrestrial carbon changes within the Laurentide and Eurasian ice sheet areas are of the wrong sign, except in northwest North America, since these studies assume the complete destruction of vegetation and soils in ice sheet areas. Discrepancies between the ENS_{104} and observations further arise from the rainforest regions, where the ensemble mean predicts terrestrial biosphere carbon density changes between -5 and 10 kgC m^{-2}, well above observed changes of $\sim$ -23 kgC m^{-2}. It is important to note, however, that as suggested in Zeng (2007), the rate of

25   decomposition of soil carbon at the LGM may have been slower than assumed in pollen data-based studies. The largest increases in terrestrial carbon density (~ 40 kgC m^{-2}) produced by the ensemble mean are comparable to those found in areas with permafrost growth (Zimov et al., 2006). However, the peaks are potentially misplaced, being located within and south of the Laurentide and Eurasian ice sheet covered areas, rather than in eastern Siberia and Alaska. Alternatively, terrestrial carbon increases in eastern Siberia and Alaska are simply underestimated in the ensemble mean and large

30   increases in terrestrial carbon indeed took place within the ice sheet areas during glacial periods.

The large LGM decreases in terrestrial carbon in northwest North America and adjacent Beringia are likely caused by precipitation decreasing comparatively more than SAT, and causing the decrease in photosynthesis to exceed the decrease in

soil respiration. However, it is also noteworthy that, although not shown here, the regions with the largest decreases in terrestrial carbon density, namely northwest North America, Beringia and the Tibetan plateau area, are also the regions with the largest terrestrial carbon densities in the preindustrial ENS_{315} mean. We further note that the Tibetan soil carbon peak is overestimated in the latter, and the North American soil carbon peak misplaced, compared to observations. We attribute the first discrepancy to the lack of soil weathering in the model and the inclusion of land use effects in the observational data-based estimate (Holden et al., 2013b; Williamson et al., 2006). The second discrepancy is attributed to the lack of explicit representation of permafrost and the absence of moisture control on soil respiration.

Table 5. Ice sheet and non-ice sheet terrestrial carbon stocks in ENS_{16}. Columns 2 and 5 show the amount of carbon stored in areas covered by the Eurasian and Laurentide Ice Sheets ("ice sheet") during the preindustrial and LGM periods respectively. Column 3 is the difference between the two inventories. Column 4 is the LGM change in carbon in ice sheet areas expressed as percentage of the total LGM terrestrial carbon change. Column 6 is the LGM change in carbon outside of the ice sheets.

EM	PRE ice sheet	LGM-PRE ice sheet	% LGM-PRE Total land	LGM Burial	LGM-PRE non-ice sheet
442	456	117	51	573	111
873	896	444	29	1341	1089
511	677	262	32	939	567
99	372	33	20	405	130
871	404	149	26	553	425
786	502	131	21	633	486
107	540	86	22	626	310
701	549	161	36	710	283
801	707	275	39	982	423
219	312	6	16	318	-34
694	389	95	30	484	227
623	697	181	36	879	319
522	713	210	28	923	531
863	408	73	16	480	380
478	573	165	41	739	233
837	784	395	33	1179	796

(a)

(b)

(c)

(d)

(e)

