

Geophysical Research Letters®



RESEARCH LETTER

10.1029/2025GL116305

Key Points:

- The Ocean Heat Uptake Efficiency (OHUE) has notably increased over recent decades, as evidenced by observations and model simulations
- This increase of OHUE is closely associated with the eruption of Mount Pinatubo (1991)
- Following the eruption, a gradual ocean recovery leads to a peak in OHUE around year 2000

Supporting Information:

Supporting Information may be found in the online version of this article.

Correspondence to:

J.-R. Shi,
jia-rui.shi@nyu.edu

Citation:

Shi, J.-R., Zanna, L., & Adcroft, A. (2025). The impact of natural external forcing on ocean heat uptake efficiency since the 1980s. *Geophysical Research Letters*, 52, e2025GL116305. <https://doi.org/10.1029/2025GL116305>

Received 4 APR 2025

Accepted 22 AUG 2025

Author Contributions:

Conceptualization: Jia-Rui Shi,

Laure Zanna, Alistair Adcroft

Formal analysis: Jia-Rui Shi

Funding acquisition: Laure Zanna




Investigation: Jia-Rui Shi

Methodology: Jia-Rui Shi

Writing – original draft: Jia-Rui Shi

Writing – review & editing: Jia-Rui Shi,
Laure Zanna, Alistair Adcroft

The Impact of Natural External Forcing on Ocean Heat Uptake Efficiency Since the 1980s

Jia-Rui Shi¹ , Laure Zanna^{1,2} , and Alistair Adcroft³ 

¹Courant Institute of Mathematical Sciences, New York University, New York, NY, USA, ²Center for Data Science, New York University, New York, NY, USA, ³Princeton University Atmospheric and Oceanic Sciences Program, Princeton, NJ, USA

Abstract We investigate the temporal evolution of ocean heat uptake efficiency (OHUE) using observations and large ensemble model simulations. OHUE, defined as the ratio of ocean heat uptake rate to changes in global mean surface temperature anomalies, has exhibited significant variability over recent decades. We found a relatively low OHUE in the late 1980s, a peak around 2000, and a subsequent decline. A key finding is the significant influence of volcanic eruptions, particularly the 1991 Mount Pinatubo eruption, which caused abrupt cooling followed by a gradual recovery, leading recent variation of OHUE. Moreover, the Southern Ocean is becoming less efficient at absorbing heat into interior ocean in recent period associated with increased stratification. These results highlight the role of natural external forcing in climate dynamics and the importance of mid-latitudes in global OHUE variability, underscoring the need for idealized experiments to quantify the potential effects of future volcanic eruptions on OHUE.

Plain Language Summary We examine how efficiently the ocean has been absorbing heat from the Earth's surface to slowdown the global warming over the past few decades. Over recent decades, this efficiency has shown notable variability. A significant finding from our study is the influence of natural events, such as volcanic eruptions. We found that the efficiency has varied over time, showing a notable increase following the 1991 Mount Pinatubo volcanic eruption, peaking around the year 2000, and then declining. Our analysis of observations and climate model simulations indicates that natural events like volcanic eruptions significantly influence how efficiently the oceans absorb heat. We identified that the mid-latitude regions play a crucial role in driving these variations. Additionally, the Southern Ocean has become less efficient at absorbing heat into the ocean interior ocean in recent periods, associated with increased stratification that restricts the penetration of heat into deeper layers. These findings emphasize the importance of mid-latitude processes and the role natural external forcing in climate studies to improve the accuracy of future climate predictions.

1. Introduction

The ocean plays a central role in regulating the Earth's climate by absorbing more than 90% of the excess energy caused by anthropogenic greenhouse gas emissions (Cheng et al., 2017; Rhein et al., 2013). The extent to which these processes efficiently sequester heat from the ocean surface partially determines the rate of surface warming. Ocean Heat Uptake Efficiency (OHUE, $\text{W m}^{-2} \text{K}^{-1}$), defined as the rate of ocean heat uptake per degree of change in the global-mean surface temperature (Gregory & Mitchell, 1997; Raper et al., 2002), is critical in moderating the pace of global warming. Therefore, OHUE is a key metric for understanding the ocean's buffering capacity against anthropogenic forcing.

In previous studies, OHUE has been considered as a single number by a given model, quantified in strongly forced scenarios. The factors found to influence or at least correlate with OHUE have been wide-ranging, and include ocean stratification, pycnocline depth, Atlantic meridional overturning circulation, ocean ventilation, mesoscale eddy diffusivity, and vertical diffusivity (e.g., Bourgeois et al., 2022; Kuhlbrodt & Gregory, 2012; Marshall & Zanna, 2014; Newsom et al., 2023; Saenko et al., 2018; Vogt et al., 2025; Winton et al., 2014). For instance, there are notable correlations between the Atlantic meridional overturning circulation strength and OHUE (Kostov et al., 2014; Winton et al., 2014). This correlation is found to be due to the shared dependence on the transient ocean eddies (Saenko et al., 2018). From a more generalized perspective on regional influences, it has been found that the OHUE is primarily controlled by mid-latitude ventilation strength in the background climate, which is itself related to pycnocline depth and stratification (Newsom et al., 2023). The pycnocline can serve as a proxy for

© 2025. The Author(s).

This is an open access article under the terms of the [Creative Commons Attribution License](https://creativecommons.org/licenses/by/4.0/), which permits use, distribution and reproduction in any medium, provided the original work is properly cited.

mid-latitude ventilation depth in the background state, and these same ventilation processes contribute most significantly to the global OHUE under anthropogenic forcing.

However, OHUE is not constant over time; it changes in response to a combination of internal ocean processes, external climate forcing, and feedback mechanisms (Gregory et al., 2015). These changes in OHUE may have profound implications for the pace of climate change and the predictability of future warming. Recent studies have highlighted significant changes in OHUE over the historical periods (Cael, 2022; Sohail et al., 2023). For instance, OHUE increased over the past five decades since 1970 by $0.19 \pm 0.04 \text{ Wm}^{-2} \text{ K}^{-1}$ and was on average $0.58 \pm 0.08 \text{ Wm}^{-2} \text{ K}^{-1}$ during this period (Cael, 2022). This rate of change has been diagnosed from the observed ocean heat content and global temperature records. Based on climate models, Sohail et al. (2023) focused on the anthropogenic effects over the historical period, such as greenhouse gas and anthropogenic aerosol emissions, on the changes in OHUE. In aerosol-only simulations, the OHUE has declined by $43 \pm 14\%$ since 1980, and is suggested to be linked to the slowdown of aerosol forcing during this period. The associated pattern is characterized by the reduction of OHUE in the tropics and subtropics, while it remains efficient in polar and sub-polar regions (Sohail et al., 2023). It is worth noting that the surface temperature response to volcanic forcing is much smaller than the response to 1% CO_2 increase scenario (Gregory & Forster, 2008; Held et al., 2010). Gregory et al. (2016) confirmed Held et al.'s (2010) finding that this difference primarily stems from the thermal inertia of the upper ocean, which damps the effect of short-lived forcing. Importantly, this discrepancy can also be linked to the differing responses of OHUE to various forcing scenarios.

This study focuses on the temporal evolution and external drivers of OHUE change during recent decades in observations and models. By analyzing simulations from the CMIP6 archive and associated single-forcing experiments from DAMIP (Detection and Attribution Model Intercomparison Project), we seek to unravel the mechanisms behind the recent evolution of OHUE and their broader climate implications. The findings aim to advance our understanding of the ocean's role in moderating global warming and contribute to reducing uncertainties in climate projections.

2. Materials and Methods

2.1. Observational Data Sets

We use two gridded data sets of observed ocean potential temperature. These are data sets from Institute of Atmospheric Physics (IAP) and the subsurface temperature analysis led by Ishii (hereafter Ishii). The IAP ocean potential temperature analysis has a horizontal resolution of $1^\circ \times 1^\circ$ with 41 vertical levels from the surface down to 2,000 m and spans the period 1940 to 2022 (Cheng et al., 2018). The subsurface temperature analysis from Ishii has a horizontal resolution of $1^\circ \times 1^\circ$ with 28 vertical levels from the surface down to 3,000 m and spans the period from 1955 to the present (Ishii et al., 2005). The upper 2,000 m OHC is calculated based on these data sets.

