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1	Ocean heat uptake and its consequences for the magnitude of
2	sea level rise and climate change

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Under increasing greenhouse gas concentrations, ocean heat uptake moderates 3 the rate of climate change, and thermal expansion makes a substantial contribution to sea level rise. In this paper we quantify the differences in projections among atmosphere-ocean general circulation models of the Coupled Model In-6 tercomparison Project in terms of transient climate response, ocean heat uptake efficiency and expansion efficiency of heat. The CMIP3 and CMIP5 ensembles have statistically indistinguishable distributions in these parameters. The ocean heat uptake efficiency varies by a factor of two across the models, explaining 10 about 50% of the spread in ocean heat uptake in CMIP5 models with CO<sub>2</sub> increasing at 1%/year. It correlates with the ocean global-mean vertical profiles 12 both of temperature and of temperature change, and comparison with obser-13 vations suggests the models may overestimate ocean heat uptake and underestimate surface warming, because their stratification is too weak. The models 15 agree on the location of maxima of shallow ocean heat uptake (above 700 m) in the Southern Ocean and the North Atlantic, and on deep ocean heat uptake (be-17 low 2000 m) in areas of the Southern Ocean, in some places amounting to 40% of the top-to-bottom integral in the CMIP3 SRES A1B scenario. The South-19 ern Ocean dominates global ocean heat uptake; consequently the eddy-induced 20 thickness diffusivity parameter, which is particularly influential in the Southern 21 Ocean, correlates with the ocean heat uptake efficiency. The thermal expansion 22 produced by ocean heat uptake is  $0.12 \text{ m YJ}^{-1}$ , with an uncertainty of about  $10\% (1 \text{ YJ} = 10^{24} \text{ J}).$ 

#### 1. Introduction

Ocean heat uptake moderates the rate of time-dependent climate change. Thermal expansion of sea-water is a consequence of ocean heat uptake and one of the major contributors to global-mean sea level rise [*Church et al.*, 2011]. Our general aim in this paper is to quantify the differences in predictions of the magnitude and distribution of ocean heat uptake, and its consequences for global-mean surface air temperature change and thermal expansion, among atmosphere—ocean general circulation models (which we henceforth refer to simply as "models", for convenience) used for projections of anthropogenic climate change.

We analyse results from 22 models that participated in the Coupled Model Intercomparison
Project Phase 3 (CMIP3), and from the 20 models in the CMIP5 project whose data were available at the time of writing this paper (Spring 2012). See Fig. 1, and Table S1 in the online
auxiliary material (AUX), for a list. We mainly use the control experiments and experiments
with atmospheric CO<sub>2</sub> concentration increasing at 1%/year (details in AUX).

### 2. Ocean heat uptake efficiency and transient climate response

Gregory and Forster [2008] showed that there is an approximately linear relationship between the global mean surface air temperature change  $\Delta T_a$  and the radiative forcing F (due to greenhouse gases etc.):  $\Delta T_a = F/\rho$ , with the climate resistance  $\rho$  in W m<sup>-2</sup> K<sup>-1</sup>. This relationship holds well for observations and model simulations of recent decades, and for projections of climate change under a continuously increasing forcing, which is a characteristic of most scenarios considered for the 21st century. The basis of this relationship is that the difference between the radiative forcing and the radiative feedback yields the net heat flux N into the climate system:  $N = F - \alpha \Delta T_a$ , and N can be approximated by  $N \simeq \kappa \Delta T_a$ . The climate resistance  $\rho$  is thus

