

Irreversible phytoplankton community shifts over Sub-polar North Atlantic to CO₂ forcing

Dong-Geon Lee¹, Eun Young Kwon², Jonghun Kam¹, Jong-Seong Kug^{3,4*}

¹Division of Environmental Science and Engineering, Pohang University of Science and Technology (POSTECH), Pohang, South Korea

²IBS Center for Climate Physics, Pusan National University, Busan, South Korea

³School of Earth and Environmental Sciences, Seoul National University, Seoul, South Korea

⁴Interdisciplinary Program in Artificial Intelligence, Seoul National University, Seoul, South Korea

Correspondence to: Jong-Seong Kug (jskug@snu.ac.kr)

Abstract. Marine phytoplankton play a crucial role in the ocean's food web, marine ecosystems, and the carbon cycles. Their responses to external forcing vary across phytoplankton species, and phytoplankton community shifts can have important implications for their roles in the Earth's system. Here, we find that phytoplankton communities in the Sub-Polar North Atlantic shift towards smaller species under greenhouse warming that is not easily recovered even under CO₂ removal scenarios. Despite negative CO₂ emissions, the persistent collapse of larger-celled diatom populations and shift toward smaller phytoplankton communities is a consequence of lower surface nutrient availability followed by the slowdown of the Atlantic Meridional Overturning Circulation (AMOC). This weakening of AMOC and associated nutrient transport exhibit delayed recovery. Depleting nutrients disrupts trophic dynamics, by altering primary limiting nutrient components, contributing to the continued decrease in diatoms and increase in smaller phytoplankton. Consequently, the downsizing of the phytoplankton community indicates a large reduction in the ocean's biological carbon export capacity.

Introduction

The increase in anthropogenic carbon dioxide (CO₂) emissions is warming our planet. This poses a threat to nature, human beings, terrestrial and marine ecosystems, and climate systems, making global transnational efforts crucial to reduce additional carbon emissions (Cui et al., 2024; Gattuso et al., 2015; Nagelkerken and Connell, 2015). To do this, world leaders pledged in the 2015 Paris Agreement to limit long-term temperature increases to below 2°C, or ideally 1.5°C. Therefore, climate mitigation strategies, including negative CO₂ emissions through the development of Carbon Dioxide Removal (CDR) techniques, are necessary to curb global warming (Gasser et al., 2015; Meinshausen et al., 2009; Rogelj et al., 2016; Tong et al., 2019; Van Vuuren et al., 2018). However, the Earth's climate system may not be fully recovered, even if external forcing returns to baseline conditions, known as climate irreversibility. Numerous studies have reported that several physical variables have irreversible changes on a global & regional scale, including temperature, precipitation, and ocean circulation under negative CO₂ emissions (An et al., 2022; Boucher et al., 2012; Hawkins et al., 2011; Jeltsch-Thömmes et al., 2020; Kim et al., 2024, 2022; Kug et al., 2022; Liu et al., 2023; Oh et al., 2024; Pathirana et al., 2023; Song et al., 2022). Irreversible changes in biological aspects have also been documented in both marine and terrestrial ecosystems, such as vegetation, wildfires, permafrost, primary productivity, and the carbon cycle (John et al., 2015; Park et al., 2025; Park and Kug, 2022; Schwinger and Tjiputra, 2018). Despite the wealth of research on climate irreversibility, few studies have focused on changes in phytoplankton communities, which play a crucial role in the global carbon cycle.

Marine phytoplankton form the foundation of ocean ecosystems (Platt et al., 2003; Richardson and Schoeman, 2004), mediate biogeochemical processes, and regulate climate (Behrenfeld et al., 2006; Field et al., 1998; Passow and Carlson, 2012). They are responsible for nearly half of the global primary production (PP; Field et al., 1998; Falkowski et al., 1998; Behrenfeld et al., 2006). Phytoplankton are vulnerable to climate change due to their sensitivity to external environmental conditions such as temperature (Anderson et al., 2021; Archibald et al., 2022; Behrenfeld et al., 2006; Doney, 2006), insolation (Marinov et al., 2010), and nutrient availability (Moore et al., 2013). Responses to external forcing vary among phytoplankton species, so the compositions of the phytoplankton community can influence their roles in food web organization and biogeochemical processes. Therefore, shifts in phytoplankton communities play a key role in various aspects, comparable to changes in their biomass (Barton et al., 2016; Winder and Sommer, 2012) and have significant socio-economic implications for fisheries and higher ecosystem levels. Conversely, changes in these aspects can also impact phytoplankton communities (Platt et al., 2003; Reid et al., 2000).

Previous studies have argued for a trend towards smaller phytoplankton communities under warmer climates using model simulations and observation-based research (Cael et al., 2021; Doney, 2006; Henson et al., 2021; Morán et al., 2010; Winder and Sommer, 2012). This downsizing of phytoplankton communities is likely to persist even under negative CO₂ emissions due to the irreversible responses of physical factors predicted under carbon mitigation scenarios. As smaller phytoplankton species dominate over larger cell-sized phytoplankton, photosynthesis becomes less efficient, and the gravitational sinking of particulate organic carbon (POC) in the

oceans weakens, reducing the amount of carbon sequestered over time (Boyd and Trull, 2007; Guidi et al., 2009; Maranon, 2014).

The Subpolar North Atlantic (SPNA) Ocean is not only a critical region for climate change but also plays a vital role in the biological processes that govern CO₂ gas exchange between the air and seas (Bennington et al., 2009; Manabe and Stouffer, 1995; Sabine et al., 2004). Under global warming scenarios, there is a counterintuitive decrease in temperature in this region, resulting from the weakening of the Atlantic Meridional Overturning Circulation (AMOC), which drives deep convection in the SPNA region (Caesar et al., 2018; Liu et al., 2020; Oh et al., 2022). The weakening of the AMOC under global warming impairs volume transport from low to high latitudes, accompanied by decreases in nutrient-rich water conveyance (Schmittner, 2005). The SPNA region is one of the most significant areas for carbon uptake in the current regional climate and carbon cycle (Sabine et al., 2004). Nutrient deficiencies in the SPNA region potentially lead to shifts in plankton composition, resulting in large decreases in export production (EP) and net primary productivity (NPP) under future climate conditions. Previous studies have examined decreases in marine productivity in the SPNA under global warming (Moore et al., 2013; Schmittner, 2005; Steinacher et al., 2010). Despite the irreversibility of AMOC strength revealed by other studies, the irreversible responses of phytoplankton communities in this region have not been thoroughly explored.

Here, we aim to examine phytoplankton community shifts under negative CO₂ emissions and their implications as biological climate regulators. First, we analyze idealized CO₂ emission-driven simulations based on the Community Earth System Model 2 (CESM2) with multiple ensembles. The simulations incorporate biogeochemical processes coupled with a biogeochemistry model, and it simulate three explicit phytoplankton functional types (PFTs): diatoms, small phytoplankton, and diazotrophs (See Methods for details). In the following sections, we report irreversible shifts in phytoplankton communities in the SPNA region and examine the mechanisms driving these results.

Methods

Bray-Curtis dissimilarity

We quantified shifts in phytoplankton community using the Bray-Curtis (BC) dissimilarity metric frequently utilized in ecology and biology to quantify differences in species composition between two sites (Bray et al., 1957; Herren and McMahon, 2017). For two time periods, t_1 and t_2 , BC index is defined as below:

$$\text{Bray-Curtis (BC) index} = 1 - \frac{2 \sum_{i=1}^R \min(B_{t_1}^i, B_{t_2}^i)}{\sum_{i=1}^R (B_{t_1}^i + B_{t_2}^i)} \quad (1)$$

where, B_t^i is the period-mean biomass of phytoplankton functional type (PFT) i , and R is the number of PFTs (here $R = 3$). BC ranges from 0 (identical composition) to 1 (no shared composition among PFTs). We computed BC index at each grid point using period-mean PFT biomasses between the Climatology (2001-2011; t_1), and CO₂-down (2192-2202; t_2) periods.