Additionally, we use a reconstruction based on the Green's Function (GF) method which estimates the ocean temperature field (Wu et al., 2025; Zanna et al., 2019). The GF method utilizes a kernel derived from ocean tracer observations and surface “excess” temperature as the boundary condition, where “excess” excludes SST changes due to ocean circulation change. Therefore, the results from GF method would be different from observations and other CMIP6 runs in representing regional climate responses that are strongly influenced by the ocean circulation changes excluded by this methodology. There are 12 GF kernels estimated from ocean tracer observations, three observational data sets for global SST, and two excess temperature fields from simulations, resulting in 72 members for the GF OHC estimate. More details are in Wu and Gregory (2022) and Wu et al. (2025).

For surface air temperature, we use the HadCRUT5 data set, a widely used global temperature record that combines both in situ and satellite-based measurements (Morice et al., 2021a, 2021b). Covering the period from 1850 to the present, HadCRUT5 allows for a thorough comparison of model-derived surface temperature changes over the historical period.

2.2. Large-Ensemble Simulations and Single-Forcing Experiments

This study uses the outputs from Phase 6 of the Coupled Model Intercomparison Project (CMIP6), focusing on simulations from 6 selected models (ACCESS-ESM1-5, CNRM-CM6-1, CanESM5, IPSL-CM6A-LR, MIROC6, MPI-ESM1-2-LR) that have large ensemble simulations (≥ 25 members; Eyring et al., 2016). We also utilize the 50-member sub-ensemble, which follows the original CMIP6 biomass burning protocol, of the CESM2 large

ensemble simulations (CESM2LE; Rodgers et al., 2021), in this study. These 7 models together provide outputs from the historical all-forcing (HIST) simulations, which include all major external forcings. In addition, the study also examines the results from single-forcing experiments from DAMIP (Gillett et al., 2016) from these models, to which isolate the impact of individual forcings, namely greenhouse gases (GHG), anthropogenic aerosols (AER), and natural forcings like volcanic aerosols and solar irradiance (NAT) or everything else evolving in CESM2LE (Simpson et al., 2023). The number of realizations from each model is provided in Table S1 of Supporting Information S1. These experiments aim to quantify the contributions of each forcing to changes in OHUE.

We utilize the ocean potential temperature and surface air temperature at 2 m from models. The ocean heat content (OHC) in the upper 2,000 m is obtained by vertically integrating the temperature field and multiplying by reference values of density ($1,025 \text{ kg m}^{-3}$) and specific heat ($4,000 \text{ J kg}^{-1} \text{ K}^{-1}$). Model drift in OHC is removed by subtracting a cubic polynomial fit based on the preindustrial control run over its full length in time for each model (Irving et al., 2020). All model output has been interpolated to a regular $1^\circ \times 1^\circ$ grid.

2.3. Ocean Heat Uptake Efficiency

Ocean Heat Uptake Efficiency (OHUE) is Defined as:

$$\text{OHUE} = \frac{\Delta N}{\Delta T} \quad (1)$$

where ΔN is the global-mean rate of ocean heat uptake, and ΔT is the global-mean surface air temperature change (GMST). The unit of OHUE is in $\text{W m}^{-2} \text{ K}^{-1}$, representing the efficiency with which the ocean absorbs heat relative to changes in GMST. We use the long-term trend of upper 2,000 m ocean heat content as introduced above to estimate ΔN . This approach is based on the assumption that nearly all the heat storage change occurs within the upper 2,000 m which allows for a comparison between observations and models. The results presented in the main text are based on a 20-year window for calculating the OHC tendency. In our calculations, we also apply a 20-year running mean to ΔT . We conduct a sensitivity test varying the length of the window. The OHC and GMST are bulk global metrics. We further apply this approach to access the contributions from different external forcings and regions (see Sections 3.2 and 3.3).

3. Results

3.1. Historical Evolution of Ocean Heat Uptake Efficiency

The historical ocean heat uptake efficiencies (OHUE), obtained over two-decade time windows from observations and CMIP6 historical runs, are shown in Figure 1a. The OHUE from observations is within the range of $0.4\text{--}1.0 \text{ W m}^{-2} \text{ K}^{-1}$. The spread of results based on the Green's Function (GF) method is approximately $0.3\text{--}1.3 \text{ W m}^{-2} \text{ K}^{-1}$, influenced by the choice of SST patterns and the prior estimate of the GF. The simulated OHUE from 7 models with large-ensemble simulations is found to be approximately $0.3\text{--}1.0 \text{ W m}^{-2} \text{ K}^{-1}$, and matches the observed OHUE magnitude. The historical OHUE in this study is consistent with previous estimates based on observations and models (Cael, 2022; Kuhlbrodt & Gregory, 2012; Newsom et al., 2023; Sohail et al., 2023).

Importantly, there is a remarkable variation in OHUE over recent decades (Figure 1a): the value is relatively low during the late 1980s, rose to peak around the year 2000 at $0.8 \text{ W m}^{-2} \text{ K}^{-1}$ from GF, and then decreased back to around $0.6 \text{ W m}^{-2} \text{ K}^{-1}$ by 2011 (i.e., 2001–2020 period). It indicates that the ocean has just passed its most efficient period for absorbing heat from the atmosphere per unit of global surface temperature increase. The ensemble mean results from the models can capture this temporal feature. We also conducted a sensitivity test regarding the window length used to calculate OHUE (see Figure S1 in Supporting Information S1). Longer windows (25-year, 30-year) naturally yield smoother results and dampen the variability associated with the Pinatubo eruption. For the remainder of the study, we focus on results based on the 20-year window, as it approximately corresponds to the time needed for ocean temperatures to recover to pre-eruption levels (Figure 2e).

We show the two results centered at the years 1988 and 2000 to evaluate whether the changes in OHUE are statistically significant between these periods. We found that 6 out of 7 models show a significant increase, with