(f)
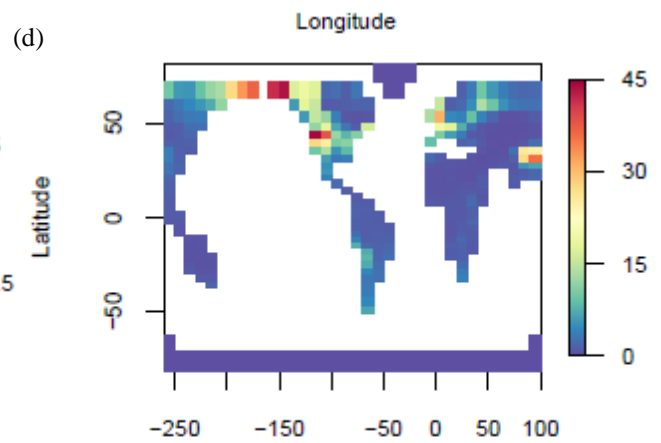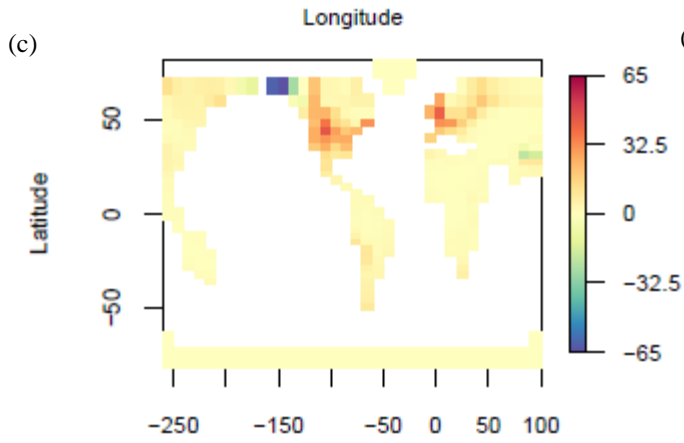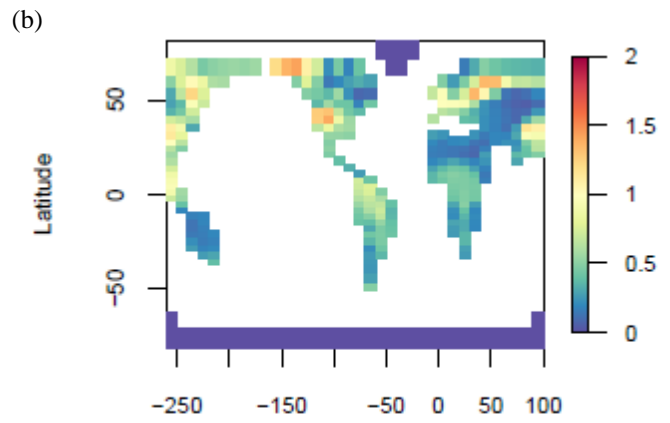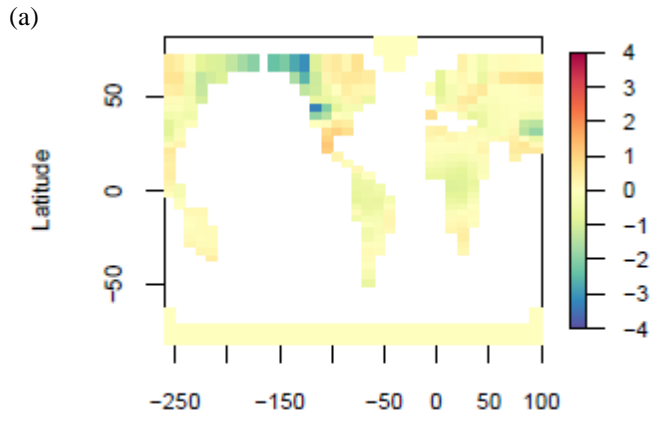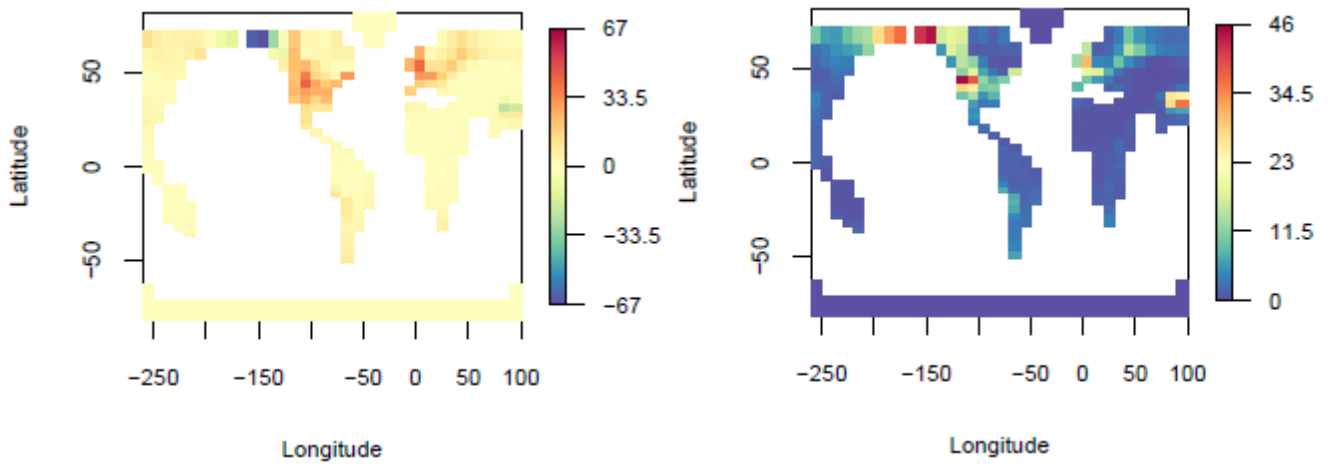
Fig. 11. LGM vegetation (a-b), soil (c-d) and total terrestrial carbon changes (e-f) ENS$_{104}$ mean (left) and standard deviation (right). Units are kgC m^{-2}.