- the sum of  $\alpha$ , the climate feedback parameter, and  $\kappa$ , which is identified as the ocean heat uptake
- efficiency because nearly all the added heat is stored in the ocean [e.g. Church et al., 2011].
- Following *Gregory and Forster*, the ocean heat uptake efficiency  $\kappa$ , the climate feedback pa-
- rameter  $\alpha$  and the climate resistance  $\rho$  were calculated for CMIP5 by ordinary least squares
- regression (OLS) of decadal-mean N, F-N and F respectively against  $\Delta T_a$  under the stan-
- dard idealized scenario of CO<sub>2</sub> increasing at 1% per year, giving a forcing  $F(t) = F_{2\times}t/70$
- which is linear with time t in years, where  $F_{2\times}$  is obtained from experiments in which CO<sub>2</sub> is
- instantaneously increased and then held constant (Andrews et al., 2012; Table S1). The tran-
- sient climate response (TCR) was calculated, following its definition, as  $\Delta T_a$  for the time-mean
- of years 61–80 in this scenario (Figure 1 and Table S1). The coefficient of variation (ratio of
- ensemble standard deviation to ensemble mean) of TCR is about 20% in CMIP5.
- We see that  $\alpha$  obtained by this method agrees closely with  $\alpha$  obtained from the CO<sub>2</sub> step-
- increase experiments [Andrews et al., 2012].  $F_{2\times}$  is not correlated with  $\alpha$  or  $\kappa$ . Whereas Gre-
- gory and Forster [2008] found  $\alpha$  and  $\kappa$  to be independent in CMIP3, they have a correlation of
- <sub>59</sub> 0.56 in CMIP5, significant at the 5% level (one-tailed). This is due principally to the models
- <sub>60</sub> GFDL-ESM2G and GFDL-ESM2M, which have  $\alpha$  and  $\kappa$  that are both larger than in any other
- 61 model. Without these models, the correlation is insignificant (0.32). Further investigation of
- these models is needed to establish whether there is a link between their large  $\alpha$  and large  $\kappa$ .
- The definition of  $\rho$  implies that TCR =  $F_{2\times}/\rho$  =  $F_{2\times}/(\alpha + \kappa)$ . Thus, a larger  $\kappa$  gives
- a smaller TCR (correlation of  $\kappa$  and TCR is -0.76). Excluding GFDL-ESM2G and GFDL-
- ESM2M, so that  $\kappa$  is uncorrelated with  $\alpha$ , we can compute the fraction of the across-model
- variance of TCR explained by  $\kappa$  by comparing  $var(F_{2\times}/(\alpha+\kappa))$  with  $var(\langle F_{2\times}\rangle/(\langle \alpha\rangle+\kappa))$ ,

- where the angle brackets denote the model mean (see AUX for further comment on the method).
- The fraction explained is about 10%.
- Boé et al. [2009] and Boé et al. [2010] present evidence from CMIP3 suggesting that ocean
- heat uptake has a much stronger influence than this on surface warming. Their strong relation-
- ship, however, depends particularly on a cluster of five models [Figure 3b of *Boé et al.*, 2009].
- <sup>72</sup> In the high-latitude Southern Ocean region which was analysed for that Figure, three of these
- models (csiro\_mk3\_0, giss\_e\_h and giss\_e\_r) have an extremely weak ocean temperature strati-
- fication. Another model (ncar\_pcm1) has the lowest climate sensitivity of any CMIP3 model.
- We therefore suspect that the correlation could be strong by chance rather than from a common
- <sub>76</sub> physical behaviour exhibited by these models.
- The time-integrated heat uptake in the 1%/year CO<sub>2</sub> scenario up to year 70 is  $H_{2\times}$
- $_{78}$   $\int_0^{70} N(t) dt \simeq 35 F_{2 \times} \kappa/(\kappa + \alpha)$  (in W year m<sup>-2</sup>). Across the CMIP5 1%/year CO<sub>2</sub> scenar-
- ios, it has a coefficient of variation of about 10%. Using the same CMIP5 models and method
- as for TCR (see also AUX), we find that  $H_{2\times}$  has a correlation of 0.92 with  $F_{2\times}\kappa/(\kappa+\alpha)$ , and
- the fraction of variance of  $H_{2\times}$  explained by  $\kappa$  is  $\sim 50\%$ . Thus  $\kappa$  influences heat uptake more
- than it influences surface warming because of its appearance in the numerator of  $H_{2\times}$ . (In AUX,
- we derive a formula for  $var(H_{2\times})$  in terms of  $var(\kappa)$  and var(TCR).)
- The distributions of  $\kappa$ ,  $\alpha$ ,  $\rho$  and TCR are not significantly different for the CMIP3 and CMIP5
- ensembles according to Kolmogorov–Smirnov tests. In both ensembles,  $\kappa$  varies by about a
- factor of 2. Investigating the reasons for this substantial spread motivates the next section.