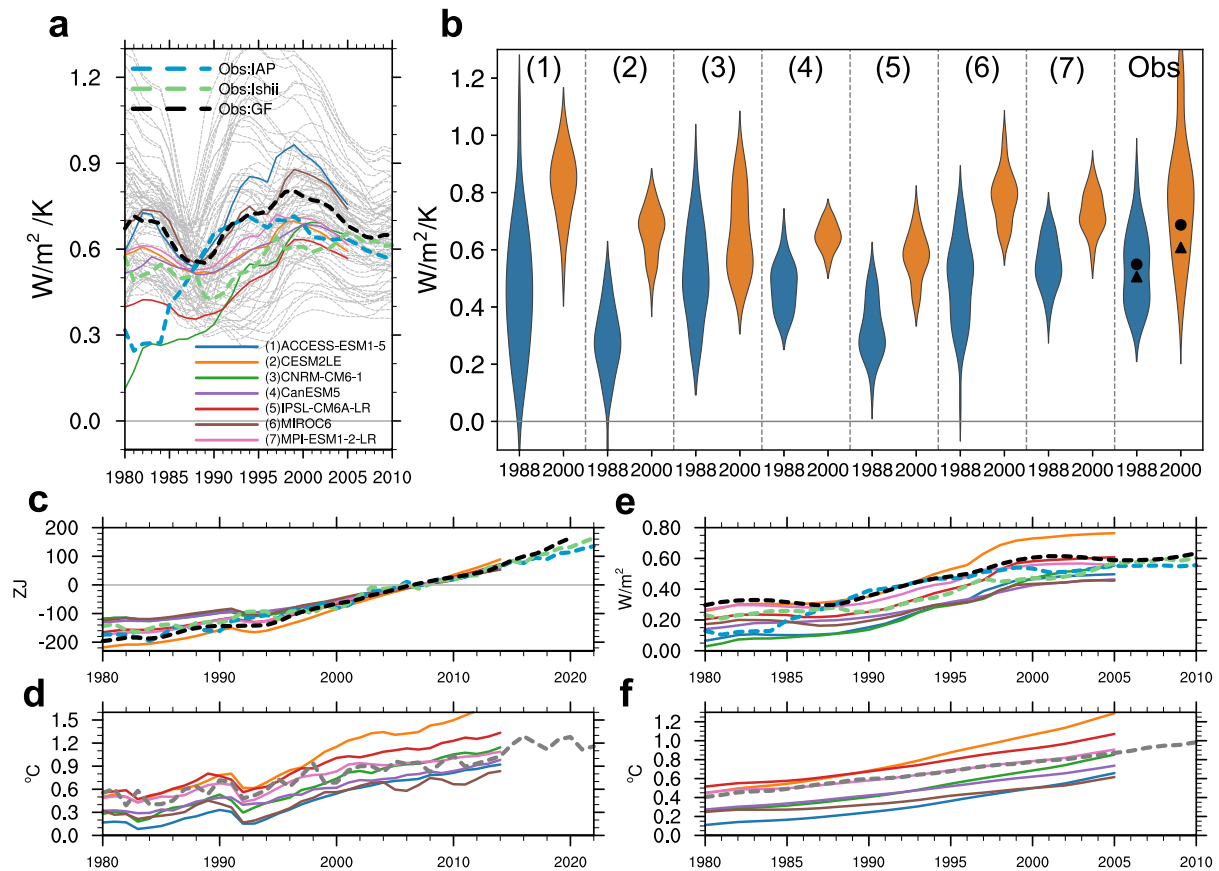


Figure 1. Time evolution of ocean heat uptake efficiency (OHUE) and associated variables from observations and CMIP6 large-ensemble simulations. (a) Time evolution of OHUE over a 20-year sliding window. The x-axis shows the centered year of the 20-year window. The results represent the ensemble mean from each model. (b) Distributions of OHUE from 1978 to 1997 (centered at 1988) and 1990–2009 (centered at 2000). The number in parentheses refers to the CMIP6 model (see Table S1 in Supporting Information S1). For the observations (Obs), the distribution is from 72 members from GF, circles represent IAP data, and triangles represent Ishii data. (c, d) Time evolution of global ocean heat content (OHC) and global mean surface temperature (GMST), respectively. The dashed gray curve is the GMST from HadCRUT5. (e) Ocean heat uptake rate, calculated as the 20-year trend of OHC. (f) 20-year running mean of GMST. As is panel (a), the x-axis in (e, f) indicates the centered year.

p-values less than 0.01, except for model CNRM-CM6-1 (Figure 1b). The CNRM-CM6-1 model uniquely exhibits a long-term cooling drift prior to significant GHG-induced warming, unlike other models studied (Figure S2 in Supporting Information S1). This behavior likely contributes to its insignificant change in OHUE, as this cooling drift dampens the heat uptake. Like most models, the observed OHUE change between the 1988 and 2000 periods based on GF is also significant. The increase in OHUE is $0.29 \pm 0.10 \text{ Wm}^{-2} \text{ K}^{-1}$, based on the multi-model mean of six models and their standard deviation. Moreover, the relative change and the corresponding cross-model uncertainty is $+67\% \pm 35\%$. These results from the multi-model ensemble mean illustrate that the temporal feature reflects a forced response. The observed OHUE increase is $0.13 (+25\%)$, $0.11 (+20\%)$, and $0.23 (+41\%) \text{ Wm}^{-2} \text{ K}^{-1}$ from the IAP data set, Ishii data set, and GF, respectively. In addition, the decrease between 2010 and 2000 based on GF is also significant (not shown).

The ocean heat content (OHC) and global mean surface temperature (GMST) anomalies have steadily increased since 1980, with temporary dips caused by the volcanic eruptions of El Chichón and Pinatubo (Figures 1c and 1d). The ocean heat uptake rate ($\partial \text{OHC} / \partial t$; Figure 1e), compared with the nearly linear increase in the 20-year running mean of the GMST anomaly (ΔT ; Figure 1f), plays a dominant role in driving the recent variation in OHUE. Therefore, we next focus on the variations in the ocean heat uptake rate in response to different external forcings, such as volcanic eruptions, greenhouse gas (GHG), and anthropogenic aerosol (AER) emissions.

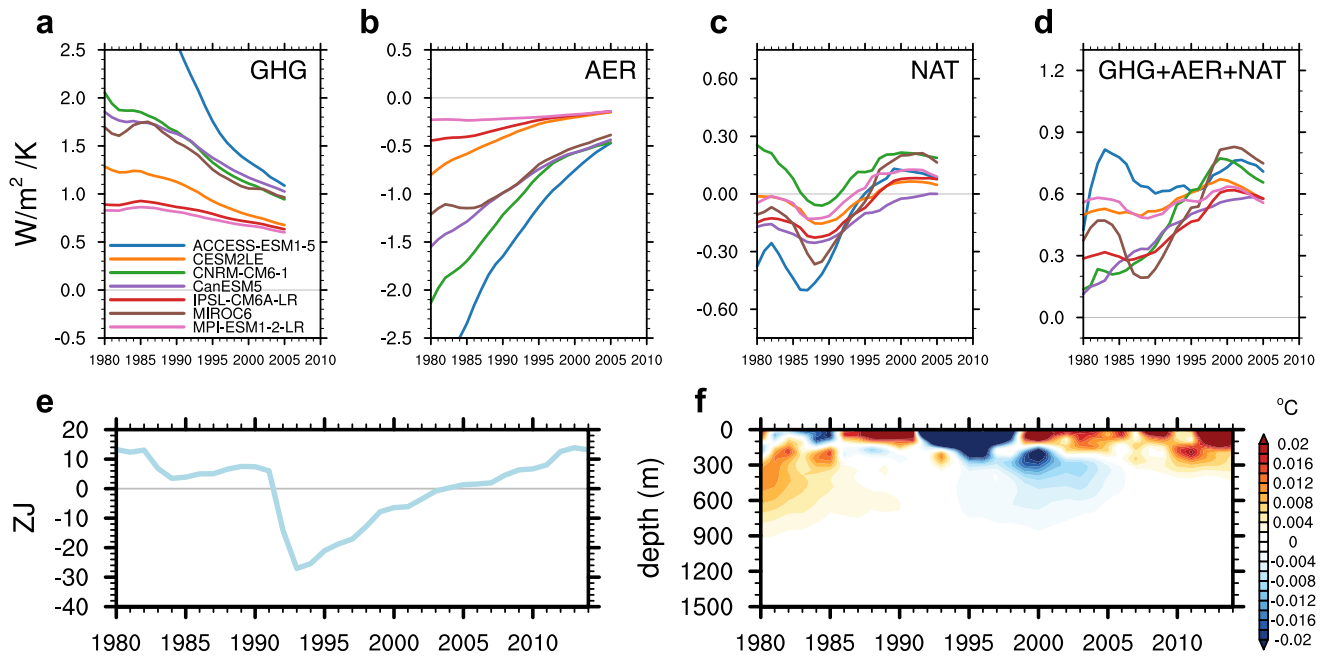


Figure 2. Contributions of single forcings to OHUE and ocean temperature during the historical period. (a, b, c) OHUE calculated using the ocean heat uptake rate from single-forcing experiments: greenhouse gases (GHG), aerosols (AER), and natural forcing (NAT). (d) Linear combination of OHUE derived from three single-forcing experiments. (e, f) Global OHC anomaly and vertical profile of global mean ocean temperature anomaly relative to the 1980–2014 mean from MIROC6 model from NAT-only experiment.