Model Configuration

In this study, we employed Community Earth System Model version 2 (CESM2) to investigate marine biogeochemical cycles, focusing on the dynamics of the nutrient and phytoplankton communities in the Southern Ocean (SO). The marine ecosystem within CESM2 is represented by the Marine Biogeochemical Library (MARBL), which incorporates three explicitly modeled phytoplankton functional groups—diatoms, diazotroph, pico/nano (small) phytoplankton—as well as one implicit group (calcifiers) and single zooplankton group. MARBL also simulates 32 different tracers, which include 17 abiotic constituents such as dissolved inorganic and organic carbon, alkalinity, nutrients, and oxygen, along with 15 biotic tracers associated with phytoplankton biomass (e.g., Carbon (C), Phosphorus (P), Silica (Si), Iron (Fe), and Calcium Carbonate (CaCO₃)), as well as zooplankton carbon.

Within MARBL, phytoplankton growth rates depend on multiple environmental parameters, including temperature, nutrient limitation, and light availability, as detailed in Long et al (2021). Nutrient limitation is determined by Liebig's law of the minimum, whereby the nutrient available in the smallest quantities limits phytoplankton growth. Changes in PFT concentrations are calculated by source (i.e., net primary productivity) and sink (grazing, linear mortality, and aggregation) terms as elaborated in Long et al (2021).

Long et al (2021) evaluated the model's performance in simulating biogeochemical variables such as macronutrient (Nitrate; NO₃, Phosphate; PO₄, Silicate; SiO₃) distribution and NPP and export production (EP). They showed that MARBL effectively simulates the geographical patterns of macronutrients in the SPNA region compared to World Ocean Atlas (WOA) observations. Moreover, comparisons with satellite observations revealed that the global distribution of NPP simulated by MARBL exhibits similar patterns, albeit with slight differences in magnitude.

Experimental Design

We analyzed an idealized negative CO₂ emissions pathway that effectively reduces emissions incrementally, considering the development of Carbon Dioxide Removal (CDR) technology and global mitigation efforts. In our experiments, anthropogenic CO₂ emissions increase linearly from an initial CO₂ concentration of 383 ppm to the year 2050, based on the SSP5-8.5 scenario. Subsequently, emissions decrease at the same rate until the global mean atmospheric CO₂ concentration returns to its original value (in the year 2196). Immediately after reaching this level, net-zero emissions are maintained until the end of the simulation (year 2400). The atmospheric CO₂ level peaks in the year 2107 (725 ppm), just a few years before achieving net-zero emissions. For better readability, we define periods as follows: CO₂ increasing period (2001-2107) and CO₂ decreasing period (2108-2196), and restoring period as the duration of net-zero emission (2197-2400), respectively. We also have defined the first 11 years (2001-2011) as the “Climatology period”, and the 11 years (2192-2202) at the end of the CO₂ decreasing period as the “CO₂ down period” to identify irreversible changes of climatic variables under the same CO₂ conditions. We have run a total of ten ensemble members, each with slightly different initial conditions, to consider the variability.

Results

Irreversible phytoplankton community shifts to CO₂ forcing in SPNA region

We investigate the shifts in phytoplankton communities between the climatology period and the CO₂ down period. The statistical method known as BC dissimilarity was used to examine the similarity of the phytoplankton communities between the two periods following Cael et al (2021; Detail in Methods). There are pronounced positive values (indicating less similarity) of dissimilarity at high latitudes in the northern hemisphere (NH), including the Arctic and SPNA region. Notably, the most significant shifts in phytoplankton communities emerge in the SPNA region, indicating substantial variations in phytoplankton composition (Fig. 1a).

Fig. 1b presents a time series of area-averaged PFT biomass in the SPNA region. As atmospheric CO₂ concentrations increase, diatoms and small phytoplankton exhibit a significant decrease and increase, respectively. These results are consistent with previous studies, which have reported shifts towards smaller PFT-dominant phytoplankton communities in a warmer world (Cael et al., 2021; Doney, 2006; Henson et al., 2021; Morán et al., 2010; Winder and Sommer, 2012). These variations in PFT biomass persist under negative CO₂ emissions. While small phytoplankton increase over time and has a peak in the middle of the CO₂ decreasing period, diatoms continue to decrease and have a minimum value at the same time. Similarly, the diazotroph concentrations decrease, except for a slight initial increase, eventually reaching a minimum at the end of the CO₂ decreasing period. During the restoring period, all PFTs—except diazotrophs, which overshoot—return to near their initial values with diatom concentrations showing a slight weakening. Comparing the two periods (CO₂ down - Climatology) with the same atmospheric CO₂ concentration reveals substantial shifts in the phytoplankton community. Specifically, there is a large decrease in larger cell-sized phytoplankton and an increase in smaller cell-sized phytoplankton, indicating significant downsizing of the phytoplankton community.

All PFTs exhibit strong irreversible shifts in response to CO₂ forcing (Figs. 1c-e). In particular, diatom concentrations decreased to 24% of their initial value during the CO₂ increasing period, while small phytoplankton increased by about 283% compared to the Climatology period. The phytoplankton biomass remained nearly constant during the CO₂ decreasing period when the atmospheric CO₂ concentration returned to its initial value of 383 ppm. These results indicate shifts in the phytoplankton community towards dominance by smaller phytoplankton in the SPNA region, despite the same atmospheric CO₂ concentration. In addition, although the diazotroph concentrations constitute a relatively smaller portion of the total PFTs, their pronounced decline during the CO₂ decreasing period leads to a weakening of biological N fixation to the ocean (Fig. S1a). The diazotrophs show different behavior compared to the other two species because of their temperature-limited biological properties (Breitbarth et al., 2007; Yi et al., 2020). Consequently, temporal changes in Sea Surface Temperature (SST), diazotroph concentrations, and N fixation rates in the SPNA region are all closely aligned (Fig. S1).

Smaller phytoplankton have greater competitiveness in oligotrophic and stratified marine environments in a warmer world due to their enhanced surface area-to-volume ratio (Morán et al., 2010; Winder and Sommer, 2012). Within MARBL—the biogeochemical component of the CESM2 Earth System Model—the advantage of

smaller phytoplankton in low-nutrient environments is represented by prescribing different constant half-saturation coefficients for each PFT, reflecting the observed differences among phytoplankton size classes in the real ocean (Long et al., 2021). For instance, two PFTs (diatom and small phytoplankton) may possess the same maximum growth rate; however, the half-saturation coefficient is parameterized to be smaller for small phytoplankton. This implies that small phytoplankton can achieve their maximum growth rate with a lower nutrient concentration. Furthermore, the decrease in diatoms due to the shift towards oligotrophic conditions may lead to a reduction in zooplankton and a weakening of grazing by higher-level predators, thereby promoting the growth of phytoplankton. The time series of source and sink terms integrated to 100 m depth exhibits that grazing is the dominant sink contribution to loss for both PFTs, with other terms having relatively minor effects (Fig. S2).

Irreversibility of AMOC strength and shift in the primary nutrient limiting component.

The spatial distribution of PFT biomass differences between the two periods reveals a significant shift across the SPNA (Figs. 2a-c). Across the entire Atlantic and Arctic regions, and even globally (not shown), the most dramatic differences are observed in the SPNA region. For diazotrophs, whose growth rates are temperature-dependent, high latitudes above 50°N exhibit scant biomass climatologically and no variations (Fig. S3, Fig. 2c). Except for diazotrophs, changes in phytoplankton concentrations are generally driven by nutrient availability. While NO_3 is commonly considered the most limiting nutrient globally, observation-based studies have identified silicate as the primary limiting component for phytoplankton growth in the SPNA region (Allen et al., 2005). The CESM2 biogeochemical model, MARBL, also well simulates Si-limited growth of diatoms in the SPNA region, consistent with observations (Long et al., 2021). The spatial distribution of differences between the two periods for both macronutrients (NO_3 , SiO_3) shows similar patterns to PFT biomass changes.