# 3. Vertical distribution of temperature and temperature change

Ocean heat uptake efficiency depends on how fast the heat can be transported downwards. We

put forward the hypothesis that a model with a weak vertical temperature gradient in the control

state has a larger capacity for downward heat transport (e.g. because a large dispycnal mixing

coefficient erodes the stratification, which in turn favours convection) and therefore should have

a larger  $\kappa$ . The hypothesis applies to net global-mean vertical heat transport, including but not

limited to the two mentioned processes.

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Fig. 2a shows the global-mean vertical temperature profile from the control runs of the CMIP3

and CMIP5 models (the average over the first 20 years that are parallel to the 1%/year CO<sub>2</sub>

runs) and from observations [WOA05; Locarnini et al., 2006], each profile being expressed as

<sub>96</sub> a difference from its surface temperature. This confirms that in the top 2000 m most models

are less stratified than the real ocean. To elucidate the relationship between  $\kappa$  and the global

temperature profiles, we use a simple measure of the vertical temperature gradient, namely the

vertical temperature difference  $T_z$  between two layers, 0–100 m and 1500–2000 m [similar to

Boé et al., 2009]. The relationship of  $\kappa$  to  $T_z$  is shown in Fig. 3a and is negative, as expected

(r = -0.35 with p = 0.07 [one-sided]). HadGEM2-ES (model J) has a very small  $\kappa$  and is

102 strongly stratified in the uppermost layers, being closer to the observed profile than most other

models, particularly in the top 500 m. The  $\kappa$ - $T_z$  relationship therefore suggests that  $\kappa$  tends to

be too large in AOGCMs.

The change of the global vertical temperature profile averaged over the years 61-80 of the

1%/year CO<sub>2</sub> runs is shown in Fig. 2b. The profiles were scaled with (i.e. divided by) their

vertical integral between 0 m and 2000 m in order to compare their shapes rather than the total

warming. The amount of warming in the top 100 m, as compared to the deeper layers, varies

considerably across the models. As Fig. 3b shows, the variation of  $\kappa$  across models is strongly related to  $\Delta T_z$ , defined as the change of (the scaled)  $T_z$  in the 1%/year CO<sub>2</sub> runs. The correlation (r=-0.66) is significant at the 99% level (p<0.01). If  $\Delta T_z$  is large, then the temperature increase at the surface is larger than at depth, indicating that most heat has been taken up at the surface. This goes along with a small  $\kappa$ . Conversely, models that distribute the additional heat further down have a smaller  $\Delta T_z$  and a larger  $\kappa$ .

The  $\kappa$ - $T_z$  relationship suggests most models will probably transport heat too deeply. Consistent with this, Fig. 2c shows that the observed warming over recent decades [*Levitus et al.*, 2012] is more strongly surface-intensified than in the CMIP3 simulations of the same period.

# 4. Geographical distribution of ocean heat uptake

The projected ocean heat uptake (OHU, i.e. the increase in ocean heat content) in model simulations with an increasing CO<sub>2</sub> content has a distinct regional structure. We analyse this for the CMIP3 SRES A1B scenario, for which we have the largest number of models available. For comparison, the same analysis for the 1% CO<sub>2</sub> runs of CMIP3 and CMIP5 can be found in AUX. They show generally less heat uptake because  $\int F dt$  is smaller, but the geographical features are similar.

The ensemble-mean top-to-bottom integrated OHU is shown in Fig. 4a. It was calculated as the difference between the 20-year averages 2080-2099 and 1980-1999. It is largest in the Southern Ocean, in a band around 40°S, with maxima in the Argentine Basin and south of Africa. This leads to a clear signal in steric sea level rise [cf. *Pardaens et al.*, 2011, their Fig. 2], which is predominantly thermosteric in the Southern Ocean. The models agree on these features

(R > 1, thin black contours), and they are also visible in the top 700 m alone (Fig. 4b), which accounts for up to 50% of the heat uptake in the full depth.