3.2. Contributions From Individual Forcings

It is important to note that historical OHUE is not a straightforward linear combination of GHG-only, AER-only, and NAT-only forcings. However, both ΔN and ΔT from the historical experiment can be expressed as linear combinations of different forcings (Sohail et al., 2023). We fix the denominator, ΔT , using values from the historical experiment and attribute contributions of individual forcings based on their influence on ocean heat uptake. In Equation 2, the subscripts HIST, GHG, AER, and NAT refer to results from all-forcing, greenhouse gas-only, aerosol-only, and natural-external-only forcing experiments, respectively:

$$\frac{\Delta N_{\text{HIST}}}{\Delta T_{\text{HIST}}} = \frac{\Delta N_{\text{GHG}} + \Delta N_{\text{AER}} + \Delta N_{\text{NAT}} + \text{Res}}{\Delta T_{\text{HIST}}} \quad (2)$$

The main goal of this section is not to perfectly close the OHUE equation but rather to use it as a framework to identify which external forcing leads to the temporal features in historical OHUE. Although the GHG-induced global OHC continues to increase, its ratio to the ΔT (i.e., OHUE) is gradually decreasing over time (Figure 2a). The aerosols give rise to negative OHUE associated with its cooling effect in the ocean (Boland et al., 2022; Shi, Kwon et al., 2023; Shi, Wijffels et al., 2023), which offsets some of the ocean warming from GHGs (Figure 2b). Both the GHG- and AER-induced changes are quite linear, without exhibiting the observed variation. The NAT-only experiment shows a distinct drop between 1985 and 1990, followed by an increase thereafter (Figure 2c), closely matching the observed temporal feature. The linear combination of these components imprints natural forcing effects resulting from the compensation between GHG- and aerosol-driven changes. The decrease after the year 2000 is stronger in the combined OHUE than in the NAT experiment (Figures 2c and 2d).

Volcanic aerosol loading is the dominant driver of natural external forcing, with the 1991 Mount Pinatubo eruption standing out as a particularly significant event. This eruption, much stronger than other recent volcanic events, had notable impacts on the Earth's energy imbalance and ocean heat uptake (Allan et al., 2014; Gleckler et al., 2006; Santer et al., 2019; Smith et al., 2016). The OHC anomaly and vertical temperature profile (Figures 2e and 2f) reveal a sharp decline in temperature following the eruption and the penetration of cooling signal to the

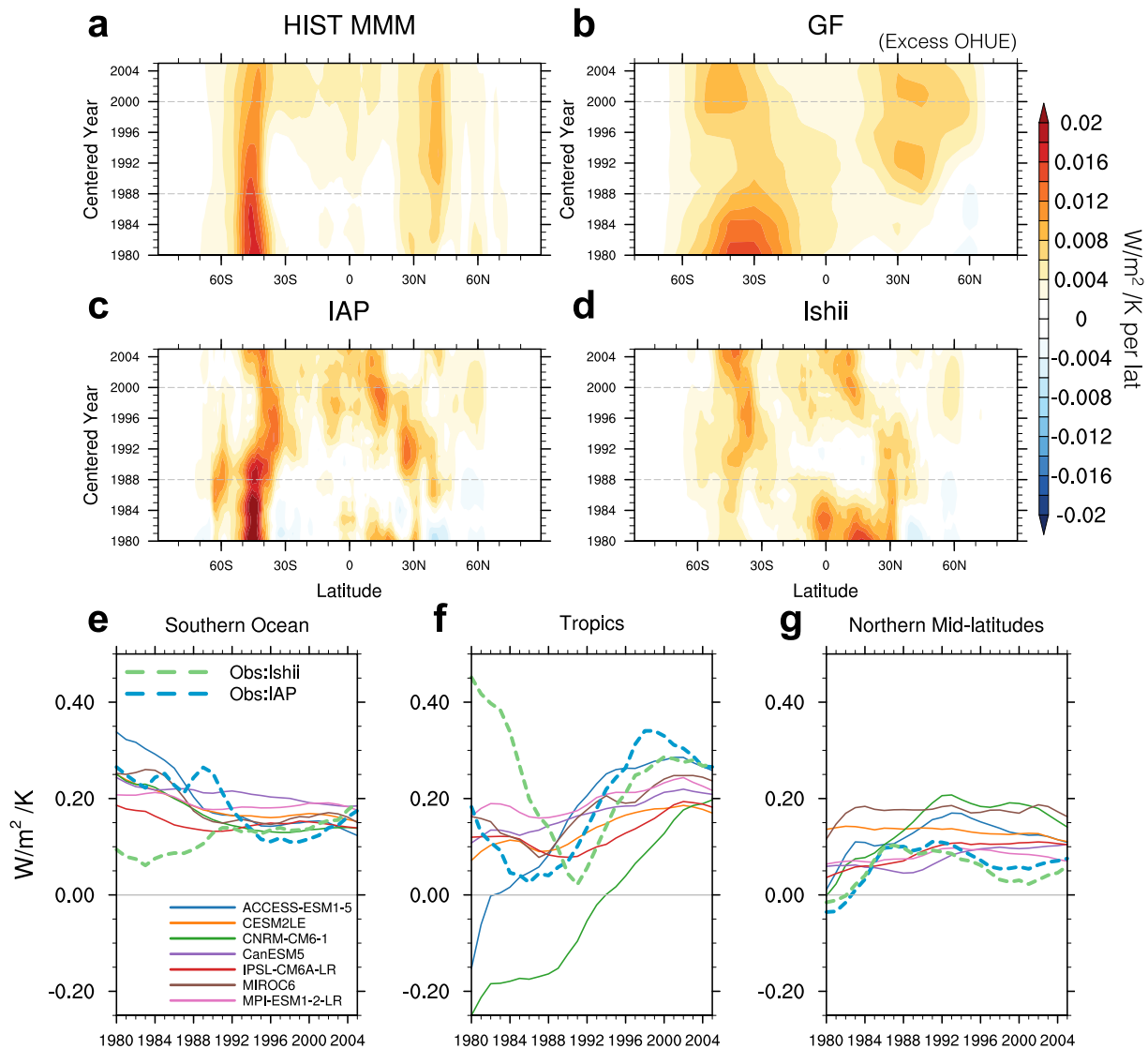


Figure 3. Regional OHUE from models and observations. (a–d) OHUE as a function of time and latitude from HIST multi-model mean (MMM), Green's Function (GF), IAP, and Ishii products. The y-axis shows the centered year of the 20-year window. The unit is $Wm^{-2} K^{-1}$ per 1° latitude band. The regional OHUE based on GF is obtained by using excess temperature without influence of ocean circulation change. (e–g) Time evolution of regional OHUE from Southern Ocean ($35^\circ S$ – $55^\circ S$), tropics ($25^\circ S$ – $25^\circ N$), and Northern mid-latitude ($30^\circ N$ – $50^\circ N$).

deeper layer, reaching its minimum around 1993, followed by a slower recovery phase (Santer et al., 2007; Takahashi & Watanabe, 2016). The relaxation time scale is approximately 10 years for the surface and upper ocean, while it extends from several decades to a century associated with the penetration of cold anomalies to the deeper ocean layers (Dogar et al., 2020; Stenchikov et al., 2009). Results across all models consistently show this temporal evolution of ocean heat uptake to natural external forcing (Figure S3 in Supporting Information S1). Notably, the Pinatubo-induced ocean heat uptake mainly contributes to the ocean warming rate (Figure 1e) and the recent variation in the OHUE (Figures 1a, 2c and 2d), reflecting a long-lasting volcanic signal in the ocean and its impact on the climate system.

3.3. Regional Responses

The evolution of OHUE can be decomposed into different latitude bands to find their contributions to global change. For example, the latitudinal components of OHUE can be expressed as:

