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The southward migration of the Antarctic Circumpolar Current enhanced oceanic degassing of carbon dioxide during the last two deglaciations

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Previous studies suggest that meridional migrations of the Antarctic Circumpolar Current may have altered wind-driven upwelling and carbon dioxide degassing in the Southern Ocean during past climate transitions. Here, we report a quantitative and continuous record of the Antarctic Circumpolar Current latitude over the last glacial-interglacial cycle, using biomarker-based reconstructions of surface layer temperature gradient in the southern Indian Ocean. The results show that the Antarctic Circumpolar Current was more equatorward during the ice ages and shifted $\sim 6^\circ$ poleward at the end of glacial terminations, consistent with Antarctic Circumpolar Current migration playing a role in glacial-interglacial atmospheric carbon dioxide change. Comparing the temporal evolution of the Antarctic Circumpolar Current mean latitude with other observations provides evidence that Earth's axial tilt affects the strength and latitude range of Southern Ocean wind-driven upwelling, which may explain previously noted deviations in atmospheric carbon dioxide concentration from a simple correlation with Antarctic climate.

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On glacial-interglacial timescales, it is believed that the Southern Ocean strongly impacted the atmospheric carbon dioxide (CO_2) inventory owing to its leverage on the communication between the atmosphere and the voluminous ocean carbon reservoir^{1,2}. Several mechanisms are proposed to have curbed CO_2 release from the ocean interior during glacial periods, including sea ice expansion³, an increase in Subantarctic phytoplankton export production fueled by higher iron-bearing dust supply to the surface ocean^{4,5}, and isolation of Antarctic Zone (AZ) surface waters from CO_2 -rich deep water masses^{6–12}. Regarding the last mechanism, while several proposals exist for the cause of AZ surface isolation, such as changes in surface buoyancy forcing and changes in abyssal mixing over rough seafloor topography, altered wind-driven upwelling is able to provide a holistic explanation for reconstructed changes in high latitude oceans of both hemispheres, for glacial-interglacial changes as well as millennial-scale events (ref. ⁹ and references within).

Changes in the position and/or strength of Southern Westerly Winds (SWW) are thought to have modulated Antarctic upwelling^{13–15}. Surface winds cause divergent Ekman transport south of the wind stress maximum, near the axis of the Antarctic Circumpolar Current (ACC) between 45°S and 55°S, leading to the upwelling of CO_2 - and nutrient-rich subsurface waters along tilted surfaces of constant density. These isopycnals run poleward and upward across the ACC¹⁶, inducing strong meridional gradients in sea surface temperature (SST) and density that define the ACC frontal system^{17,18}. The Polar Frontal Zone (PFZ) and the Subantarctic Zone (SAZ), enveloped by the Antarctic Polar Front (APF) to the south and the Subtropical Front (STF) to the north, mark the transition from the cold Antarctic surface water derived from outcropping deep water masses, to the warm Subtropical Zone (STZ) surface waters. The meridional location of this transition has important implications for Southern Ocean overturning circulation and thus the partitioning of CO_2 between ocean and atmosphere and global climate during glacial-interglacial cycles^{13,19}.

Modern oceanographic data and numerical simulations suggest that the ACC fronts are largely steered by seafloor bathymetry due to the depth structure of the frontal jets, but the extent of frontal shift under substantial climate forcing is still under

debate^{20,21}. Similarly, model simulations are not consistent in their evaluation of the effect of changing SWW stress on upwelling intensity^{22,23}. On glacial-interglacial timescales, available paleoceanographic reconstructions agree on the direction of latitudinal shifts of the ACC fronts^{24–29} but do not agree on coherent patterns of change in the SWW³⁰. In order to reconstruct changes in Southern Ocean upwelling and identify its drivers, additional quantitative information is needed on the temporal evolution of the ACC fronts on a continuous basis over glacial cycles^{9,12,13,19}.