The North Atlantic, including the SPNA region, is characterized by deep convection associated with the AMOC. Changes in the AMOC lead to significant physical alterations in the SPNA region. In particular, the AMOC plays a pivotal role in transporting water volumes from low to high latitudes, and through this process, nutrient-rich water transport can trigger biological changes (Boot et al., 2023). Under global warming, AMOC is expected to progressively weaken due to increased surface temperature and the influx of freshwater. Additionally, it has been reported that under negative emissions, AMOC strength will not recover immediately but will instead decrease further with a delay (An et al., 2021; Oh et al., 2022). This implies that changes in AMOC strength may influence shifts in the phytoplankton community in the SPNA region under a climate mitigation scenario.

Thus, we investigate the changes in AMOC strength and nutrient concentrations in our simulations (Fig. 3a). In our experiments, the intensity of the AMOC continues to decrease with increasing atmospheric CO_2 concentration, persisting until the middle of the CO_2 mitigation pathway and reaching its weakest state around the year 2142 (Fig. 3a). Subsequently, the AMOC gradually strengthens again, returning to its initial condition with overshooting during the restoring period (An et al., 2021; Jackson et al., 2014; Wu et al., 2011). Consistent with the weakening of AMOC strength over time, both nutrient concentrations also continue to decline (Fig. 3a).

Interestingly, while both nutrients decline over time, the reduction in SiO_3 concentration halts around the year 2075 and remains steady until approximately the year 2250 before recovering. Conversely, NO_3 decreases until around the year 2170, past the point of minimal AMOC strength, and then recovers with the AMOC turnabout. The distinct responses of SiO_3 and NO_3 to CO_2 forcing arise largely due to the diverging responses of PFTs from the climatology period to the CO_2 down period. While decreases in diatoms-driven NPP reduce the consumption rates of both SiO_3 and NO_3 , increases in small-phytoplankton-driven NPP counterbalance the decreasing NO_3 consumption rates, resulting in a more persistent decline in NO_3 (Fig. S6). Reduced diazotrophs-driven NPP and associated N-fixation also contribute to further decline in surface NO_3 concentrations. Changes in the limiting nutrient components may affect the nutrient dynamics of phytoplankton, particularly diatoms, which are composed of larger cells in the SPNA region.

We identified changes in the limiting nutrients for the growth of two PFTs (diatom, small phytoplankton). The spatial patterns of limiting nutrients are shown in Fig. 3c and 3d for diatoms and in Fig. S4c and Fig. S4d for small phytoplankton, with the SPNA-averaged time series shown in Fig. 3b and Fig. S4a. When spatially averaged, small phytoplankton, unaffected by SiO_3 availability, experience N limitation throughout all timeframes owing to continuously decreasing NO_3 levels (Fig. S4). For diatoms, however, the predominant limiting nutrient shifts from Silicon (Si) to N around the year 2076, coinciding with the stabilization of SiO_3 levels (Figs. 3a-b). During the Climatology period, Si limitation for diatoms dominates across most of the SPNA region (Fig 3c). However, as NO_3 decreases more rapidly than SiO_3 , N limitation spreads across the SNPA region, eventually overtaking Si limitation. By the CO_2 down period, Si limitation becomes confined only to small regions, with most areas transitioning to N limitation. (Figs. 3c-d).

From the Irminger Sea, located beneath Greenland, to the Nordic Sea, the Si-limited environment persists even during the CO_2 down period. This region, characterized by intense deep convection in the present climate (Heuzé, 2017; Renssen et al., 2005), exhibits the most pronounced shallowing of the mixed layer depth (MLD) than elsewhere, indicating that it is particularly affected by the weakening of the AMOC (Fig. S5). Consequently, SiO_3 concentrations are significantly reduced compared to other regions, maintaining Si limitation. Furthermore, even as the AMOC enters a recovery phase, nutrient levels do not rebound immediately and exhibit a delayed response. Thus, lagged nutrient retrieval causes a corresponding lagged response in phytoplankton community recovery. As the AMOC strength and nutrient transport are reinstated, nutrient concentrations increase sufficiently by around the year 2250, causing a return to Si limitation. This suggests that while the AMOC plays a critical role in nutrient distribution and the marine ecosystem in the SPNA region, the phytoplankton community may experience stronger irreversible changes than the recovery of AMOC strength under a climate mitigation scenario.

Implication of phytoplankton community shift on POC export

The shift towards smaller phytoplankton communities can have significant ecological, biogeochemical,

and climatic impacts. Phytoplankton, composed of larger cells, possess a greater capacity for sequestering CO₂ through photosynthesis and gravitational sinking into the ocean. In contrast, organic carbon exported by smaller phytoplankton is more readily degraded by higher-level predators such as bacteria and zooplankton, and can be re-released back to the water column as CO₂ quickly compared to diatoms (Leblanc et al., 2018; Tréguer et al., 2018). Therefore, the collapse of diatom populations during the CO₂ down periods could lead to a loss of biological carbon sequestration competence (biological pump). This attenuation is particularly evident in the SPNA region, where the phytoplankton community shifts are most pronounced (Fig. 4a). The weakening of the biological pump is evident throughout the SNPA region and extends beyond in parts of the Arctic region. Consistent with the strong biological irreversible responses observed in the above results, there is a significant irreversible decline in the organisms' ability to export carbon (POC flux). The abundance of diatoms, which typically dominate the biological carbon pump, has decreased to about a fourth, while small phytoplankton have increased by a factor of 2.7. As a result, when CO₂ concentrations return to initial levels, the POC flux is less than half of the initial condition, indicating that the decrease in diatoms plays a dominant role in POC export changes. Specifically, the SPNA region, currently a key area for CO₂ sequestration (Sabine et al., 2004), is projected to be less effective at exporting carbon than the global average after CO₂ mitigation (Figs 4b-c). Consequently, while the North Atlantic Ocean is presently known for its strong biological pump, it may lose this status under CO₂ mitigation scenarios (Fig. 4). Therefore, the longer climate mitigation is delayed, the more the miniaturization of phytoplankton communities will accelerate, further slowing down the marine biological pump.

Therefore, even if atmospheric CO₂ concentrations return to their original levels through negative emissions, marine ecosystems, especially the composition of PFTs will exhibit strong irreversible shifts. This disrupted phytoplankton community has the potential to impact regional & global trophic dynamics and food webs, as well as commercial fisheries and more. Moreover, if global warming accelerates again in the context of a downsizing of the phytoplankton community, it is possible that we will experience even more abrupt climate change than at present, as the Earth's capacity for biological carbon export is diminished.

Discussion

This study conducts idealized CO₂ emission-driven simulations using multiple ensembles to investigate how phytoplankton communities respond under CO₂ mitigation scenarios. When atmospheric CO₂ concentration returns to initial levels through negative emissions, we observe the most significant changes in the composition of PFTs in the SPNA region (Fig. 1a). For example, smaller phytoplankton populations increase, and the concentrations of large cell-sized diatoms collapse (Figs. 1b-d). The diazotroph concentrations significantly decrease, primarily reflecting the response to oceanic temperature changes, while suppressed nutrient availability contributes as well (Fig. 1b, e, Fig. S1). Across the SPNA region, macronutrients (NO₃, SiO₃) can substantially limit phytoplankton growth (Figs. 2d-e, Fig. 3a). As the globe warms, the AMOC gradually weakens and exhibits strong irreversible changes under negative CO₂ emissions. The reductions in nutrient concentrations are strongly correlated with AMOC weakening (Fig. 3a). The weakening of the AMOC leads to regional and global climatic

variations, particularly affecting nutrient transport, which is essential for biological activities in the SPNA region. Furthermore, shifts in the phytoplankton community alter trophic dynamics, accelerating NO₃ depletion and creating an N-limited environment for diatom growth (Fig. 3b). The downsizing of the phytoplankton community is markedly slow to recover, even as AMOC strength rebounds, due to the delayed recovery of nutrient levels. Consequently, PFTs exhibit irreversible shifts, which could have significant biological, biogeochemical, and climatic implications. Carbon export capacity in the SPNA region is reduced by more than 50% compared to the present climate.