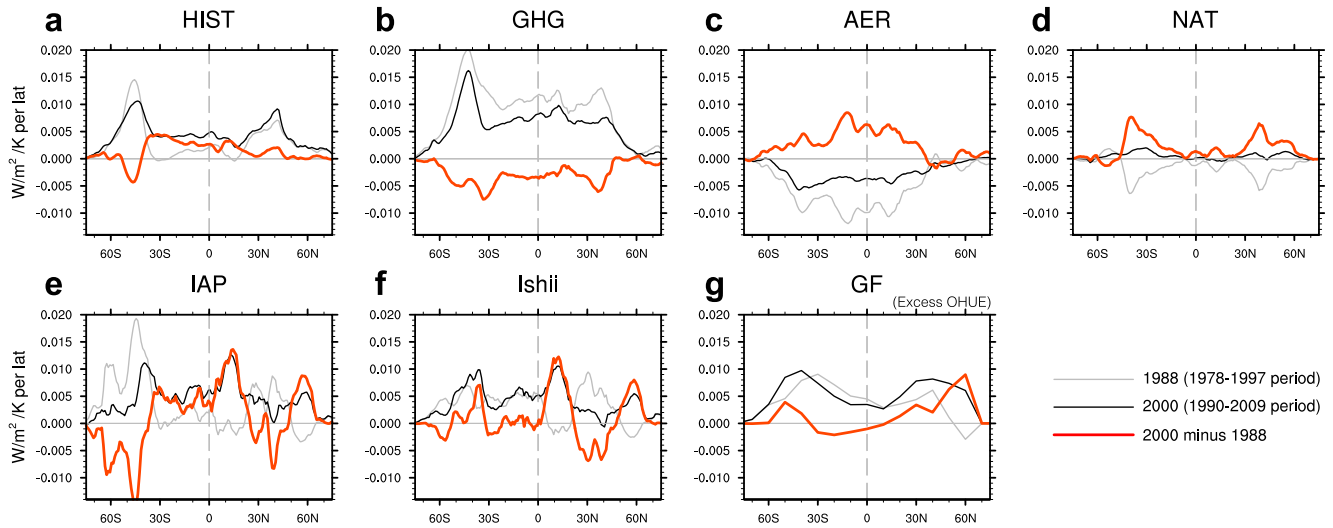


Figure 4. OHUE change between the 2000 period and 1988 period. The top row shows the OHUE change from multi-model mean from HIST, GHG, AER, and NAT, respectively. The bottom row shows the results from IAP, Ishii data sets, and as well as the excess OHUE based on GF.

$$OHUE_{lat_i} = \frac{1}{A_G} \frac{\int_{y=0}^{y=1} \int \Delta N(x, y) dx dy}{\Delta T_G} \quad (3)$$

In this equation, A_G and ΔT_G represent the global surface area and the GMST anomaly, respectively. $\Delta N(x, y)$ is the regional heat uptake rate. The global sum of $OHUE_{lat}$ equals the global OHUE, as discussed previously. Here, we focus on the regional contributions of ocean heat uptake to the changes in global OHUE.

The mid-latitudes play a leading role in contributing to the time-mean global OHUE, with consistency shown across models and data sets (Figure 3 and Figure S4 in Supporting Information S1). For instance, two strong bands of positive values are located in the Southern Ocean, particularly between 35°S and 55°S, and between 30°N and 50°N in the Northern Hemisphere. The subtropical North Atlantic and the region to the north of the Kuroshio Front both contribute to responses in the Northern Hemisphere (Figure S5 in Supporting Information S1). These results indicate a substantial heat gain in the mid-latitude ocean basins, compared to the rest of the global ocean (Frölicher et al., 2015; Newsom et al., 2020; Shi et al., 2018; Zanna et al., 2019), more efficiently mitigating the global surface warming.

Regarding the long-term change, our simulated results show greater consistency with the IAP data set, particularly in the Southern Ocean and the tropical region. For instance, the decrease of regional OHUE is evident in the Southern Ocean from the ensemble mean of each model and IAP product (Figure 3). It suggests that the Southern Ocean has become less efficient in taking up heat in recent decades. Specifically, the Pearson correlation between the IAP data set and the models is 0.63 ± 0.20 in the Southern Ocean and 0.85 ± 0.07 in the tropical regions, and the uncertainty is defined as 1 standard deviation across models. In contrast, we observe a strengthening of OHUE in the Southern Ocean and a negative correlation when using the Ishii product, with much smaller correlations between Ishii and the models in the tropics at 0.04 ± 0.30 . This discrepancy seems to stem from substantial differences across observational data sets before the 1990s due to sparse regional observations (Shi et al., 2021; Swart et al., 2018). In the Northern Hemisphere mid-latitudes, neither data set nor model shows a clear long-term trend in OHUE.

The results based on GF reflect the excess temperature changes and the associated OHUE, excluding the redistribution of heat due to changes in ocean circulation. Therefore, there is a substantial difference between the two data sets and model simulations when investigating the regional features. The excess OHUE derived using GF shows a notable contribution from the mid-latitudes. The broader distribution in GF, compared with the other data sets and models, is primarily due to its coarse resolution (10° in latitude). The enhanced OHUE in the Northern Hemisphere is more consistent with the MMM results (Figures 3 and 4). This increase mainly occurs in the North Atlantic (Figure S6 in Supporting Information S1). The dipole feature observed in the IAP and Ishii data

sets (Figure S6 in Supporting Information S1) suggests that ocean circulation changes, such as the Atlantic Meridional Overturning Circulation (AMOC), also play a role in this ocean basin. In addition, the rise in OHUE around 15°N is evident in the IAP and Ishii products but not in GF (Figure 4), which may reflect the influence of ocean circulation changes in this region.

The historical results can be decomposed into contributions from GHG, AER, and NAT forcing (Figure 4). In both GHG and AER, OHUE weakens (i.e., moves closer to zero) from the 1988 period to the 2000 period, as shown in Figures 2a and 2b. The positive response in AER is more pronounced in the tropical latitudes, which could be linked to the geographic distribution of anthropogenic aerosol forcing. Although natural external forcing is often overlooked in long-term climate change due to its smaller magnitude relative to GHG and AER forcings, its effect on regional OHUE change is comparable to that of the other two forcings (Figure 4d). The zonal pattern indicates that the NAT-forced change is mainly affected by the ocean heat uptake in both mid-latitudes, which resembles the GHG-induced pattern (Figure 4b). In addition, the positive change in NAT is primarily due to the ocean temperature decrease during the Pinatubo eruption period (gray curve in Figure 4d). For the comparison between the historical runs and the observational data sets, the correlation of OHUE change (red curves) between the HIST runs and the IAP product is 0.61, while that with the Ishii product is 0.13.

The OHUE change maps from the IAP and Ishii data sets reveal a strong positive change in the western Pacific and Indian Ocean, along with a negative change in the eastern Pacific, and dipolar pattern in the North Atlantic—features not clearly present in the ensemble mean of the models (Figure S6 in Supporting Information S1). This discrepancy between observations and models suggests that internal climate variability may play an important role. To further investigate this, we constructed regional indices and evaluated their distribution across all ensemble members from multiple models (Figure S7 in Supporting Information S1). We then compared the observed values to the ensemble-derived normal distributions to quantify the likelihood of the observed features arising from internal variability. These results suggest that internal variability can potentially contribute to the observed regional features, as the observed indices do not fall in the tails of the ensemble distribution (e.g., $\leq 5\%$). This potential influence of internal variability on the difference between modeled changes and observations is consistent with findings from previous studies (Po-Chedley et al., 2022; Watanabe et al., 2021). However, we note that the agreement does not preclude the influence of external forcing or model structural biases, which may also play a substantial role in model-observation difference (Schneider & Deser, 2018; Wills et al., 2022). This large internal variability—often exceeding the magnitude of the forced response (Figure S8 in Supporting Information S1)—presents a challenge in isolating the forced response from the spatial maps.

4. Summary and Discussions

In this study, we investigate the historical evolution of ocean heat uptake efficiency (OHUE), defined as the ratio of ocean heat uptake rate to changes in global mean surface temperature (GMST), using both observations and CMIP6 model simulations. We observed a relatively low OHUE in the late 1980s, a peak around 2000, and a subsequent decline until now. Simulations from seven models with large-ensemble simulations generally matched observational OHUE variation from in situ measurements and based on a Green's Function approach, confirming an externally forced response in OHUE.

This work fills a gap in our understanding of the significant influence of natural external forcings, particularly volcanic eruptions, on the temporal variability in OHUE. Specifically, the 1991 Mount Pinatubo eruption caused a significant decline in OHUE, followed by a recovery period, indicating a lasting volcanic effect on ocean heat uptake and its efficiency. This is a critical aspect that has been largely overlooked in previous studies and demonstrates the long-lasting impacts of volcanic events on OHUE. The changes in OHUE due to greenhouse gas (GHG) and aerosol (AER) forcings are more linear, largely compensating each other, and do not exhibit the observed change. In terms of the two-layer model (e.g., Gregory et al., 2024), a sudden volcanic forcing rapidly extracts heat from the upper layer, which has a relatively small heat capacity and receives little contribution from the lower layer. After the volcanic event, the upper layer warms again over a few years (Figures 2e and 2f). The large OHUE of the upper layer reflects both the volcanic cooling and the subsequent warming. In contrast, for forcings that change gradually on decadal timescales, OHUE is mainly determined by the thermal coupling between the two layers. Therefore, OHUE should be regarded as a diagnostic of the global system, which depends on the forcing scenario, rather than as a “built-in” parameter of it.