To shed light on the timing and structure of Southern Ocean frontal movements and connect these with changes in SWW and upwelling dynamics, we report reconstructions of the meridional gradient in surface layer temperature across the ACC in the southern Indian Ocean based on the TEX_{86}^L paleothermometer, using a revised TEX_{86}^L calibration (Supplementary Note 1). TEX_{86}^L is an organic compound-based proxy that records changes in temperature at the sea surface or the shallow subsurface^{31–33} and is thought to be appropriate for polar and subpolar regions (Supplementary Note 2). For simplicity, we refer to both the TEX_{86}^L -reconstructed 0–200 m integrated temperature and World Ocean Atlas (WOA) 2009 0–200 m integrated temperature as sea surface temperature (SST) in this study. We analyze the temporal evolution of reconstructed SST difference (ΔSST) between MD11-3357 (44.68°S, 80.43°E, 3,349 m water depth) and MD11-3353 (50.57°S, 68.39°E, 1568 m water depth) in the Subantarctic and Antarctic zones (SAZ and AZ) of the southeast Indian Ocean, respectively (Fig. 1). The meridional ΔSST between the SAZ and AZ sites is used to investigate the temporal evolution of frontal displacements, based on a simple quantitative framework (see “Methods”). Our focus is the steep temperature gradient in the ACC enveloped by the APF and the STF, so the meridional frontal displacements reconstructed in this study refer to the band of transition from Antarctic surface water to subtropical water rather than a strictly defined front. This approach is enabled by applying the same paleothermometric method to core sites across a large latitudinal range. Our analyses produce a temporally continuous reconstruction of the ACC latitude that lends strong support to the hypothesis of meridional frontal migration during the last glacial cycle, with a generally more equatorward position during cold periods and more

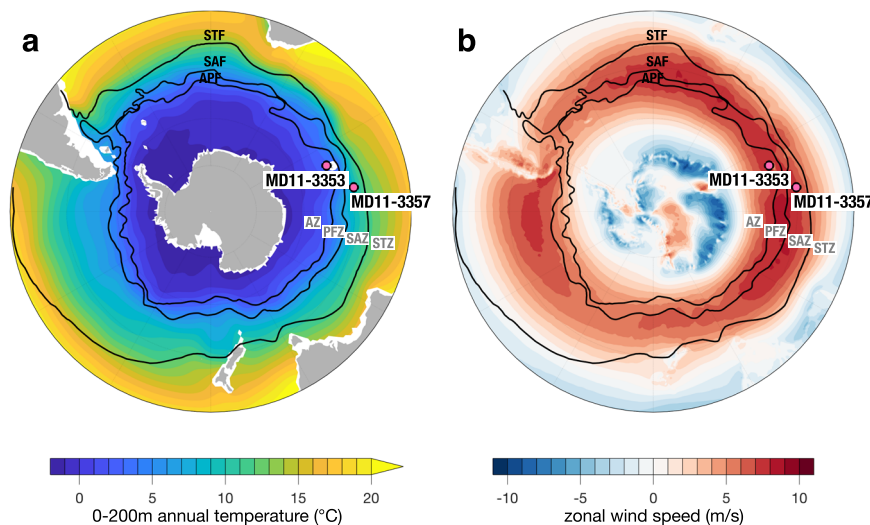


Fig. 1 Maps of modern Southern Ocean 0–200 m annual surface temperature (SST) and 10 m zonal wind. **a** Annual 0–200 m surface temperature of World Ocean Atlas 2009⁴⁵ (°C) and **b** 10 m zonal wind strength based on reanalysis data for the period 1951–1978^{78,79}. Pink circles indicate core locations of MD11-3353 (50.57°S, 68.39°E) in the Antarctic Zone (AZ) and MD11-3357 (44.68°S, 80.43°E) in the Subantarctic Zone (SAZ). STF Subtropical Front; SAF Subantarctic Front, APF Antarctic Polar Front, after ref. ¹⁸.

poleward location during warm intervals. Based on the results, we argue that the mean position of the SWW had a profound impact on the latitudinal position of the Southern Ocean fronts in the study region. In addition, Earth's axial tilt (obliquity) has been proposed to force changes in atmospheric and oceanic circulation and strongly affects the climate of the middle to high latitude Southern Hemisphere³⁴. Asynchrony between CO₂ and Antarctic temperature in late Pleistocene ice core records is found to be associated with obliquity³⁵, and recent reconstruction of Antarctic Zone surface nutrient conditions has provided evidence for a mechanistic link between obliquity and this asynchrony via its modification of Antarctic upwelling and CO₂ outgassing during the last glacial cycle¹². The quantitative, temporally continuous reconstruction of the ACC latitude in this work allows identification of the effect of obliquity on ACC isotherms, providing additional support for the effect of obliquity on SWW intensity and Antarctic upwelling.