Our study reveals that global warming-driven irreversible changes in AMOC strength can trigger irreversibility not only in physical parameters, such as SST and salinity but also in cascading biological and biogeochemical responses. Pronounced shifts in phytoplankton communities in the Subpolar North Atlantic involve negative feedback, resulting in the loss of biological carbon export capacity, which in turn exacerbates global warming. In other words, multiple stressors—physical, trophic and biological—can interact and weaken the resilience of marine ecosystems and the biological carbon pump system (Conversi et al., 2015).

However, our study has several limitations and potential avenues for further research. Our study uses CO₂ emission-driven idealized experiments with ten ensembles but relies on a single model, CESM2, which could render the results model-dependent. It has been documented that CESM2 simulates AMOC weakening more sensitively than other Earth System Models (Needham et al., 2024; Schwinger et al., 2022), potentially leading to a propensity to overestimate marine ecosystem changes. However, the GFDL-ESM4 and CNRM-ESM2-1, as part of the CDRMIP experiments in CMIP6, include diatom variables and exhibit consistent weakening in diatom concentrations alongside AMOC weakening in the SPNA region (Fig. S7). In GFDL-ESM4, diatom concentrations recover comparably after CO₂ is decreased to the initial level, yet the pathway during the CO₂ Ramp-up period does not follow the same pathway as the CO₂ Ramp-up period, indicating hysteresis in both GFDL-ESM4 and CNRM-ESM2-1. Another limitation of this study is that the CESM2 MARBL biogeochemical model includes only three PFTs—diatoms, small phytoplankton, and diazotrophs. While this study offers valuable insights into the broader shifts in phytoplankton community structure under climate mitigation scenarios, it is essential to acknowledge the limitations of representing the complex phytoplankton community with only three PFTs. Analyzing changes in specific PFTs is beyond the scope of this study and requires further investigation of the simplicity/diversity of PFTs in simulating the global biogeochemical cycle. However, the model's simplicity is still advantageous in capturing future trends in phytoplankton as a function of their cell size and the underlying mechanisms driving phytoplankton dynamics and their biogeochemical implications. While the simplification of the CESM2 MARBL model to three PFTs could be considered a limitation, it does not diminish the significance of the results.

This study demonstrates that CESM effectively captures key trends in phytoplankton community shifts and their broader implications, providing a strong framework for assessing the impacts of climate change on marine ecosystems. This study advances our understanding of the potential trajectories of marine biogeochemical processes and their environmental and economic implications. Future research could further enhance these

307 findings by incorporating a more diverse range of PFTs.

Data Availability Statement

The data used in this study will be available from <https://doi.org/10.6084/m9.figshare.27058897>, and the CMIP6 archives are freely available from <https://esgf-node.llnl.gov/projects/cmip6>.

Code availability

The computer codes that support the analysis within this paper are available from the corresponding author on request.

Acknowledgements

This work is supported by the Korea Meteorological Administration Research and Development Program under Grant (RS-2025-02222417) and the National Research Foundation of Korea (NRF-2021M3I6A1086808). This work was supported by Institute of Information & communications Technology Planning & Evaluation (IITP) grant funded by the Korea government(MSIT) [NO.RS-2021-II211343, Artificial Intelligence Graduate School Program (Seoul National University)]

Competing interests

The authors declare no competing interests.

Author contributions

D.-G. Lee compiled the data, conducted analyses, prepared the figures, and wrote the manuscript. J.-S. Kug designed the research and wrote the majority of the manuscript content. All the authors discussed the study results and reviewed the manuscript.

Reference

- Allen, J. T., Brown, L., Sanders, R., Moore, C. M., Mustard, A., Fielding, S., Lucas, M., Rixen, M., Savidge, G., Henson, S., and Mayor, D.: Diatom carbon export enhanced by silicate upwelling in the northeast Atlantic, *Nature*, 437, 728–732, <https://doi.org/10.1038/nature03948>, 2005.
- An, S. Il, Shin, J., Yeh, S. W., Son, S. W., Kug, J. S., Min, S. K., and Kim, H. J.: Global Cooling Hiatus Driven by an AMOC Overshoot in a Carbon Dioxide Removal Scenario, *Earth's Futur.*, 9, <https://doi.org/10.1029/2021EF002165>, 2021.
- An, S. Il, Park, H. J., Kim, S. K., Shin, J., Yeh, S. W., and Kug, J. S.: Intensity changes of Indian Ocean dipole mode in a carbon dioxide removal scenario, *npj Clim. Atmos. Sci.*, 5, 1–8, <https://doi.org/10.1038/s41612-022-00246-6>, 2022.
- Anderson, S. I., Barton, A. D., Clayton, S., Dutkiewicz, S., and Rynearson, T. A.: Marine phytoplankton functional types exhibit diverse responses to thermal change, *Nat. Commun.*, 12, 1–9, <https://doi.org/10.1038/s41467-021-26651-8>, 2021.
- Archibald, K. M., Dutkiewicz, S., Laufkötter, C., and Moeller, H. V.: Thermal Responses in Global Marine Planktonic Food Webs Are Mediated by Temperature Effects on Metabolism, *J. Geophys. Res. Ocean.*, 127, 1–18, <https://doi.org/10.1029/2022JC018932>, 2022.
- Barton, A. D., Irwin, A. J., Finkel, Z. V., and Stock, C. A.: Anthropogenic climate change drives shift and shuffle in North Atlantic phytoplankton communities, *Proc. Natl. Acad. Sci. U. S. A.*, 113, 2964–2969, <https://doi.org/10.1073/pnas.1519080113>, 2016.
- Behrenfeld, M. J., O'Malley, R. T., Siegel, D. A., McClain, C. R., Sarmiento, J. L., Feldman, G. C., Milligan, A. J., Falkowski, P. G., Letelier, R. M., and Boss, E. S.: Climate-driven trends in contemporary ocean productivity, *Nature*, 444, 752–755, <https://doi.org/10.1038/nature05317>, 2006.
- Bennington, V., McKinley, G. A., Dutkiewicz, S., and Ullman, D.: What does chlorophyll variability tell us about export and air-sea CO₂ flux variability in the North Atlantic?, *Global Biogeochem. Cycles*, 23, 1–11, <https://doi.org/10.1029/2008GB003241>, 2009.

355 Boot, A., von der Heydt, A. S., and Dijkstra, H. A.: Effect of Plankton Composition Shifts in the North Atlantic
 356 on Atmospheric pCO₂, *Geophys. Res. Lett.*, 50, <https://doi.org/10.1029/2022GL100230>, 2023.

357 Boucher, O., Halloran, P. R., Burke, E. J., Doutriaux-Boucher, M., Jones, C. D., Lowe, J., Ringer, M. A.,
 358 Robertson, E., and Wu, P.: Reversibility in an Earth System model in response to CO₂ concentration changes,
 359 *Environ. Res. Lett.*, 7, <https://doi.org/10.1088/1748-9326/7/2/024013>, 2012.

360 Boyd, P. W. and Trull, T. W.: Understanding the export of biogenic particles in oceanic waters: Is there consensus?,
 361 *Prog. Oceanogr.*, 72, 276–312, <https://doi.org/10.1016/j.pocean.2006.10.007>, 2007.

362 Bray, J. R., Curtis, J. T., and Roger, J.: This content downloaded from 147.8.31.43 on Mon, *Source Ecol. Monogr.*,
 363 27, 325–349, 1957.