The substantial increase in global OHUE since the 1980s found in this study confirms previous findings based on different methods (Cael, 2022; Watanabe et al., 2013). In this study, we replicate the global OHUE increase from multiple data sets, although our methods differ from those used in these studies. We show that the observed global OHUE increase from 1988 to 2000 by 0.13 (+25%), 0.11 (+20%), and 0.23 (+41%) $\text{W m}^{-2} \text{K}^{-1}$ from the IAP data set, Ishii data set, and GF, respectively. Watanabe et al. (2013) used the global energy balance equation to estimate observed ocean heat uptake, given the radiative forcing and climate feedback parameters estimated from CMIP5 models. The observed OHUE increased from approximately 0.6 $\text{W m}^{-2} \text{K}^{-1}$ during 1971–2000 to around 2.1 $\text{W m}^{-2} \text{K}^{-1}$ during 1991–2012. This increase (+1.5 $\text{W m}^{-2} \text{K}^{-1}$) appears somewhat overestimated compared to other studies which report a range of 0.5–1.0 $\text{W m}^{-2} \text{K}^{-1}$ (Kuhlbrodt & Gregory, 2012; Newsom et al., 2023). Cael (2022) integrated the GMST rather than calculating the trend of OHC to estimate the observed OHUE, assuming that the rate of increase remained constant over the integration period. The magnitude of change reported by Cael (2022), +0.83% per year since 1970 with a base value of 0.48 $\text{W m}^{-2} \text{K}^{-1}$, is similar to our findings. While the increase in OHUE has been strong during certain periods, we show that it has already passed its peak value and is now trending downward. This temporal variation is also observed in Sohail et al. (2023; Figure 2f herein), though their focus is on the effect of anthropogenic aerosols, without considering the role of natural external forcing.

The global OHUE derived from observations falls within the range of model results (Figure 1). The inter-model variability in the ocean warming rate and GMST anomaly appears to be influenced by differences in equilibrium climate sensitivity (ECS). For example, CanESM5, with the largest ECS (5.6°C from Meehl et al., 2020), provides the highest values in warming rate and GMST anomaly by the end of the analysis year, and MIRCO6, with the smallest ECS (2.6°C), shows the lowest values (Figures 1e and 1f). However, the effect of ECS on OHUE is not as evident (Figure 1a). Although ECS is an important factor in determining the ocean warming rate and GMST anomaly, its influence on OHUE appears to be less pronounced, potentially due to other oceanic processes such as circulation or heat distribution that vary across models. Further analysis is needed to understand the underlying mechanisms.

The vertical profile of ocean temperature responses (Figure S3 in Supporting Information S1) also shows some inter-model differences. For instance, the penetration of the volcano-eruption-related cooling signal is shallower in CanESM5 compared to the other models (Figure S3 in Supporting Information S1). This leads to a smaller magnitude of OHUE variation in CanESM5 (Figure 1), which may be related to differences in vertical diffusivity. Further investigation is needed to better understand the role of mixing processes in shaping OHUE responses, and in general more theory is needed to understand the timescale of response of OHUE to forcing (akin, Marshall & Zanna, 2014).

Our finding of a significant mid-latitude contribution to global OHUE variation can be contextualized within the recent conceptual framework of the MT2 model (Gregory et al., 2024). This two-layer model separates the global ocean heat uptake into two distinct components: a high-latitude “M route” that depends on the AMOC strength and effective radiative forcing, and a temperature-driven “T route” hypothesized to operate in the lower latitudes. The mid-latitude nature of our finding is thus consistent with it being a response of the upper-ocean “T route”, associated with surface temperature change, rather than the passive, AMOC-related “M route.”

As shown in both the data and models, OHUE has already exhibited a noticeable decrease in the early 21st century (Figure 1a). It is mainly due to reduced efficiency in the Southern Ocean (Figure 3). When considering the moderate emissions scenario (Shared Socioeconomic Pathways 2–4.5), almost all models (except CNRM-CM6-1) show a linear decrease in OHUE through to the end of the 21st century (Figure S9 in Supporting Information S1). This decline is potentially influenced by the deep ocean warming up and increased stratification, which hinders the penetration of excess heat from upper to the deep layer (Bourgeois et al., 2022; Gregory et al., 2015; Li et al., 2020). To further understand the impact of future volcanic eruptions on OHUE and the climate system, idealized experiments simulating large volcanic events combined with future emission scenarios should be conducted. In this context, idealized experiments of the Volcanic Forcings Model Intercomparison Project (VolMIP), for example, volc-pinatubo and volc-long, offer a valuable data set for exploring these scenarios (Zanchettin et al., 2016). These experiments could help quantify the potential long-lasting effects on ocean heat uptake and provide insights into the interplay between different forcing mechanisms.

Data Availability Statement

Outputs from CMIP6 and DAMIP experiments are available at Program for Climate Model Diagnosis and Intercomparison (2020). Outputs from the CESM2 Large Ensemble Community Project and Single Forcing project are available at the Community Earth System Model website (Community Earth System Model, 2021, 2022). IAP ocean heat content data are available at Cheng et al. (2020). Ishii ocean temperature profiles are available at Ishii et al. (2009). HadCRUT5 surface temperature data are provided by Morice et al. (2021a, 2021b). Ocean heat uptake estimates based on Green's Function are available at Wu et al. (2024).

Acknowledgments

This project is supported by Schmidt Sciences, LLC. This research is also supported in part through the NYU and WHOI High Performance Computing resources. We thank Dr. Jonathan Gregory for constructive comments on the manuscript. We acknowledge the World Climate Research Programme's Working Group on Coupled Modelling, which led the design of CMIP6 and coordinated the work, and we also thank individual climate modeling groups (listed in Table S1 of Supporting Information S1) for their efforts in performing all model simulations analyzed here. We also would like to thank Lijing Cheng, Masayoshi Ishii, Jonathan Gregory, and Quran Wu for their efforts in producing and maintaining the observational data sets utilized in this work. We thank the reviewer, Taimoor Sohail, and other anonymous reviewers for their constructive comments, which helped to improve the quality and presentation of this paper.