Results and discussion

Fidelity of TEX₈₆^L in the Kerguelen region. The TEX₈₆^L paleothermometer is based on the relationship between SST and the distribution of archaeal membrane lipids (glycerol dibiphytanyl glycerol tetraethers [GDGTs])³¹. In polar and subpolar regions, the TEX₈₆^L index has been shown to provide more realistic paleotemperature estimates than the TEX₈₆^L index^{32,33}. The main difference between the two indices is that TEX₈₆^L does not include the crenarchaeol regioisomer, which is found only in low abundances at SSTs below 15 °C (Supplementary Fig. 1)³³. Numerous studies have applied TEX₈₆^L in the (sub)polar regions for downcore temperature reconstruction^{12,32,36–41}. The offset of reconstructed TEX₈₆^L-SST (compared to WOA09 SST) for the global core-top compilation⁴² is ± 3.2 °C (Supplementary Note 3), which is likely due to influences from factors such as the depth and seasonality of GDGT export, archaeal community change, and terrestrial GDGT input⁴³, on top of potential interlaboratory variation⁴⁴. Previous studies postulated that in more restricted localities, the error of TEX₈₆^L SST reconstruction is smaller than that in the global TEX₈₆^L calibration, since these factors are less variable within a given region. Within the Indo-Pacific ACC core-tops, although there is a tendency for TEX₈₆^L to overestimate SSTs in this region, our revised TEX₈₆^L calibration accurately captures the SST difference (Δ SST) between any two sites (Supplementary Note 3). This is likely due to a relatively uniform non-thermal contribution to TEX₈₆^L within the region. The offset of reconstructed TEX₈₆^L Δ SST (compared to WOA09 Δ SST) between any two core-tops within a specific region of the ACC is overall smaller than that between any two core-tops in the whole ACC, supporting the hypothesis of more similar non-thermal factors in more restricted oceanographic settings (Supplementary Note 3).

The overall glacial-interglacial change of TEX₈₆^L-SST at the two sites agree well with SST records of other paleothermometry methods from nearby sites (Supplementary Note 4). The youngest (core-top) samples from MD11-3357 and MD11-3353 (with estimated ages of 1.06 ka and 0.79 ka, respectively) provide SST estimates of 12.9 °C and 4.1 °C, respectively (Fig. 2), 3.0 °C and 1.3 °C warmer than the WOA09 SST⁴⁵ (9.9 °C and 2.8 °C, respectively). These errors lie within ± 1 standard deviation for the Indo-Pacific ACC core-tops (Supplementary Note 3). The GDGT indices related to several non-thermal factors fall within the expected range for the two core sites (Supplementary Note 5), suggesting that the tendency to overestimate SST at the two sites may be due to non-thermal contributions not reflected in these GDGT indices. The TEX₈₆^L core-top Δ SST between the two sites is 8.8 °C, 1.7 °C higher than the WOA09 Δ SST. Apart from non-thermal factors mentioned above, this difference between reconstructed core-top Δ SST and modern Δ SST may derive from high

frequency SST changes in the Southern Ocean. Millennial-scale SST oscillations of as much as 4 °C have been observed around the Antarctic Peninsula⁴⁶, which were synchronous with SST oscillations of ~ 1 °C in the southwest Pacific in the late Holocene⁴⁷. Given that the surface sediments in the Kerguelen region are often more than one thousand years old¹², an offset of 1.7 °C between the core-top TEX₈₆^L Δ SST and WOA09 Δ SST is reasonable. As MD11-3353 and MD11-3357 are close to each other in the Kerguelen region, the factors potentially affecting TEX₈₆^L temperature reconstruction are likely similar at the two sites throughout the time period of interest. If so, the resulting uncertainties in absolute temperature estimation should be of similar amplitude and of the same direction, such that they should not greatly bias the calculated temperature difference between the two sites. We take 1 °C to be the uncertainty of the reconstructed Δ SST, taking both analytical precision and non-thermal archaeal factors into consideration (Supplementary Note 6).