5 The ENS$_{104}$ mean LGM total POC export flux anomaly (ΔPOC_{exp}) is -0.19 $\pm$ 1 PgC yr^{-1} and the range is -2.57 to 2.56 PgC yr^{-1}, roughly consistent with previous model-based estimates (e.g. Brovkin et al., 2002; Bopp et al., 2003; Brovkin et al., 2007; Chikamoto et al., 2012; Palastanga et al., 2013; Schmittner and Somes, 2016; Buchanan et al., 2016). As shown in Fig. 12, compared to ENS$_{104}$, the POC flux decreases in ENS$_{315}$ and ENS$_{16}$ tend to be smaller and larger respectively. ΔPOC_{exp} is positively correlated with $\Delta\psi_{max}$ (r = 0.72 and 0.79) and negatively correlated with $\Delta\psi_{min}$ (r = -0.62 and -0.58) in both

10 ENS$_{104}$ and ENS$_{315}$. The correlations potentially suggest that decreasing AMOC strength and increasing AABW production lead to decreasing POC export. One possible mechanism is enhanced deep ocean stratification due to increasing AABW formation leading to not only more efficient trapping of DIC at depth (see above), but also nutrients and therefore reduced availability in the euphotic zone. All else held constant, a weaker and shallower AMOC cell would also inhibit the transfer of nutrients from the deep ocean to the surface. A negative correlation can additionally be found between ΔPOC_{exp} and ΔSIA (r

15 = -0.55 and -0.6), probably because no primary production occurs beneath the sea ice surface. Increasing sea ice area at the LGM therefore leads to decreasing POC export flux. This would also explain the largest ENS$_{104}$ mean decreases in POC export flux, shown in Fig. 13, coinciding with increases in sea ice fraction.
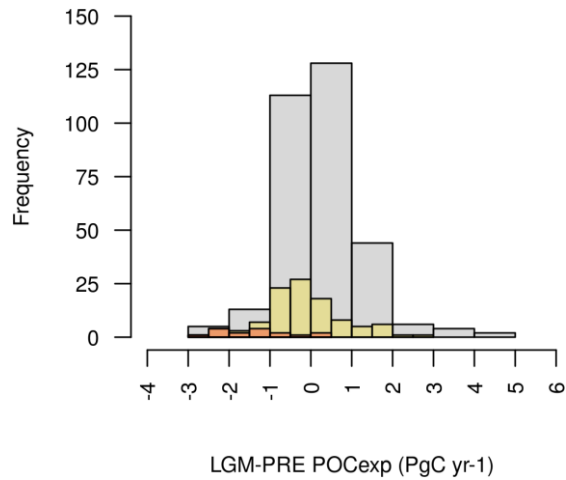
Fig. 12. LGM change in POC export flux distributions.
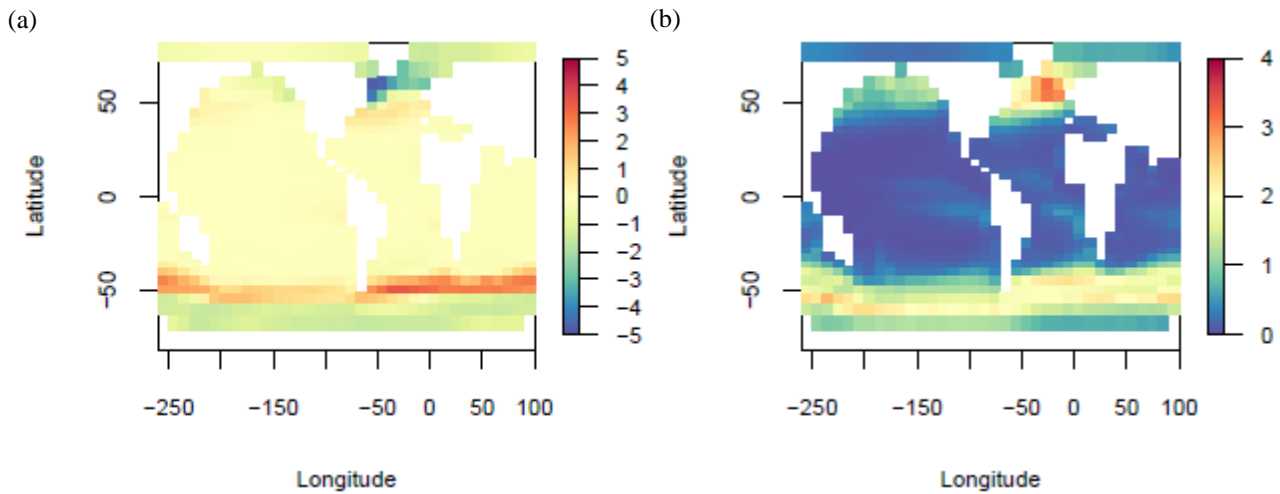
Fig. 13. LGM surface POC export flux change (molC m^{-2} yr^{-1}) ENS$_{104}$ mean (a) and standard deviation (b).