364 Breitbarth, E., Oschlies, A., and LaRoche, J.: Physiological constraints on the global distribution of
 365 *Trichodesmium* - Effect of temperature on diazotrophy, *Biogeosciences*, 4, 53–61, [https://doi.org/10.5194/bg-4-](https://doi.org/10.5194/bg-4-53-2007)
 366 53-2007, 2007.

367 Cael, B. B., Dutkiewicz, S., and Henson, S.: Abrupt shifts in 21st-century plankton communities, *Sci. Adv.*, 7,
 368 <https://doi.org/10.1126/sciadv.abf8593>, 2021.

369 Caesar, L., Rahmstorf, S., Robinson, A., Feulner, G., and Saba, V.: Observed fingerprint of a weakening Atlantic
 370 Ocean overturning circulation, *Nature*, 556, 191–196, <https://doi.org/10.1038/s41586-018-0006-5>, 2018.

371 Conversi, A., Dakos, V., Gårdmark, A., Ling, S., Folke, C., Mumby, P. J., Greene, C., Edwards, M., Blenckner,
 372 T., Casini, M., Pershing, A., and Möllmann, C.: A Holistic view of Marine Regime shifts, *Philos. Trans. R. Soc.*
 373 *B Biol. Sci.*, 370, 1–8, <https://doi.org/10.1098/rstb.2013.0279>, 2015.

374 Cui, J., Zheng, M., Bian, Z., Pan, N., Tian, H., Zhang, X., Qiu, Z., Xu, J., and Gu, B.: Elevated CO₂ levels promote
 375 both carbon and nitrogen cycling in global forests, *Nat. Clim. Chang.*, 14, 511–517,
 376 <https://doi.org/10.1038/s41558-024-01973-9>, 2024.

377 Doney, S. C.: Plankton in a warmer world, *Nature*, 444, 695–696, <https://doi.org/10.1038/444695a>, 2006.

378 Falkowski, P. G., Barber, R. T., and Smetacek, V.: Biogeochemical controls and feedbacks on ocean primary
 379 production, *Science (80-.)*, 281, 200–206, <https://doi.org/10.1126/science.281.5374.200>, 1998.

380 Field, C. B., Behrenfeld, M. J., Randerson, J. T., and Falkowski, P.: Primary production of the biosphere:
 381 Integrating terrestrial and oceanic components, *Science* (80-.), 281, 237–240,
 382 <https://doi.org/10.1126/science.281.5374.237>, 1998.

383 Gasser, T., Guivarch, C., Tachiiri, K., Jones, C. D., and Ciais, P.: Negative emissions physically needed to keep
 384 global warming below 2°C, *Nat. Commun.*, 6, <https://doi.org/10.1038/ncomms8958>, 2015.

385 Gattuso, J. P., Magnan, A., Billé, R., Cheung, W. W. L., Howes, E. L., Joos, F., Allemand, D., Bopp, L., Cooley,
 386 S. R., Eakin, C. M., Hoegh-Guldberg, O., Kelly, R. P., Pörtner, H. O., Rogers, A. D., Baxter, J. M., Laffoley, D.,
 387 Osborn, D., Rankovic, A., Rochette, J., Sumaila, U. R., Treyer, S., and Turley, C.: Contrasting futures for ocean
 388 and society from different anthropogenic CO₂ emissions scenarios, *Science* (80-.), 349,
 389 <https://doi.org/10.1126/science.aac4722>, 2015.

390 Guidi, L., Stemann, L., Jackson, G. A., Ibanez, F., Claustre, H., Legendre, L., Picheral, M., and Gorsky, G.:
 391 Effects of phytoplankton community on production, size and export of large aggregates: A world-ocean analysis,
 392 *Limnol. Oceanogr.*, 54, 1951–1963, <https://doi.org/10.4319/lo.2009.54.6.1951>, 2009.

393 Hawkins, E., Smith, R. S., Allison, L. C., Gregory, J. M., Woollings, T. J., Pohlmann, H., and De Cuevas, B.:
 394 Bistability of the Atlantic overturning circulation in a global climate model and links to ocean freshwater transport,
 395 *Geophys. Res. Lett.*, 38, 1–6, <https://doi.org/10.1029/2011GL047208>, 2011.

396 Henson, S. A., Cael, B. B., Allen, S. R., and Dutkiewicz, S.: Future phytoplankton diversity in a changing climate,
 397 *Nat. Commun.*, 12, 1–8, <https://doi.org/10.1038/s41467-021-25699-w>, 2021.

398 Herren, C. M. and McMahon, K. D.: Cohesion: A method for quantifying the connectivity of microbial
 399 communities, *ISME J.*, 11, 2426–2438, <https://doi.org/10.1038/ismej.2017.91>, 2017.

400 Heuzé, C.: North Atlantic deep water formation and AMOC in CMIP5 models, *Ocean Sci.*, 13, 609–622,
 401 <https://doi.org/10.5194/os-13-609-2017>, 2017.

402 Jackson, L. C., Schaller, N., Smith, R. S., Palmer, M. D., and Vellinga, M.: Response of the Atlantic meridional
 403 overturning circulation to a reversal of greenhouse gas increases, *Clim. Dyn.*, 42, 3323–3336,
 404 <https://doi.org/10.1007/s00382-013-1842-5>, 2014.

405 Jeltsch-Thömmes, A., Stocker, T. F., and Joos, F.: Hysteresis of the Earth system under positive and negative
 406 CO₂ emissions, *Environ. Res. Lett.*, 15, <https://doi.org/10.1088/1748-9326/abc4af>, 2020.

407 John, J. G., Stock, C. A., and Dunne, J. P.: A more productive, but different, ocean after mitigation, *Geophys. Res.*
 408 *Lett.*, 42, 9836–9845, <https://doi.org/10.1002/2015GL066160>, 2015.

409 Kim, G. Il, Oh, J. H., Shin, N. Y., An, S. Il, Yeh, S. W., Shin, J., and Kug, J. S.: Deep ocean warming-induced El
 410 Niño changes, *Nat. Commun.*, 15, 1–8, <https://doi.org/10.1038/s41467-024-50663-9>, 2024.

411 Kim, S. K., Shin, J., An, S. Il, Kim, H. J., Im, N., Xie, S. P., Kug, J. S., and Yeh, S. W.: Widespread irreversible
 412 changes in surface temperature and precipitation in response to CO₂ forcing, *Nat. Clim. Chang.*, 12,
 413 <https://doi.org/10.1038/s41558-022-01452-z>, 2022.

414 Kug, J. S., Oh, J. H., An, S. Il, Yeh, S. W., Min, S. K., Son, S. W., Kam, J., Ham, Y. G., and Shin, J.: Hysteresis
 415 of the intertropical convergence zone to CO₂ forcing, *Nat. Clim. Chang.*, 12, 47–53,
 416 <https://doi.org/10.1038/s41558-021-01211-6>, 2022.

417 Leblanc, K., Quéguiner, B., Diaz, F., Cornet, V., Michel-Rodriguez, M., Durrieu De Madron, X., Bowler, C.,
 418 Malviya, S., Thyssen, M., Grégori, G., Rembauville, M., Grosso, O., Poulain, J., De Vargas, C., Pujo-Pay, M.,
 419 and Conan, P.: Nanoplanktonic diatoms are globally overlooked but play a role in spring blooms and carbon
 420 export, *Nat. Commun.*, 9, 1–12, <https://doi.org/10.1038/s41467-018-03376-9>, 2018.

421 Liu, C., An, S. Il, Jin, F. F., Stuecker, M. F., Zhang, W., Kug, J. S., Yuan, X., Shin, J., Xue, A., Geng, X., and
 422 Kim, S. K.: ENSO skewness hysteresis and associated changes in strong El Niño under a CO₂ removal scenario,
 423 *npj Clim. Atmos. Sci.*, 6, <https://doi.org/10.1038/s41612-023-00448-6>, 2023.