SST changes and the link to frontal shifts. SSTs at both MD11-3353 and MD11-3357 are closely correlated with Antarctic ice core-reconstructed air temperature⁴⁸ (Fig. 2). The records depict a glacial-interglacial SST amplitude of about 9 °C (Fig. 2), in good agreement with multi-proxy SST reconstructions in the area^{49,50}. In WOA09, the steepest slope of longitudinally averaged SST in the Kerguelen region lies north of AZ site MD11-3353 and around three-fifths south of SAZ site MD11-3357 (Supplementary Fig. 15). Δ SST would decrease (SSTs would become more similar) if, as a consequence of frontal shifts, both sites recorded temperatures from more similar water masses. This would occur if the fronts shifted either northward or southward.

The reconstructed Δ SST between the two core sites during the past 150 ka shows a pattern distinct from that of the glacial-interglacial climate evolution (Fig. 2a). This pattern is not a result of uncertainties in the age model (Supplementary Note 7). During peak glacial intervals such as Marine Isotope Stage (MIS) 2, 4, and 6, Δ SST is reduced to 4.5–6 °C. It reaches maximum values of >7.5 °C during intermediate climate intervals, such as MIS 5c and MIS 3, while during peak interglacials, Δ SST drops again to 4–6 °C. A cross-plot between Δ SST and the Antarctic ice-core (EPICA Dome C (EDC)) temperature reconstruction supports the inference that Δ SST decreases as climate approaches peak cold and warm climate states and reaches highest values under intermediate climate conditions (Fig. 3a). This non-monotonic relationship between Δ SST and EDC temperature suggests that the ACC fronts have shifted northward and southward as climate changed.

To understand the impact of frontal shifts on Δ SST between the selected core sites, we use a simple quantitative framework to illustrate the responses of SST at individual sites and Δ SST between sites to latitudinal migrations of the ACC and explore the outputs of different scenarios of coupling between frontal latitude and regional climate under different setups of the framework (Fig. 3; see “Methods”, Supplementary Note 8 & 9). We first simplified the meridional SST profile in the Kerguelen region in WOA09 into three segments, the AZ segment, the Polar Transition Zone (PTZ) segment—which includes the PFZ and SAZ—and the STZ segment, respectively. Then we applied different parameters to alter the three segments, mimicking hypothetical frontal changes, while assuming that the width of the PTZ has been constant. The parameters dictating the response of Δ SST to a certain ACC latitude change in this quantitative framework are the ranges of glacial-interglacial SST change in the AZ and the STZ, respectively, which reflect the extent of polar amplification. For the sensitivity analysis, we explored the changes of Δ SST between our sites compared to Antarctic climate (with EDC temperature taken as representing the latter) under different scenarios of coupling between frontal latitude and