OHU below 2000 m is substantial in several large areas of the Southern Ocean (Fig. 4c), including the Argentine basin and the area west of the Drake Passage, where there are maxima of top-to-bottom OHU. The pattern bears resemblance to observations [*Purkey and Johnson*, 2010]. In these areas, the deep OHU can amount to up to 40% of the total. In the deep-water formation areas in the Southern Ocean and in the North Atlantic the ensemble mean OHU displays minima above 700 m. The models show a large spread in these areas (R < 1).

The zonal total heat uptake (thick black line in the left hand side of the panel, dotted: one 137 standard deviation) confirms that the global maximum of OHU per degree latitude is in the 138 mid-latitude Southern Ocean [Stouffer et al., 2006]. Therefore, the stratification in that region 139 could have a particularly large influence on  $\kappa$ . In the large majority of the models, the Southern 140 Ocean stratification is strongly influenced by the parameterization of the eddy-induced tracer 141 transports. Consistent with this, we find that the quasi-Stokes diffusivity parameter  $\kappa_{GM}$  (often 142 called the eddy-induced thickness diffusivity) has a significant influence on  $\kappa$  (Fig. 3c). When 143  $\kappa_{GM}$  is small, the isopycnal layers are steep, leading to a strong horizontal density gradient [Kuhlbrodt et al., 2012, Fig. 1c] but a weak stratification and thus a large  $\kappa$ .

#### 5. Expansion efficiency of heat

The expansion efficiency of heat [Russell et al., 2000], as a property of a model in m YJ<sup>-1</sup> (1 YJ  $\equiv 10^{24}$  J), is defined as  $\epsilon = h_x/H$ , where  $h_x$  is the global mean sea level rise due to thermal expansion and H the global-integral OHU. We calculate  $\epsilon$  by OLS regression of  $h_x$  against H, using results from 1%/year CO<sub>2</sub> and all available 21st-century scenarios.

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In all models, there is an excellent scenario-independent linear relationship, but  $\epsilon$  varies across models (Fig. 1, Table S1) because the thermal expansivity of sea water  $(1/\rho) \partial \rho / \partial T$  increases with pressure and temperature. Therefore, the magnitude of thermal expansion depends on the latitudes and depths at which the heat is actually stored; this pattern depends on the model, but not on the scenario for a given model.

The ranges of  $\epsilon$  in the CMIP3 and CMIP5 ensembles are similar:  $0.12 \pm 0.01$  m YJ<sup>-1</sup> in CMIP3 and  $0.11 \pm 0.01$  m YJ<sup>-1</sup> in CMIP5. This is consistent with the observational estimates for 0 m to 2000 m, 1955–2010 [*Levitus et al.*, 2012], from which we infer  $\epsilon = 0.12 \pm 0.01$  m YJ<sup>-1</sup>. The observational estimates by *Church et al.* [2011] for 1972–2008 for the full ocean depth indicate  $\epsilon = 0.15 \pm 0.03$  m YJ<sup>-1</sup>, which is slightly higher but not significantly different. We did not find any correlation of  $\epsilon$  with  $\kappa$ ,  $T_z$  or  $\Delta T_z$ , although such relationships would be plausible. It might well be that the stratification in the individual regions which are particularly important to OHU (sec. 4) influences  $\epsilon$  more than global-mean properties do.

# 6. Concluding remarks

Our analysis of CMIP3 and CMIP5 model results indicates that model spread in ocean vertical heat transport processes is responsible for a substantial part of the spread in predictions
of global-mean ocean heat uptake (about 50% in the CMIP5  $1\%CO_2$ /year experiments), and
for some of the spread in predictions of surface warming. Since most AOGCMs have weaker
global-mean stratification than observed, it is possible that they generally overestimate ocean
heat uptake and underestimate surface warming [Forest et al., 2008]. The ocean heat uptake in
CMIP5  $1\%CO_2$ /year experiments has a spread of about 10%, and there is also a spread of about
10% in the expansion efficiency of heat  $\epsilon$ , due to the different spatial distribution of the warming

in the models. These factors contribute roughly equally to the spread of thermal expansion projection in response to CO<sub>2</sub>. Comparison, analysis and evaluation of model processes of ocean interior heat transport is essential to make progress in reducing uncertainties in projections of the magnitude and distribution of ocean heat uptake and the consequent sea-level rise.