424 Liu, W., Fedorov, A. V., Xie, S. P., and Hu, S.: Climate impacts of a weakened Atlantic meridional overturning
 425 circulation in a warming climate, *Sci. Adv.*, 6, 1–8, <https://doi.org/10.1126/sciadv.aaz4876>, 2020.

426 Long, M. C., Moore, J. K., Lindsay, K., Levy, M., Doney, S. C., Luo, J. Y., Krumhardt, K. M., Letscher, R. T.,
 427 Grover, M., and Sylvester, Z. T.: Simulations With the Marine Biogeochemistry Library (MARBL), *J. Adv. Model.*
 428 *Earth Syst.*, 13, <https://doi.org/10.1029/2021MS002647>, 2021.

429 Manabe, S. and Stouffer, R. B.: Freshwater input to the North Atlantic Ocean, *Nature*, 378, 165–167, 1995.

430 Marañón, E.: Cell Size as a Key Determinant of Phytoplankton Metabolism and Community Structure, *Ann. Rev.*
 431 *Mar. Sci.*, 7, 241–264, <https://doi.org/10.1146/annurev-marine-010814-015955>, 2014.

432 Marinov, I., Doney, S. C., and Lima, I. D.: Response of ocean phytoplankton community structure to climate
 433 change over the 21st century: Partitioning the effects of nutrients, temperature and light, *Biogeosciences*, 7, 3941–
 434 3959, <https://doi.org/10.5194/bg-7-3941-2010>, 2010.

435 Meinshausen, M., Meinshausen, N., Hare, W., Raper, S. C. B., Frieler, K., Knutti, R., Frame, D. J., and Allen, M.
 436 R.: Greenhouse-gas emission targets for limiting global warming to 2°C, *Nature*, 458, 1158–1162,
 437 <https://doi.org/10.1038/nature08017>, 2009.

438 Moore, C. M., Mills, M. M., Arrigo, K. R., Berman-Frank, I., Bopp, L., Boyd, P. W., Galbraith, E. D., Geider, R.
 439 J., Guieu, C., Jaccard, S. L., Jickells, T. D., La Roche, J., Lenton, T. M., Mahowald, N. M., Marañón, E., Marinov,
 440 I., Moore, J. K., Nakatsuka, T., Oschlies, A., Saito, M. A., Thingstad, T. F., Tsuda, A., and Ulloa, O.: Processes
 441 and patterns of oceanic nutrient limitation, *Nat. Geosci.*, 6, 701–710, <https://doi.org/10.1038/ngeo1765>, 2013.

442 Morán, X. A. G., López-Urrutia, Á., Calvo-Díaz, A., and LI, W. K. W.: Increasing importance of small
 443 phytoplankton in a warmer ocean, *Glob. Chang. Biol.*, 16, 1137–1144, [https://doi.org/10.1111/j.1365-](https://doi.org/10.1111/j.1365-2486.2009.01960.x)
 444 [2486.2009.01960.x](https://doi.org/10.1111/j.1365-2486.2009.01960.x), 2010.

445 Nagelkerken, I. and Connell, S. D.: Global alteration of ocean ecosystem functioning due to increasing human
 446 CO₂ emissions, *Proc. Natl. Acad. Sci. U. S. A.*, 112, 13272–13277, <https://doi.org/10.1073/pnas.1510856112>,
 447 2015.

448 Needham, M. R., Falter, D. D., and Randall, D. A.: Changes in External Forcings Drive Divergent AMOC
 449 Responses Across CESM Generations, *Geophys. Res. Lett.*, 51, <https://doi.org/10.1029/2023GL106410>, 2024.

450 Oh, J. H., An, S. Il, Shin, J., and Kug, J. S.: Centennial Memory of the Arctic Ocean for Future Arctic Climate
 451 Recovery in Response to a Carbon Dioxide Removal, *Earth’s Futur.*, 10, <https://doi.org/10.1029/2022EF002804>,
 452 2022.

453 Oh, J. H., Kug, J. S., An, S. Il, Jin, F. F., McPhaden, M. J., and Shin, J.: Emergent climate change patterns
 454 originating from deep ocean warming in climate mitigation scenarios, *Nat. Clim. Chang.*, 14, 260–266,
 455 <https://doi.org/10.1038/s41558-024-01928-0>, 2024.

Park, S. W. and Kug, J. S.: A decline in atmospheric CO₂ levels under negative emissions may enhance carbon retention in the terrestrial biosphere, *Commun. Earth Environ.*, 3, 2–9, <https://doi.org/10.1038/s43247-022-00621-4>, 2022.

Park, S. W., Mun, J. H., Lee, H., Steinert, N. J., An, S. Il, Shin, J., and Kug, J. S.: Continued permafrost ecosystem carbon loss under net-zero and negative emissions, *Sci. Adv.*, 11, 1–10, <https://doi.org/10.1126/sciadv.adn8819>, 2025.

Passow, U. and Carlson, C. A.: The biological pump in a high CO₂ world, *Mar. Ecol. Prog. Ser.*, 470, 249–271, <https://doi.org/10.3354/meps09985>, 2012.

Pathirana, G., Oh, J. H., Cai, W., An, S. Il, Min, S. K., Jo, S. Y., Shin, J., and Kug, J. S.: Increase in convective extreme El Niño events in a CO₂ removal scenario, *Sci. Adv.*, 9, 1–10, <https://doi.org/10.1126/sciadv.adh2412>, 2023.

Platt, T., Fuentes-Yaco, C., and Frank, K. T.: Spring algal bloom and larval fish survival off Nova Scotia, *Nature*, 423, 398–399, 2003.

Reid, P. C., Battle, E. J. V., Batten, S. D., and Brander, K. M.: Impacts of fisheries on plankton community structure, *ICES J. Mar. Sci.*, 57, 495–502, <https://doi.org/10.1006/jmsc.2000.0740>, 2000.

Renssen, H., Goosse, H., and Fichefet, T.: Contrasting trends in North Atlantic deep-water formation in the Labrador Sea and Nordic Seas during the Holocene, *Geophys. Res. Lett.*, 32, 1–4, <https://doi.org/10.1029/2005GL022462>, 2005.

Richardson, A. J. and Schoeman, D. S.: Climate impact on plankton ecosystems in the Northeast Atlantic, *Science* (80-.), 305, 1609–1612, <https://doi.org/10.1126/science.1100958>, 2004.

Rogelj, J., Den Elzen, M., Höhne, N., Fransen, T., Fekete, H., Winkler, H., Schaeffer, R., Sha, F., Riahi, K., and Meinshausen, M.: Paris Agreement climate proposals need a boost to keep warming well below 2 °C, *Nature*, 534, 631–639, <https://doi.org/10.1038/nature18307>, 2016.

Sabine, C. L., Feely, R. A., Gruber, N., Key, R. M., Lee, K., Bullister, J. L., Wanninkhof, R., Wong, C. S., Wallace, D. W., Tilbrook, B., Millero, F. J., Peng, T.-H., Kozyr, A., and Ono, T.: The Oceanic Sink for

481 Anthropogenic CO₂ Author(s), *Rios Source Sci. New Ser.*, 305, 367–371, 2004.

482 Schmittner, A.: Decline of the marine ecosystem caused by a reduction in the Atlantic overturning circulation,
 483 *Nature*, 434, 628–633, <https://doi.org/10.1038/nature03476>, 2005.

484 Schwinger, J. and Tjiputra, J.: Ocean Carbon Cycle Feedbacks Under Negative Emissions, *Geophys. Res. Lett.*,
 485 45, 5062–5070, <https://doi.org/10.1029/2018GL077790>, 2018.

486 Schwinger, J., Asaadi, A., Goris, N., and Lee, H.: Possibility for strong northern hemisphere high-latitude cooling
 487 under negative emissions, *Nat. Commun.*, 13, <https://doi.org/10.1038/s41467-022-28573-5>, 2022.