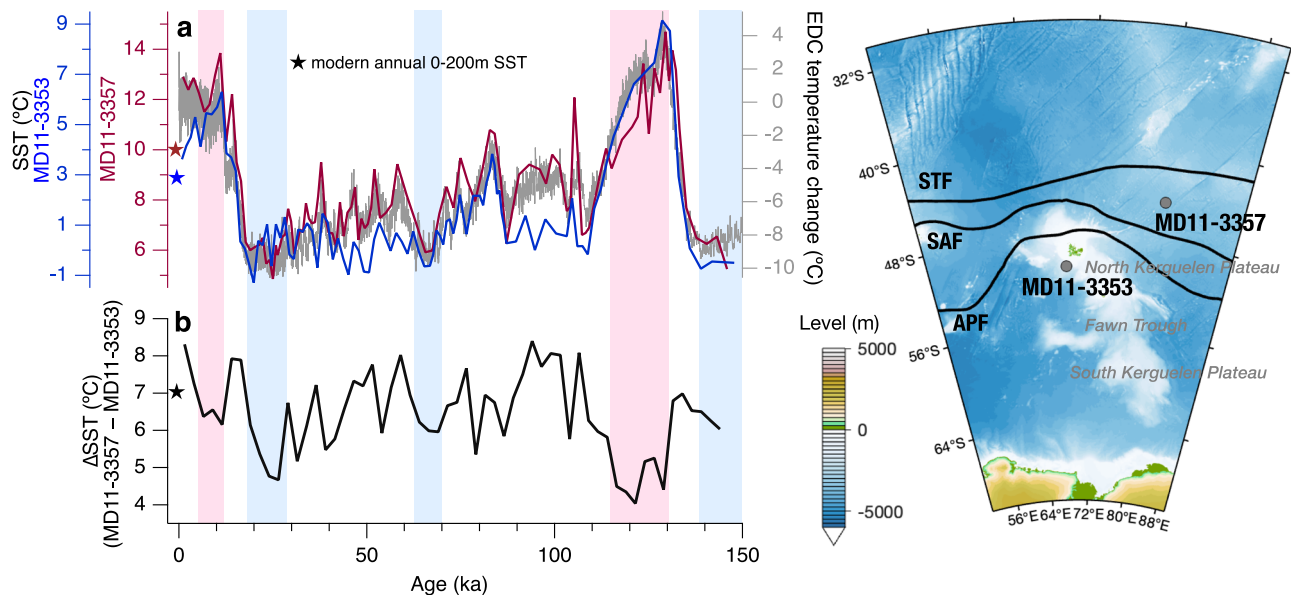


Fig. 2 Sea surface temperature (SST) reconstructions across the last glacial cycle. **a** GDGT-based ($\text{TEX}_{86}^{\text{L}}$) SST reconstruction for core MD11-3357 (red) and core MD11-3353 (blue), compared to the EPICA Dome C (EDC) temperature change⁴⁸ (gray). **b** SST difference (ΔSST) between the two cores, $\text{SST}(\text{MD11-3357}) - \text{SST}(\text{MD11-3353})$, interpolated on a 2.5 kyr time step. Blue bars indicate cold periods of MIS 2, 4, and 6 and pink bars indicate warm periods of MIS 5e and the early Holocene. Arrows on the y-axis indicate modern annual temperatures of the shallow subsurface (0–200 m)⁴⁵. The map shows the location of the core sites with bathymetry in the Kerguelen region⁸⁰. STF Subtropical Front, SAF Subantarctic Front, APF Antarctic Polar Front, after ref. 18.

regional climate and with different prescribed framework parameters (Supplementary Note 8). In this study, we assume that the relationship between the ACC latitude and Antarctic climate remains linear. This assumption is derived from a linear relationship between global mean temperature and SWW latitude observed in GCM simulations⁵¹, overall synchronicity between southern high latitude SST and global mean SST during the last glacial-interglacial cycle⁵², and strong coupling between the steep SST gradient in the Southern Ocean (which we used to define the ACC) and surface wind stress in both modern observations¹⁷ and GCM simulations⁵³. The results show that the non-monotonic relationship observed between ΔSST and EDC temperature only exists when the fronts shift alongside Antarctic climate change (Fig. 3, Supplementary Note 8). Altering either the prescribed framework parameters, namely the ranges of SST change in the AZ and the STZ, or the rate of frontal migration relative to Antarctic air temperature change alters the shape of the non-monotonic pattern (Supplementary Figs. 16 and 17).

Based on an estimated maximum glacial-interglacial SST change of 6 °C in the AZ and 2.5 °C in the STZ (Supplementary Note 9), an optimization algorithm was applied to find the linear model between ACC frontal latitude and Antarctic air temperature that best fits the $\text{TEX}_{86}^{\text{L}}$ -reconstructed ΔSST between MD11-3357 and MD11-3353: $\Delta\text{lat} \text{ (degrees)} = \Delta T_{\text{EDC}} \text{ (}^{\circ}\text{C)} * 0.58 + 4.20$ (see “Methods”, Supplementary Fig. 19). When we swap the maximum SST change in AZ and STZ (i.e., hypothetical tropical amplification), the optimization algorithm produces a very similar slope for the best-fitting linear model, suggesting that this linear relationship between ACC frontal latitude and Antarctic air temperature is robust and largely insensitive to changes in the prescribed parameters of the framework (Supplementary Fig. 19). Changes in the width of the ACC play a minor role in controlling the relationship between the simulated ΔSST of the two sites and Antarctic air temperature (Supplementary Note 10).

When the location of the ACC is kept unchanged, the simulated ΔSST decreases when climate warms (Fig. 3), which is the result of prescribed polar amplification in the framework.