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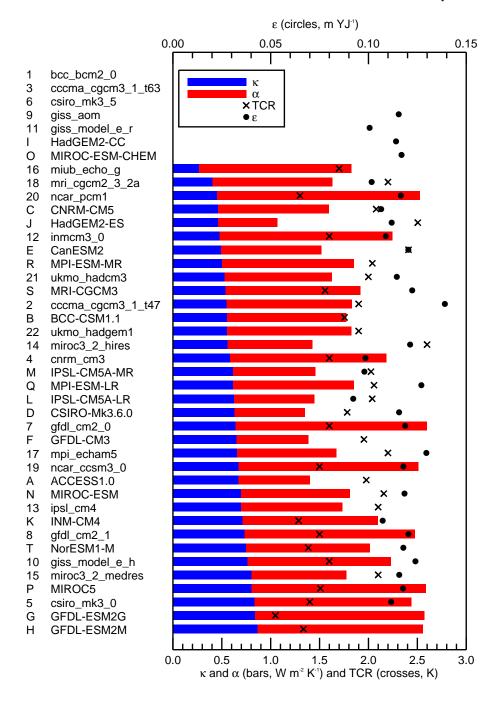


Figure 1: The ocean heat uptake efficiency  $\kappa$  (blue bars), the climate feedback parameter  $\alpha$  (red bars), the transient climate response (crosses) and the expansion efficiency of heat  $\epsilon$  (circles) for the CMIP3 (numbers) and the CMIP5 (letters) models. The total bar length is the climate resistance  $\rho = \alpha + \kappa$ . The models are arranged in order of  $\kappa$ . See Table S1 in AUX for an alphabetical list of the models. It can be seen from this diagram that TCR and  $\kappa$  are anticorrelated (the crosses are further left towards the bottom), but there is no relationship between  $\kappa$  and  $\alpha$  or  $\epsilon$  (the red bars and the circles do not show any tendency from top to bottom). For several technical reasons, not all parameters could be calculated for every model.