References

- Allan, R. P., Liu, C., Loeb, N. G., Palmer, M. D., Roberts, M., Smith, D., & Vidale, P. L. (2014). Changes in global net radiative imbalance 1985–2012. *Geophysical Research Letters*, 41(15), 5588–5597. <https://doi.org/10.1002/2014GL060962>
- Boland, E. J. D., Dittus, A. J., Jones, D. C., Josey, S. A., & Sinha, B. (2022). Ocean heat content responses to changing anthropogenic aerosol forcing strength: Regional and multi-decadal variability. *Journal of Geophysical Research: Oceans*, 128(7), 1–25. <https://doi.org/10.1029/2022JC018725>
- Bourgeois, T., Goris, N., Schwinger, J., & Tjiputra, J. F. (2022). Stratification constrains future heat and carbon uptake in the Southern Ocean between 30°S and 55°S. *Nature Communications*, 13(1), 1–8. <https://doi.org/10.1038/s41467-022-27979-5>
- Cael, B. B. (2022). Ocean heat uptake efficiency increase since 1970. *Geophysical Research Letters*, 49(19), 1–7. <https://doi.org/10.1029/2022GL100215>
- Cheng, L., Trenberth, K. E., Fasullo, J., Boyer, T., Abraham, J., & Zhu, J. (2017). Improved estimates of ocean heat content from 1960 to 2015. *Science Advances*, 3(3), e1601545. <https://doi.org/10.1126/sciadv.1601545>
- Cheng, L., Wang, G., Abraham, J., & Huang, G. (2018). Decadal Ocean heat redistribution since the late 1990s and its association with key climate modes. *Climate*, 6(4), 91. <https://doi.org/10.3390/cli6040091>
- Cheng, L., Zhu, J., & Abraham, J. (2020). Ocean temperature analysis and heat content estimate by the Institute of [Dataset]. *Atmospheric Physics (IAP)*. <https://climatedataguide.ucar.edu/climate-data/ocean-temperature-analysis-and-heat-content-estimate-institute-atmospheric-physics>
- Community Earth System Model. (2021). CESM2 large ensemble community project [Dataset]. <https://www.cesm.ucar.edu/community-projects/lens2>
- Community Earth System Model. (2022). CESM2 single forcing project [Dataset]. <https://www.cesm.ucar.edu/working-groups/climate/simulations/cesm2-single-forcing-le>
- Dogar, M. M., Sato, T., & Liu, F. (2020). Ocean sensitivity to periodic and constant volcanism. *Scientific Reports*, 10(1), 293. <https://doi.org/10.1038/s41598-019-57027-0>
- Eyring, V., Bony, S., Meehl, G. A., Senior, C. A., Stevens, B., Stouffer, R. J., & Taylor, K. E. (2016). Overview of the Coupled Model Inter-comparison Project Phase 6 (CMIP6) experimental design and organization. *Geoscientific Model Development*, 9(5), 1937–1958. <https://doi.org/10.5194/gmd-9-1937-2016>
- Frölicher, T. L., Sarmiento, J. L., Paynter, D. J., Dunne, J. P., Krasting, J. P., & Winton, M. (2015). Dominance of the Southern Ocean in anthropogenic carbon and heat uptake in CMIP5 models. *Journal of Climate*, 28(2), 862–886. <https://doi.org/10.1175/JCLI-D-14-00117.1>
- Gillett, N. P., Shiogama, H., Funke, B., Hegerl, G., Knutti, R., Matthes, K., et al. (2016). The Detection and Attribution Model Intercomparison Project (DAMIP v1.0) contribution to CMIP6. *Geoscientific Model Development*, 9(10), 3685–3697. <https://doi.org/10.5194/gmd-9-3685-2016>
- Gleckler, P. J., AchutaRao, K., Gregory, J. M., Santer, B. D., Taylor, K. E., & Wigley, T. M. L. (2006). Krakatoa lives: The effect of volcanic eruptions on ocean heat content and thermal expansion. *Geophysical Research Letters*, 33(17), 1–5. <https://doi.org/10.1029/2006GL026771>
- Gregory, J. M., Andrews, T., & Good, P. (2015). The inconstancy of the transient climate response parameter under increasing CO₂. *Philosophical Transactions of the Royal Society A: Mathematical, Physical and Engineering Sciences*, 373(2054), 20140417. <https://doi.org/10.1098/rsta.2014.0417>
- Gregory, J. M., Andrews, T., Good, P., Mauritsen, T., & Forster, P. M. (2016). Small global-mean cooling due to volcanic radiative forcing. *Climate Dynamics*, 47(12), 3979–3991. <https://doi.org/10.1007/s00382-016-3055-1>
- Gregory, J. M., Bloch-Johnson, J., Couldrey, M. P., Exarchou, E., Griffies, S. M., Kuhlbrodt, T., et al. (2024). A new conceptual model of global ocean heat uptake. In *Climate Dynamics* (Vol. 62(3), pp. 1669–1713). Springer Berlin Heidelberg. <https://doi.org/10.1007/s00382-023-06989-z>
- Gregory, J. M., & Forster, P. M. (2008). Transient climate response estimated from radiative forcing and observed temperature change. *Journal of Geophysical Research*, 113(23). <https://doi.org/10.1029/2008JD010405>
- Gregory, J. M., & Mitchell, J. F. B. (1997). The climate response to CO₂ of the Hadley Centre coupled AOGCM with and without flux adjustment. *Geophysical Research Letters*, 24(15), 1943–1946. <https://doi.org/10.1029/97GL01930>
- Held, I. M., Winton, M., Takahashi, K., Delworth, T., Zeng, F., & Vallis, G. K. (2010). Probing the fast and slow components of global warming by returning abruptly to preindustrial forcing. *Journal of Climate*, 23(9), 2418–2427. <https://doi.org/10.1175/2009JCLI3466.1>
- Irving, D., Hobbs, W., Church, J., & Zika, J. (2020). A mass and energy conservation analysis of drift in the CMIP6 ensemble. *Journal of Climate*, 34(8), 1–43. <https://doi.org/10.1175/JCLI-D-20-0281.1>
- Ishii, M., Shouji, A., Sugimoto, S., & Matsumoto, T. (2005). Objective analyses of sea-surface temperature and marine meteorological variables for the 20th century using ICOADS and the Kobe Collection. *International Journal of Climatology*, 25(7), 865–879. <https://doi.org/10.1002/joc.1169>
- Ishii, M., Shouji, A., Sugimoto, S., & Matsumoto, T. (2009). Ishii ocean temperature profiles [Dataset]. <https://climate.mri-jma.go.jp/pub/ocean/ts/v7.3.1/temp/>
- Kostov, Y., Armour, K. C. K., & Marshall, J. (2014). Impact of the Atlantic meridional overturning circulation on ocean heat storage and transient climate change. *Geophysical Research Letters*, 41(6), 1–9. <https://doi.org/10.1002/2013GL058998>
- Kuhlbrodt, T., & Gregory, J. M. (2012). Ocean heat uptake and its consequences for the magnitude of sea level rise and climate change. *Geophysical Research Letters*, 39(17), 1–6. <https://doi.org/10.1029/2012GL052952>
- Li, G., Cheng, L., Zhu, J., Trenberth, K. E., Mann, M. E., & Abraham, J. P. (2020). Increasing ocean stratification over the past half-century. *Nature Climate Change*, 10(12), 1116–1123. <https://doi.org/10.1038/s41558-020-00918-2>