This trend qualitatively matches that of the reconstructed ΔSST for the warmer climate intervals, but the simulated change in ΔSST is too small (Fig. 3d). In addition, the no-shift simulation cannot reproduce the low ΔSST characteristic of the coldest conditions. In contrast, when ACC frontal latitude increases linearly with Antarctic air temperature, the observed non-monotonic relationship between $\text{TEX}_{86}^{\text{L}}$ -reconstructed ΔSST and EDC temperature is well-captured (Fig. 3e). This simulation also captures many temporal features in the ΔSST change between the two sites (Fig. 3f) as well as in the glacial-interglacial SST changes at individual core sites (Supplementary Fig. 20). $\text{TEX}_{86}^{\text{L}}$ SST data from two additional sites located between the latitudes of MD11-3357 and MD11-3353 also agree with the simulated changes in ΔSST under the best-fitting linear model, albeit with greater uncertainty (Supplementary Note 11), indicating that our framework and the frontal shift model are robust for the southeast Indian Ocean. Within the four sites in the Kerguelen region, MD11-3353 and MD11-3357 likely represent the most appropriate pair to evaluate ΔSST for the effect of ACC migration because they are adequately close for frontal displacements to directly affect the ΔSST between the two sites, while being adequately distant that changes in ΔSST are robust against paleothermometric errors. Thus, our discussion of ACC latitude reconstruction focuses on these two sites.

ACC frontal shifts in the southern Indian Ocean over the last glacial cycle. While bottom topography is an important constraint on the path of barotropic deep ACC currents^{23,54}, large variability of the ACC fronts upstream and downstream of topographic features has been observed to correlate with SWW shifts induced by changes in Southern Annular Modes in the Indian Southern Ocean⁵⁵. In addition, the warming and freshening trend of the Southern Ocean reflects a southward displacement of isopycnals during the past 40 years²¹, and the surface hydrographic frontal structure has been observed to shift southward by about 60 km on a circumpolar average from 1992 to 2007⁵⁶. In the Kerguelen region, from 1992 to 2007, the APF