488 Song, S. Y., Yeh, S. W., An, S. Il, Kug, J. S., Min, S. K., Son, S. W., and Shin, J.: Asymmetrical response of
 489 summer rainfall in East Asia to CO₂ forcing, *Sci. Bull.*, 67, 213–222, <https://doi.org/10.1016/j.scib.2021.08.013>,
 490 2022.

491 Steinacher, M., Joos, F., Frölicher, T. L., Bopp, L., Cadule, P., Cocco, V., Doney, S. C., Gehlen, M., Lindsay, K.,
 492 Moore, J. K., Schneider, B., and Segschneider, J.: Projected 21st century decrease in marine productivity: A multi-
 493 model analysis, *Biogeosciences*, 7, 979–1005, <https://doi.org/10.5194/bg-7-979-2010>, 2010.

494 Tong, D., Zhang, Q., Zheng, Y., Caldeira, K., Shearer, C., Hong, C., Qin, Y., and Davis, S. J.: Committed
 495 emissions from existing energy infrastructure jeopardize 1.5 °C climate target, *Nature*, 572, 373–377,
 496 <https://doi.org/10.1038/s41586-019-1364-3>, 2019.

497 Tréguer, P., Bowler, C., Moriceau, B., Dutkiewicz, S., Gehlen, M., Aumont, O., Bittner, L., Dugdale, R., Finkel,
 498 Z., Iudicone, D., Jahn, O., Guidi, L., Lasbleiz, M., Leblanc, K., Levy, M., and Pondaven, P.: Influence of diatom
 499 diversity on the ocean biological carbon pump, *Nat. Geosci.*, 11, 27–37, [https://doi.org/10.1038/s41561-017-](https://doi.org/10.1038/s41561-017-0028-x)
 500 0028-x, 2018.

501 Van Vuuren, D. P., Stehfest, E., Gernaat, D. E. H. J., Van Den Berg, M., Bijl, D. L., De Boer, H. S., Daioglou,
 502 V., Doelman, J. C., Edelenbosch, O. Y., Harmsen, M., Hof, A. F., and Van Sluisveld, M. A. E.: Alternative
 503 pathways to the 1.5 °C target reduce the need for negative emission technologies, *Nat. Clim. Chang.*, 8, 391–397,
 504 <https://doi.org/10.1038/s41558-018-0119-8>, 2018.

505 Winder, M. and Sommer, U.: Phytoplankton response to a changing climate, <https://doi.org/10.1007/s10750-012->

506 1149-2, 1 November 2012.

507 Wu, P., Jackson, L., Pardaens, A., and Schaller, N.: Extended warming of the northern high latitudes due to an
508 overshoot of the Atlantic meridional overturning circulation, *Geophys. Res. Lett.*, 38, 1–5,
509 <https://doi.org/10.1029/2011GL049998>, 2011.

510 Yi, X., Fu, F. X., Hutchins, D. A., and Gao, K.: Light availability modulates the effects of warming in a marine
511 N₂ fixer, *Biogeosciences*, 17, 1169–1180, <https://doi.org/10.5194/bg-17-1169-2020>, 2020.

512

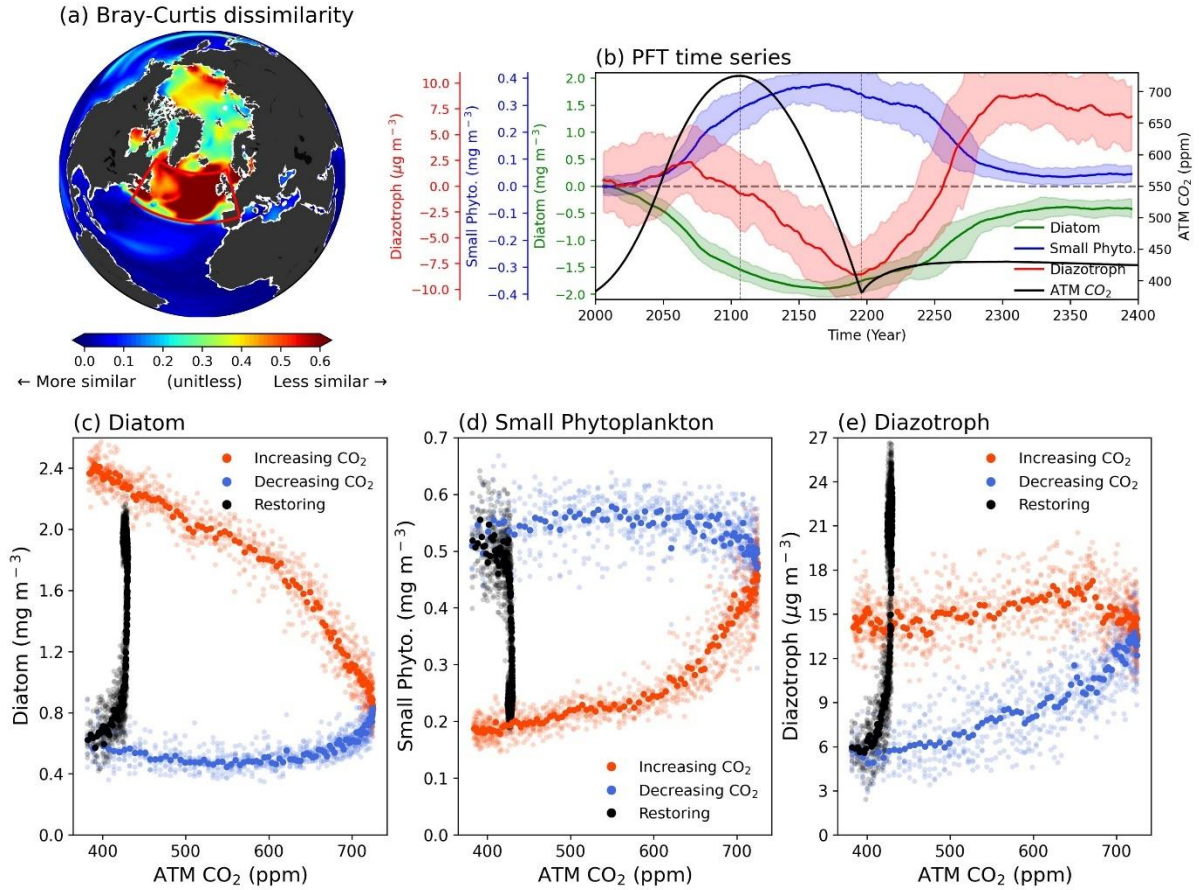


Figure 1. a, Bray-Curtis dissimilarity of phytoplankton community between climatology period and CO₂ down period. Larger values indicate a significant change in phytoplankton composition between the two periods. **b**, Time series of three phytoplankton functional types (PFTs). The colors in each plot represent atmospheric CO₂ concentration (black), diatom (green), small phytoplankton (blue), and diazotroph (red), respectively. All plots are drawn in 11-year moving averages. Shading indicates the range of minimum-maximum values between total ensembles. Changes in SPNA area-averaged biomass (y-axis) by PFTs corresponding to global mean atmospheric CO₂ concentration (x-axis) for **c**, diatoms **d**, small phytoplankton and **e**, diazotrophs. The colors in scatters indicate the 3 periods (CO₂ increasing period; orange, CO₂ decreasing period; blue, Restoring; black).