The largest ENS$_{104}$ LGM *increases* in POC export flux conversely occur at around 50 °S, roughly in front of the Antarctic sea ice margins. Increases in POC export are also simulated close to the North Pacific and Atlantic sea ice margins, as well as in the eastern equatorial Pacific and the southwest Atlantic upwelling region. The increases in POC export flux at the sea ice margins are likely caused by the advection of unutilised nutrients from underneath the sea ice. However, they may additionally be due to the enhanced iron availability from the increased supply of aeolian dust, particularly in the Southern Ocean and North Pacific since these are strongly limited by iron (Ridgwell et al., 2007). Iron fertilization may also explain

the increases in POC export flux in the eastern equatorial Pacific and in the southwest Atlantic upwelling region. Comparison against observations suggests that the ensemble mean POC flux changes immediately north, and south of the Antarctic sea ice margins align with observations of increased and reduced marine productivity in the Subantarctic (~45 to 60 °N) and Southern Ocean respectively (Kohfeld et al., 2005; Kohfeld et al., 2013; Jaccard et al., 2013; Martínez-García et

5 al., 2014). The simulated decreases in export flux in the Arctic and subarctic Atlantic (i.e. above ca. 50 °N), and the increases in export flux immediately south of 50°N are also in agreement with previous reconstructions (Kohfeld et al., 2005; Radi and de Vernal, 2008). The mostly lower LGM export fluxes at the equator and in the South Atlantic are conversely inconsistent with the observational data of Kohfeld et al., (2005). The decreases may be caused by the increases in productivity in HNLC regions reducing the phosphate (the other limiting nutrient in GENIE-1 besides iron) availability for photosynthesis in other

10 regions. They may additionally be due to the model not simulating enhanced nutrient inventories in response to enhanced weathering or reduced shallower water deposition of organic matter. The model also does not vary wind speed which may have resulted in stronger tropical upwelling in the Atlantic at the LGM. The evidence is more ambiguous (or missing) for the Pacific (Jaccard et al., 2010; Kohfeld and Chase, 2011; Kohfeld et al., 2005; Costa et al., 2016) and Indian Oceans (Kohfeld et al., 2005; Singh et al., 2011) and is therefore not discussed in more detail here.