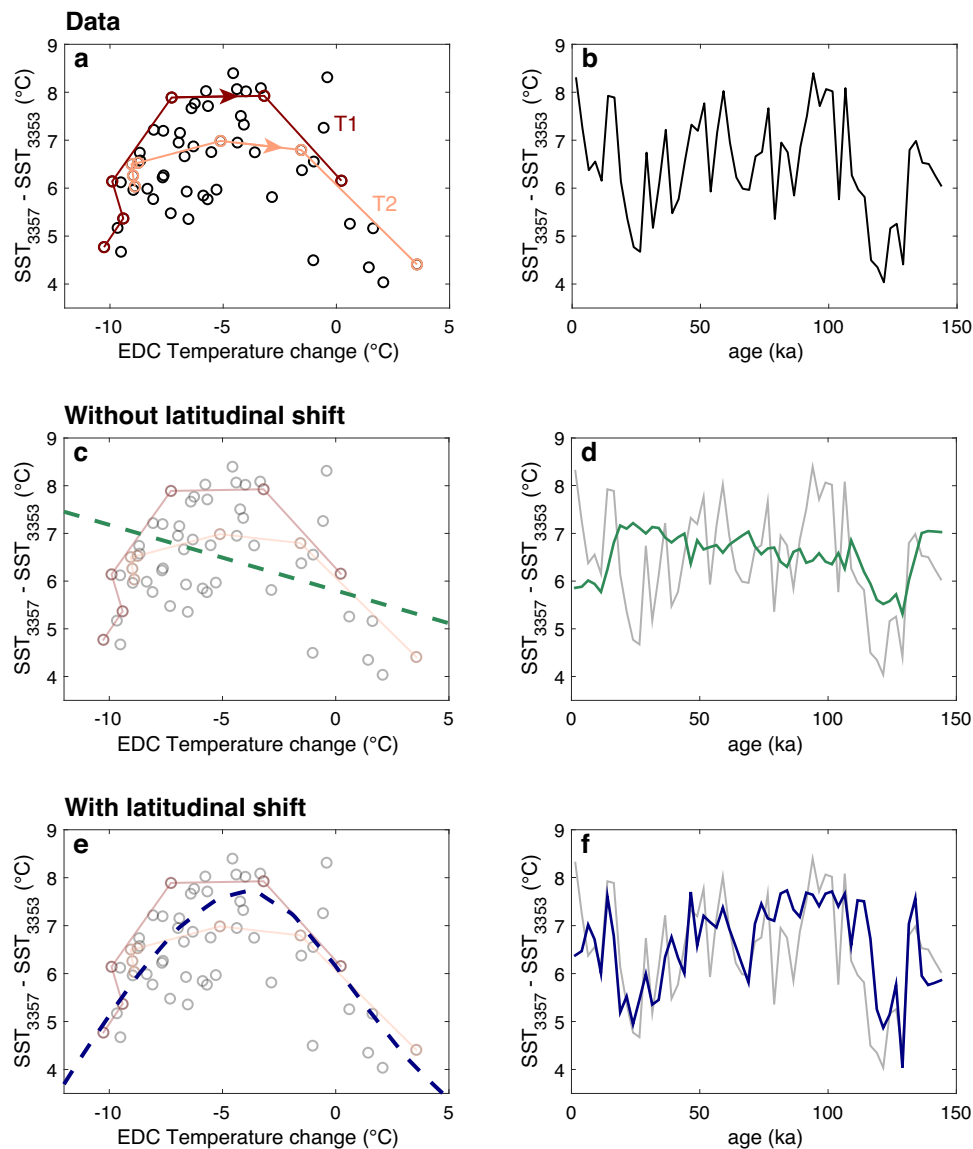


Fig. 3 Data-simulation comparison of the relationship between Antarctic air temperature and the sea surface temperature difference (Δ SST) between the two Southern Ocean sediment cores. a The reconstructed Δ SST in comparison with EPICA Dome C (EDC) temperature depicts a horseshoe pattern with its angular point (largest Δ SST) around -4°C . Red open circles represent data from the late MIS 2 to the end of Termination 1 (10–24 ka), and the red line and arrow represent the temporal progression of Δ SST towards younger ages. Orange open circles represent data from the late MIS 6 to the end of Termination 2 (129–144 ka), and the orange line and arrow represent the temporal progression of Δ SST towards younger ages. **b** The downcore record of reconstructed Δ SST between MD11-3357 and MD11-3353. **c, d** Simulated Δ SST between the latitude of MD11-3357 and that of MD11-3353 without ACC shift (green dashed line and solid line) compared with EDC temperature and age. **e, f** Simulated Δ SST with the best-fitting linear model of ACC shift (dark blue dashed line and solid line) compared with EDC temperature and age. The data in **(a)** and **(b)** are plotted semi-transparent in the background of **(c–f)**.

has been observed to change its position from passing north of the plateau to passing through Fawn Trough⁵⁶, suggesting that the ACC fronts can overcome topographic barriers under substantial forcing.

To reconstruct past changes in ACC latitude, using the relationship between Δ SST and ACC latitude inferred from our framework, we include the reconstructed $\text{TEX}^{\text{L}}_{86}$ - Δ SST between MD11-3353 and MD11-3357 to back-calculate the latitudinal changes of the ACC fronts based on the measured Δ SST (Fig. 4 and Supplementary Fig. 21; see “Methods”). During cold intervals, including MIS 2, MIS 4, and MIS 6, the low Δ SST implies a northward shift of the ACC of $\sim 2^\circ$ compared to today (Fig. 4d). During the previous interglacial (MIS 5e), SST at MD11-3357 and MD11-3353 were ~ 2 – 4°C warmer compared to pre-industrial, and the reconstructed Δ SST was very low ($\sim 4^\circ\text{C}$).

This suggests that the ACC fronts were as much as 6° further south than today (Fig. 4d), such that the steepest SST gradient moved southward of the AZ core MD11-3353. Our estimated ACC positions for both the LGM and MIS 5e appear to be more poleward than most of frontal shifts estimated in previous studies for the southern Indian Ocean (Supplementary Fig. 24). These studies either assume the same (sub-)isotherm as an ACC front throughout the glacial-interglacial climate change or assume the shift in abundance or size of specific plankton species to be associated with an ACC front. Factors such as homogenous cooling of the deep ocean, response of plankton to glacial-interglacial biogeochemical changes, and season-specific signals may bring uncertainty to frontal shifts based on the above assumptions, explaining the discrepancy in reconstructed frontal shifts between our study and previous studies (Supplementary