- Marshall, D. P., & Zanna, L. (2014). A conceptual model of ocean heat uptake under climate change. *Journal of Climate*, 27(22), 8444–8465. <https://doi.org/10.1175/JCLI-D-13-00344.1>
- Meehl, G. A., Senior, C. A., Eyring, V., Flato, G., Lamarque, J. F., Stouffer, R. J., et al. (2020). Context for interpreting equilibrium climate sensitivity and transient climate response from the CMIP6 Earth system models. *Science Advances*, 6(26), 1–10. <https://doi.org/10.1126/sciadv.aba1981>
- Morice, C. P., Kennedy, J. J., Rayner, N. A., Winn, J. P., Hogan, E., Killick, R. E., et al. (2021a). HadCRUT5 global surface temperature [Dataset]. <https://www.metoffice.gov.uk/hadobs/hadcrut5/>
- Morice, C. P., Kennedy, J. J., Rayner, N. A., Winn, J. P., Hogan, E., Killick, R. E., et al. (2021b). An updated assessment of near-surface temperature change from 1850: The HadCRUT5 data set. *Journal of Geophysical Research: Atmospheres*, 126(3), e2019JD032361. <https://doi.org/10.1029/2019JD032361>
- Newsom, E., Zanna, L., & Gregory, J. (2023). Background pycnocline depth constrains future Ocean Heat uptake efficiency. *Geophysical Research Letters*, 50(22), 1–11. <https://doi.org/10.1029/2023GL105673>
- Newsom, E., Zanna, L., Khaliwala, S., & Gregory, J. M. (2020). The influence of warming patterns on passive Ocean heat uptake. *Geophysical Research Letters*, 47(18), e2020GL088429. <https://doi.org/10.1029/2020GL088429>
- Po-Chedley, S., Fasullo, J. T., Siler, N., Labe, Z. M., Barnes, E. A., Bonfils, C. J. W., & Santer, B. D. (2022). Internal variability and forcing influence model–satellite differences in the rate of tropical tropospheric warming. *Proceedings of the National Academy of Sciences*, 119(47), 1–8. <https://doi.org/10.1073/pnas.2209431119>
- Program for Climate Model Diagnosis and Intercomparison. (2020). CMIP6 and DAMIP data archive [Dataset]. <https://esgf-node.llnl.gov/search/cmip6/>
- Raper, S. C. B., Gregory, J. M., & Stouffer, R. J. (2002). The role of climate sensitivity and ocean heat uptake on AOGCM transient temperature response. *Journal of Climate*, 15(1), 124–130. [https://doi.org/10.1175/1520-0442\(2002\)015<0124:TROCSA>2.0.CO;2](https://doi.org/10.1175/1520-0442(2002)015<0124:TROCSA>2.0.CO;2)
- Rhein, M., Rintoul, S. R., Aoki, S., Campos, E., Chambers, D., Feely, R. A., et al. (2013). Observations: Ocean. In *Intergovernmental panel on climate change 2013—the physical science basis* (pp. 255–316). Cambridge University Press. <https://doi.org/10.1017/CBO9781107415324.010>
- Rodgers, K. B., Lee, S. S., Rosenbloom, N., Timmermann, A., Danabasoglu, G., Deser, C., et al. (2021). Ubiquity of human-induced changes in climate variability. *Earth System Dynamics*, 12(4), 1393–1411. <https://doi.org/10.5194/esd-12-1393-2021>
- Saenko, O. A., Yang, D., & Gregory, J. M. (2018). Impact of mesoscale eddy transfer on heat uptake in an eddy-parameterizing ocean model. *Journal of Climate*, 31(20), 8589–8606. <https://doi.org/10.1175/JCLI-D-18-0186.1>
- Santer, B. D., Fyfe, J. C., Solomon, S., Painter, J. F., Bonfils, C., Pallotta, G., & Zelinka, M. D. (2019). Quantifying stochastic uncertainty in detection time of human-caused climate signals. *Proceedings of the National Academy of Sciences of the United States of America*, 116(40), 19821–19827. <https://doi.org/10.1073/pnas.1904586116>
- Santer, B. D., Mears, C., Wentz, F. J., Taylor, K. E., Gleckler, P. J., Wigley, T. M. L., et al. (2007). Identification of human-induced changes in atmospheric moisture content. *Proceedings of the National Academy of Sciences of the United States of America*, 104(39), 15248–15253. <https://doi.org/10.1073/pnas.0702872104>
- Schneider, D. P., & Deser, C. (2018). Tropically driven and externally forced patterns of Antarctic sea ice change: Reconciling observed and modeled trends. *Climate Dynamics*, 50(11–12), 4599–4618. <https://doi.org/10.1007/s00382-017-3893-5>
- Shi, J. R., Kwon, Y. O., & Wijffels, S. E. (2023a). Subsurface Ocean temperature responses to the anthropogenic aerosol forcing in the North Pacific. *Geophysical Research Letters*, 50(2), 1–16. <https://doi.org/10.1029/2022GL101035>
- Shi, J.-R., Talley, L. D., Xie, S.-P., Peng, Q., & Liu, W. (2021). Ocean warming and accelerating Southern Ocean zonal flow. *Nature Climate Change*, 11(12), 1090–1097. <https://doi.org/10.1038/s41558-021-01212-5>
- Shi, J.-R., Wijffels, S. E., Kwon, Y., & Xie, S. (2023b). Interhemispheric contrasts of Ocean heat content change reveals distinct fingerprints of anthropogenic climate forcings. *Geophysical Research Letters*, 50(16), e2023GL102741. <https://doi.org/10.1029/2023GL102741>
- Shi, J.-R., Xie, S.-P., & Talley, L. D. (2018). Evolving relative importance of the Southern Ocean and North Atlantic in anthropogenic Ocean Heat uptake. *Journal of Climate*, 31(18), 7459–7479. <https://doi.org/10.1175/JCLI-D-18-0170.1>
- Simpson, I. R., Rosenbloom, N., Danabasoglu, G., Deser, C., Yeager, S. G., McCluskey, C. S., et al. (2023). The CESM2 single-forcing large ensemble and comparison to CESM1: Implications for experimental design. *Journal of Climate*, 36(17), 5687–5711. <https://doi.org/10.1175/JCLI-D-22-0666.1>
- Smith, D. M., Booth, B. B. B., Dunstone, N. J., Eade, R., Hermanson, L., Jones, G. S., et al. (2016). Role of volcanic and anthropogenic aerosols in the recent global surface warming slowdown. *Nature Climate Change*, 6(10), 936–940. <https://doi.org/10.1038/nclimate3058>
- Sohail, T., Irving, D. B., Zika, J. D., & Gregory, J. M. (2023). Anthropogenic aerosols offsetting ocean warming less efficiently since the 1980s. *Geophysical Research Letters*, 50(23), e2023GL105374. <https://doi.org/10.1029/2023GL105374>
- Stenchikov, G., Delworth, T. L., Ramaswamy, V., Stouffer, R. J., Wittenberg, A., & Zeng, F. (2009). Volcanic signals in oceans. *Journal of Geophysical Research*, 114(D16), 2008JD011673. <https://doi.org/10.1029/2008JD011673>
- Swart, N. C., Gille, S. T., Fyfe, J. C., & Gillett, N. P. (2018). Recent Southern Ocean warming and freshening driven by greenhouse gas emissions and ozone depletion. *Nature Geoscience*, 11(11), 836–841. <https://doi.org/10.1038/s41561-018-0226-1>
- Takahashi, C., & Watanabe, M. (2016). Pacific trade winds accelerated by aerosol forcing over the past two decades. *Nature Climate Change*, 6(8), 768–772. <https://doi.org/10.1038/nclimate2996>
- Vogt, L., Sallée, J.-B., & De Lavergne, C. (2025). Stratification and overturning circulation are intertwined controls on Ocean heat uptake efficiency in climate models. *Ocean Science*, 21(3), 1081–1103. <https://doi.org/10.5194/os-21-1081-2025>
- Watanabe, M., Dufresne, J.-L., Kosaka, Y., Mauritsen, T., & Tabebe, H. (2021). Enhanced warming constrained by past trends in equatorial Pacific sea surface temperature gradient. *Nature Climate Change*, 11(1), 33–37. <https://doi.org/10.1038/s41558-020-00933-3>
- Watanabe, M., Kamae, Y., Yoshimori, M., Oka, A., Sato, M., Ishii, M., et al. (2013). Strengthening of ocean heat uptake efficiency associated with the recent climate hiatus. *Geophysical Research Letters*, 40(12), 3175–3179. <https://doi.org/10.1002/grl.50541>
- Wills, R. C. J., Dong, Y., Proistosescu, C., Armour, K. C., & Battisti, D. S. (2022). Systematic climate model biases in the large-scale pattern of recent sea-surface temperature and sea-level pressure change. *Geophysical Research Letters*, 1–15. <https://doi.org/10.1029/2022GL100011>
- Winton, M., Anderson, W. G., Delworth, T. L., Griffies, S. M., Hurlin, W. J., & Rosati, A. (2014). Has coarse ocean resolution biased simulations of transient climate sensitivity? *Geophysical Research Letters*, 41(23), 8522–8529. <https://doi.org/10.1002/2014GL061523>
- Wu, Q., & Gregory, J. M. (2022). Estimating Ocean heat uptake using boundary Green's functions: A perfect-model test of the method. *Journal of Advances in Modeling Earth Systems*, 14(12), 1–35. <https://doi.org/10.1029/2022MS002999>
- Wu, Q., Gregory, J. M., Zanna, L., & Khaliwala, S. (2024). An observation-based estimate of global ocean heat uptake since 1880 [Dataset]. Zenodo. <https://doi.org/10.5281/zenodo.11107298>

- Wu, Q., Gregory, J. M., Zanna, L., & Khatiwala, S. (2025). Time-varying global energy budget since 1880 from a new reconstruction of ocean warming. *Proceedings of the National Academy of Sciences*, 122(20), e2408839122. <https://doi.org/10.1073/pnas.2408839122>
- Zanchettin, D., Khodri, M., Timmreck, C., Toohey, M., Schmidt, A., Gerber, E. P., et al. (2016). The Model Intercomparison Project on the climatic response to volcanic forcing (VolMIP): Experimental design and forcing input data for CMIP6. *Geoscientific Model Development*, 9(8), 2701–2719. <https://doi.org/10.5194/gmd-9-2701-2016>
- Zanna, L., Khatiwala, S., Gregory, J. M., Ison, J., & Heimbach, P. (2019). Global reconstruction of historical ocean heat storage and transport. *Proceedings of the National Academy of Sciences*, 116(4), 1126–1131. <https://doi.org/10.1073/pnas.1808838115>