3.2.4 Carbonate weathering and shallow water deposition

The ENS_{104} mean land-to-ocean bicarbonate flux scaling factor (GWS) is 1.16 ± 0.24 (corresponding to a percentage change
20 in the land to ocean bicarbonate flux, %LOC, of 38.67), and the range is 0.52 to 1.5 (corresponding to a %LOC between -49.33 and 50). As shown in Fig. 14, the GWS in ENS_{104} tends to be larger than in ENS_{315} and smaller than in ENS_{16}. There is also a negative correlation between GWS and ΔCO_2 (r = -0.52) in ENS_{315}, suggesting that increasing the input of bicarbonate to the ocean leads to a decrease in CO_2 by raising the inventories of ALK and DIC in a 2:1 ratio. In ENS_{104}, however, r is below the 0.05 significance level, suggesting that it is less important.
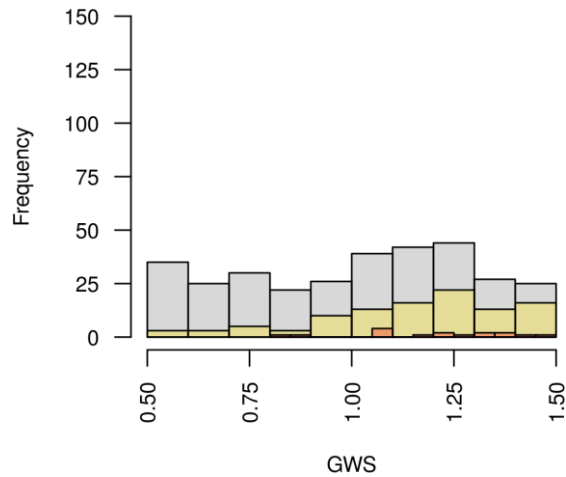
Fig. 14. Land-to-ocean bicarbonate flux scaling factor (GWS) distributions.

5   **3.2.5 Deep-sea carbonate burial**

The ENS_{104} mean global deep-sea $CaCO_3$ burial flux anomaly ($\Delta CaCO3_{bur}$) is 0.036 ± 0.045 PgC yr^{-1} and the range is -0.098 to 0.139 PgC yr^{-1}. The mean value is ca. 3 times larger than the observed value (Catubig et al., 1998), although the latter still falls within the range of simulated values. As shown in Fig. 15, $\Delta CaCO3_{bur}$ in ENS_{104} tends to be higher than in

10   ENS_{315}, and lower than in ENS_{16}. The change in global deep-sea $CaCO_3$ burial flux anomaly is strongly determined by GWS, as suggested by the positive correlation (r = 0.88 and 0.9) between the two, in both ENS_{104} and ENS_{315}. Increasing %LOC (the percentage change in the land to ocean bicarbonate flux) should indeed enhance the $CaCO_3$ burial flux as increasing ALK means the deep ocean CO_3^{2-} will eventually increase. The latter in turn would cause the saturation horizon to fall, allowing $CaCO_3$ to accumulate over greater areas (which are now exposed to undersaturated waters) (Sigman and Boyle,

15   2000). The input of ALK to the surface ocean would also increase the rate of $CaCO_3$ export production (enhancing the sediment deposition flux of $CaCO_3$) since as discussed in Chikamoto et al. (2008), the latter is proportional to the production rate of POC (which is equal to the POC export flux), together with the sea surface saturation state with respect to $CaCO_3$, in GENIE-1. There is indeed also a positive correlation between %LOC and the global change in $CaCO_3$ export (r = 0.27 and 0.4), and between the latter and $\Delta CaCO3_{bur}$ (r = 0.34 and 0.45) in both ENS_{104} and ENS_{315}.
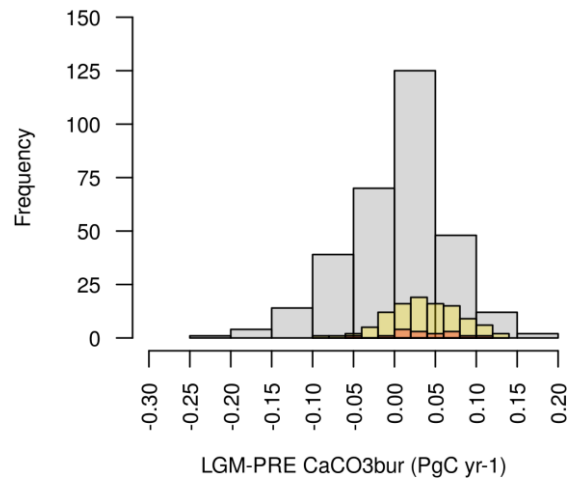
Fig. 15. LGM change in deep sea sediment CaCO$_3$ burial flux distributions.