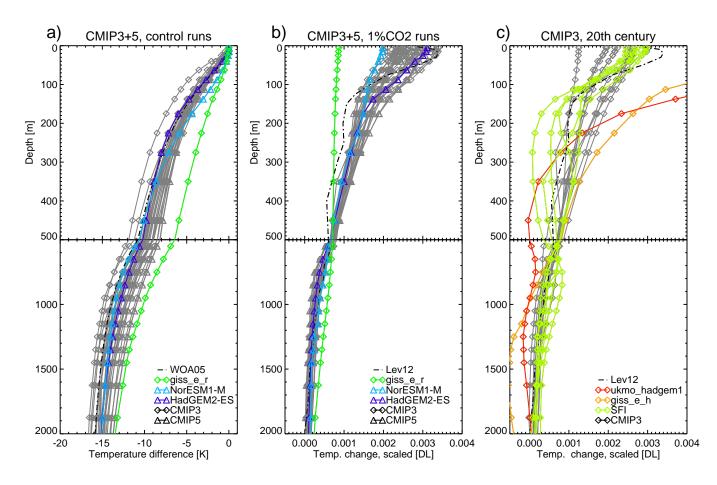


Figure 2: (a) Globally averaged temperature profiles for the control runs of the CMIP3 and CMIP5 models shown as difference from surface temperature, with observations for comparison (dash-dotted; WOA05 [Locarnini et al., 2006]). NorESM1-M is an outlier in that it is unusually weakly stratified in the top 200 m, giving a large  $\kappa$ , but very strongly stratified in the 500 m or so below, giving a large  $T_z$ . Another outlier is giss\_e\_r with an extremely weak stratification. (b) Change of the temperature profiles in the 1%/year CO<sub>2</sub> runs, divided by the vertical integral between 0 m and 2000 m. Units are dimensionless ("DL"). (c) Change of the temperature profiles in the CMIP3 models during the observational record (Levitus et al., 2012, "Lev12"), scaled as in (b). Shown is the difference of a 20-year average (2000 to 2019) from the SRES A1B runs minus a 20-year average from 20C3M (1945-1964). Two models (red, orange) overestimate surface warming because of their too small total heat uptake. To some extent, a few models capture the surface intensification ("SFI" [light green]: bccr\_bcm2\_0, gfdl\_cm2\_0, gfdl\_cm2\_1, miub\_echo\_g, mri\_cgcm2\_3\_2a) seen in the observations (dash-dotted). Also note the shallow subsurface maximum warming in observations, but not in models, for which we have no explanation.

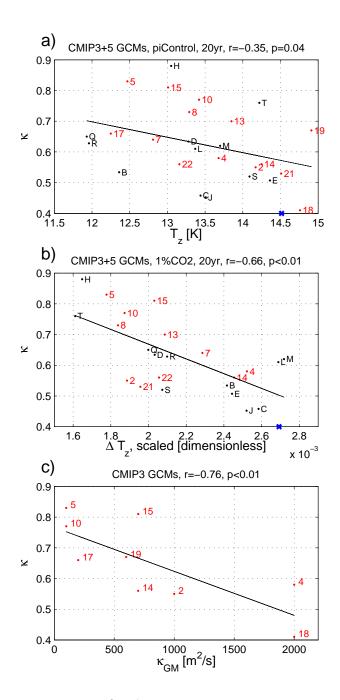


Figure 3: The ocean heat uptake efficiency  $\kappa$  [W m<sup>-2</sup> K<sup>-1</sup>] against (a) the globally averaged vertical temperature difference  $T_z$  in the control runs, (b) its change  $\Delta T_z$  in the 1%/year CO<sub>2</sub> runs, scaled with the total warming, and (c) the quasi-Stokes diffusivity parameter  $\kappa_{GM}$  for those CMIP3 models where it is a constant. The black lines are regression lines. The CMIP3 models have red numbers while the CMIP5 models have black letters (see Table S1 for key). Blue crosses on the horizontal axis denote the values of  $T_z$  from WOA05 and of  $\Delta T_z$  from Levitus et al., 2012.

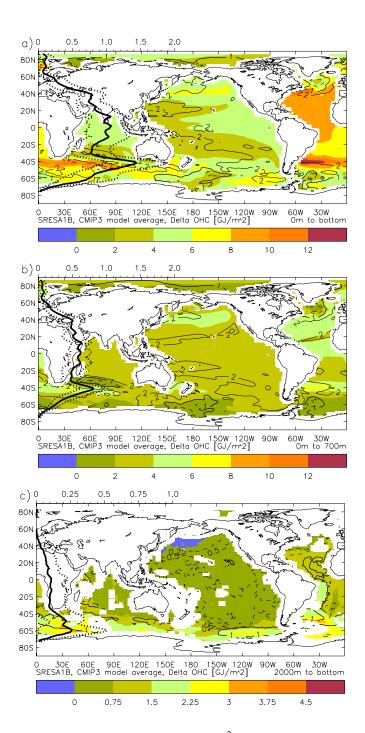


Figure 4: Vertically integrated ocean heat uptake (colour shading; in GJ m<sup>-2</sup>) in the ensemble average of the SRES A1B scenario of 17 CMIP3 models for (a) the total water column, (b) the upper 700 m and (c) below 2000 m. Thick black line: zonal total in  $10^{15}$  J m<sup>-1</sup> (scale in the upper left corner), with  $\pm 1$  standard deviation (dotted). Note the different scales in (c). Black contours show the ratio R of ensemble mean and ensemble standard deviation (solid: R > 1, thick solid: R = 1, dashed: R < 1). For (a) and (b), R > 1 in most areas indicating agreement across models. An exception are the deep-water formation regions in the Southern Ocean and the North Atlantic. In (c) the models mainly show OHU in the Southern Ocean.