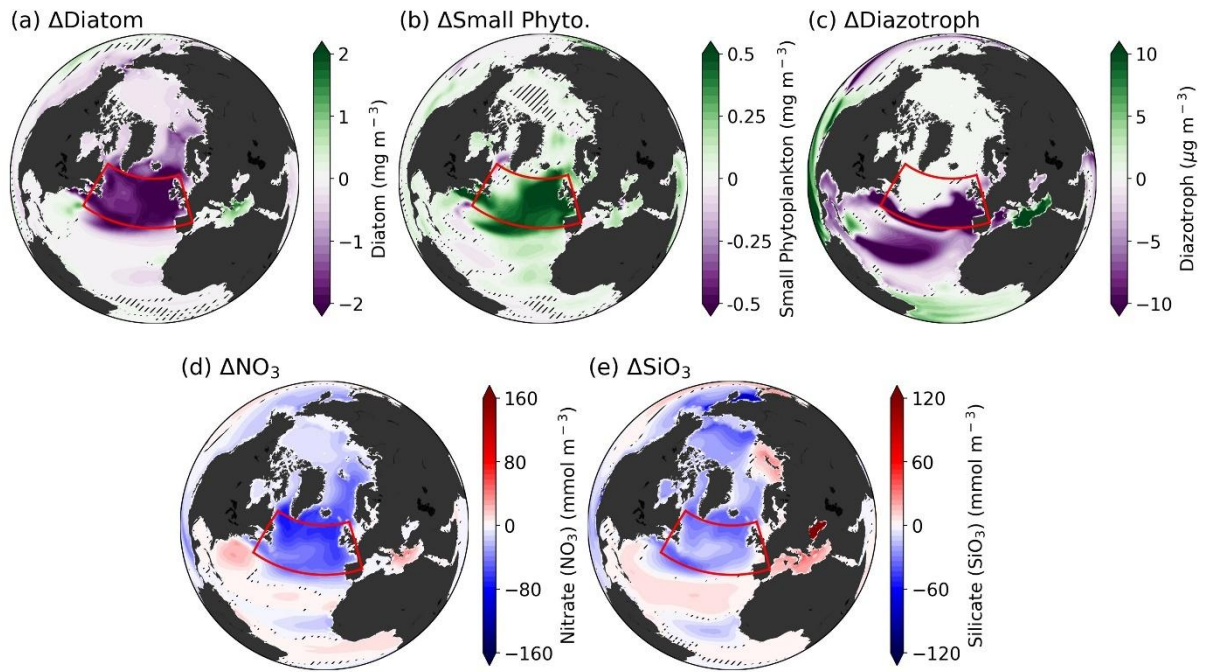


Figure 2. **a-c**, Differences in each PFT between CO₂ down and climatology periods **d-e**, Differences in macronutrients (NO₃, PO₄) between CO₂ down and climatology periods. Hatches indicate the non-significant region between total ensembles based on the bootstrap method.

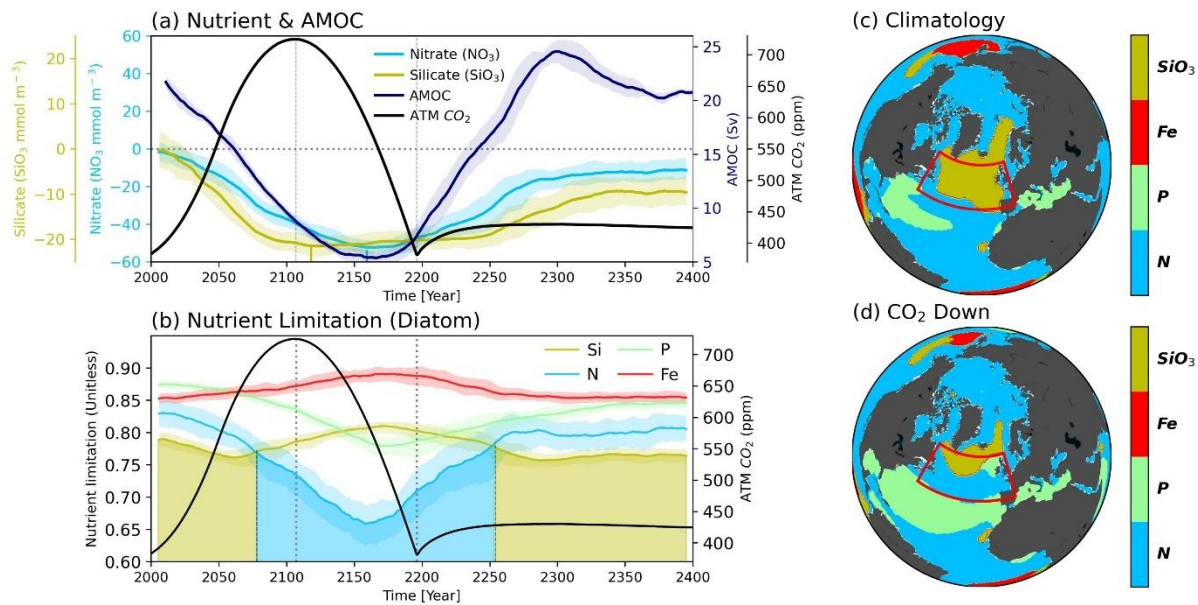


Figure 3. a, Time series of strength of Atlantic Meridional Overturning Circulation (AMOC; navy), Nitrate (NO_3 ; sky-blue), Silicate (SiO_3 ; dark-khaki) and atmospheric CO_2 concentration (black) **b**, Nutrient limitation of diatom for four nutrients (SiO_3 ; dark-khaki, Nitrogen (N); sky-blue, Phosphorus (P); light-green, Iron (Fe); red). All plots are drawn in 11-year moving averages and the shading indicates the range of minimum-maximum values between total ensembles. In addition, the shaded areas under the plots indicate the primary limiting nutrients for diatom growth. Nutrient limitation distribution of diatom during both **c**, Climatology and **d**, CO_2 down period.

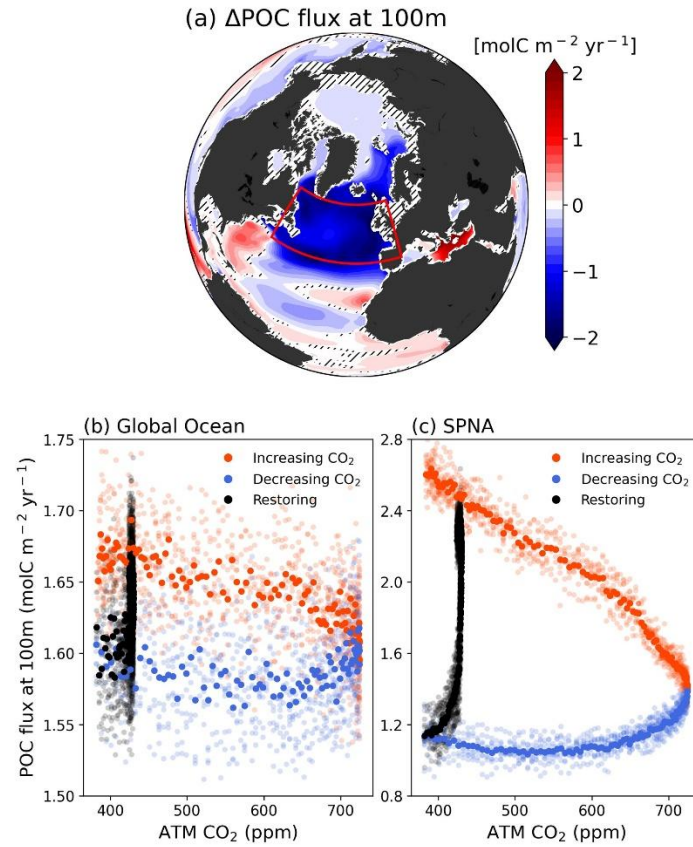


Figure 4. **a**, Differences of Particulate Organic Carbon (POC)-flux at 100m depth between CO₂ down and climatology periods. Changes in POC-flux at 100m depth of **b**, global ocean and **c**, SPNA region in response to CO₂ forcing. Orange color scatters indicate the CO₂ increasing period, blue scatters indicate the CO₂ decreasing period and black scatters indicate the Restoring period.