The ENS$_{104}$ mean spatial distribution of ΔCaCO3$_{bur}$ is shown in Fig. 16. Relatively large increases in burial flux ($\geq 0.5 \times$ 10^{-5} mol cm^{-2} yr^{-1}) can be found at around 50 °S, in the North Pacific, and to a lesser extent the North Atlantic. In other regions, the burial flux is significantly lower or negative, with the largest losses ($\leq$ -0.5 $\times$ 10^{-5} mol cm^{-2} yr^{-1}) occurring the North Atlantic and arctic regions. The only exception is the western North Atlantic, which exhibits a large increase in burial. A comparison of the results against the reconstructions of Catubig et al., 1998 is somewhat difficult as the coverage is poor but overall CaCO$_3$ burial was higher in the North Atlantic and the Pacific, and lower in the tropical and South Atlantic, and the Indian and Southern Ocean.
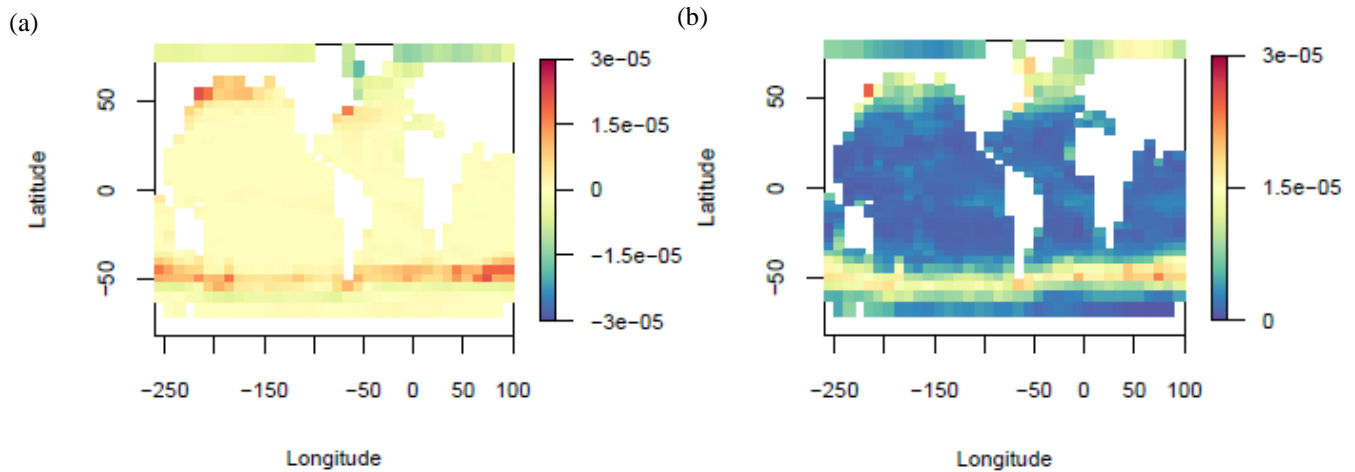
Fig. 16. LGM deep sea CaCO$_3$ burial rate change (mol cm^{-2} yr^{-1}) ENS$_{104}$ mean (a) and standard deviation (b).

3.2.6 Other paleo proxies

As shown in Table 4, a frequent argument for a lower glacial terrestrial carbon inventory is the reconstructed mean glacial
ocean $\delta^{13}C$ value of ca. 0.35‰ lower than present due to the fact that plants discriminate against ^{13}C during photosynthesis.
In our simulations conversely, it follows that the increase in glacial terrestrial carbon inventory would have resulted in an
increase in ocean $\delta^{13}C$. Decreasing SSTs and increasing $CaCO_3$ weathering would have, moreover, likely raised it further (in
the first instance, by enhancing fractionation at the air-sea interface, and in the second instance, through the input of
isotopically heavy weathering products). However, as noted in Zeng (2007), the interpretation of $\delta^{13}C$ value can be
complicated by factors such as the impact of enhanced glacial carbonate ion concentrations on $\delta^{13}C$ in foraminera shells
(Lea et al., 1999). In addition, there are other processes in our model which may have counteracted at least part of the
increase in ocean $\delta^{13}C$. These include reduced marine productivity (e.g. Zimov et al., 2009), as phytoplankton discriminate
against ^{13}C during photosynthesis, giving the marine organic carbon reservoir a low $\delta^{13}C$. However, we note that the sign of
this impact would additionally depend on the associated changes in organic matter remineralisation and burial. Another
relevant process is greater sea ice area, which can lower the ocean $\delta^{13}C$ by reducing the air-sea gas exchange, and therefore
the net transfer of ^{13}C into the ocean (Stephen and Keeling, 2000). We, moreover, propose that adding missing processes
could have decreased ocean $\delta^{13}C$ even further. These include weaker surface winds (while in our model these are fixed),
again through reduced air-sea gas exchange (Menviel et al., 2015), as well as enhanced weathering and reduced deposition of
organic carbon at continental margins due to lower sea levels (Wallmann, 2014). Yet, further research is required here as one
recent study suggests that taking into account these processes would most likely not (the possibility is not completely ruled
out) allow reconciliation of a positive ΔTerrC with the observed mean glacial ocean $\delta^{13}C$ value (Jeltsch-Thommes et al.,
2018).

Missing processes would likely also be needed to reconcile our lower POC export fluxes with deep ocean oxygen records.
These records tend to indicate there was a decrease in LGM deep ocean oxygen concentration (Jaccard et al., 2016). Lower
POC export fluxes would conversely have resulted in an increase in deep ocean oxygen due to reduced oxygen consumption
at depth. When observed over sufficiently large areas, lower oxygen concentrations can support the presence of an enhanced
ocean carbon inventory as deoxygenation can be explained by reduced ocean ventilation (the sole input of oxygen is from
the ocean surface) (Wagner and Hendy, 2015). The reduced ventilation is, in turn, assumed to have led to the accumulation
of a significant amount of DIC in the ocean interior. Thus, explaining the lower deep ocean oxygen concentrations without
having to reduce ocean ventilation as extensively as suggested by previous studies, would as a minimum likely require LGM
export production to have increased rather than decreased. However, it may be possible to increase deep ocean oxygen
consumption by increasing organic matter at depth but keeping the surface POC export flux constant. This would require

adding missing processes such as increasing remineralisation depth with decreasing ocean temperature and increasing ballasting into our model (Kohfeld and Ridgwell, 2009; Menviel et al., 2012).

4 Conclusions

We have used an uncertainty-based approach to investigating the LGM atmospheric CO_2 drop by simulating it with a large ensemble of parameter sets and exploring the range of possible responses. Despite our ensemble varying many of the parameters thought to contribute to variability in glacial-interglacial atmospheric CO_2, we estimated that up to ~60 ppmv of ΔCO_2 could be attributed to processes not included in our model and error in our process representations. As a result, we treated ΔCO_2 between ~-90 and -30 ppmv as equally plausible, and focused on describing the responses of the subset of simulations with this ΔCO_2. We found the range of responses to be large, including the presence of five different ways of achieving a plausible ΔCO_2 in terms of the sign of individual carbon reservoir changes. However, several dominant changes could be detected. Namely: the LGM atmospheric CO_2 decrease tended to predominantly be associated with decreasing SSTs, increasing sea ice area, a weakening of the AMOC, a strengthening of the AABW cell in the Atlantic Ocean, a decreasing ocean biological productivity, an increasing $CaCO_3$ weathering flux and an increasing deep-sea $CaCO_3$ burial flux. The majority of our simulations also predicted an increase in terrestrial carbon, coupled with a decrease in ocean and an increase in lithospheric carbon. The increase in terrestrial carbon, which is uncommon in LGM simulations, was attributed to reduced soil respiration in response to the climate forcings, as well as our choice to preserve rather than destroy carbon that accumulates in ice sheet areas. The dominant changes were broadly in agreement with observations and paleo-proxies other than carbon isotope and oxygen data, which we did not evaluate directly. However, we advise more detailed comparisons in future studies. It is also likely that our results can only be reconciled with carbon isotope and oxygen data if processes currently missing from our model are taken into account.

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