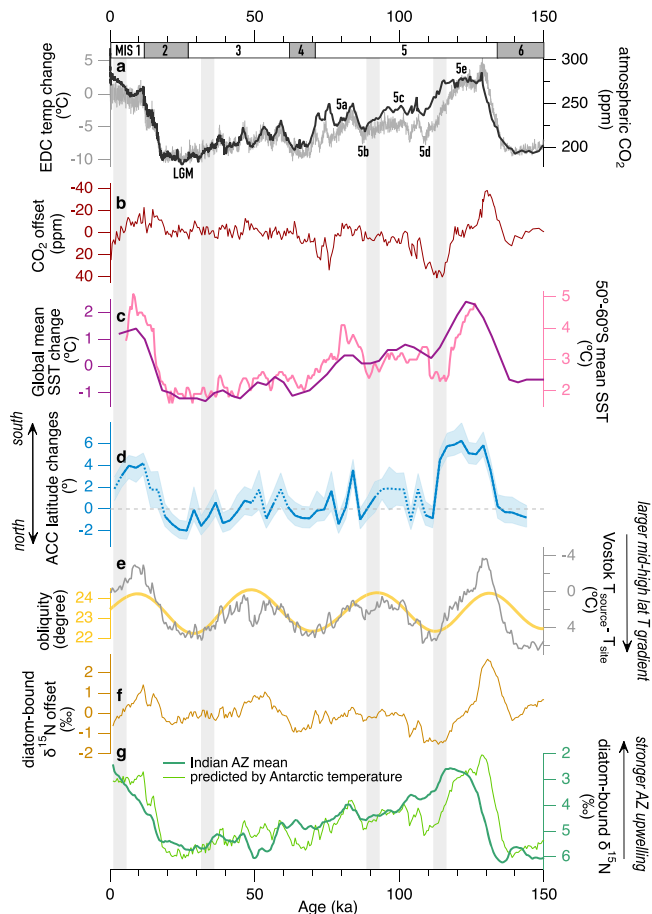


Fig. 4 Meridional migrations of the ACC over the last glacial cycle and their connections to climate and CO₂ change. **a** Atmospheric CO₂⁷² (black) and EPICA Dome C (EDC) temperature change⁴⁸ (gray). **b** Offset between CO₂ and predicted CO₂ based on a linear relationship between Antarctic ice core temperature and CO₂¹² (dark red). **c** Compilation of SST at 50°–60°S⁵² (pink) and global SST change⁶⁶ (purple). **d** Changes in ACC latitude calculated from Δ SST (3357–3353) (thick blue solid and dashed lines) and the uncertainty envelope (lighter shading). The dashed line represents where the measured Δ SST corresponds to an uncertainty range of ACC latitude change and the ACC latitude change is estimated as the average of the upper bound and lower bound (see “Methods”). **e** Changes in the difference between air temperatures at the moisture source (T_{source}) and ice core site (T_{site}) of Vostok (dark gray) relative to modern conditions reconstructed from ice deuterium excess⁷³, and obliquity⁸¹ (yellow). **f** Offset between Indian AZ diatom-bound $\delta^{15}\text{N}$ and predicted diatom-bound $\delta^{15}\text{N}$ based on a linear relationship between Antarctic air temperature and diatom-bound $\delta^{15}\text{N}$ ¹² (brown). **g** Combined record of Indian AZ diatom-bound $\delta^{15}\text{N}$ as an indicator of upwelling¹² (dark green) and predicted diatom-bound $\delta^{15}\text{N}$ based on a linear relationship between Antarctic air temperature and diatom-bound $\delta^{15}\text{N}$ ¹². The numbers at the top indicate Marine Isotope Stages. The vertical gray bars indicate different cooling periods of low obliquity (111.5–116.5 ka in MIS 5d) or lowering obliquity (1.5–6.5 ka in the late Holocene) during warmer conditions, low obliquity during glacial conditions (31.5–36.5 ka in MIS 3), and high obliquity during intermediate conditions (89–94 ka in MIS 5b).

Note 12). The very southward ACC position during MIS 5e reconstructed by our framework is further consistent with the unusually low biogenic opal flux at MD11-3353 during this interval⁴¹, which may be related to silicic acid limitation on diatom growth as a consequence of the more southward location of the APF (Supplementary Note 13 and Supplementary Fig. 25).

According to our framework, the rising temperatures at MD11-3357 and MD11-3353 during the last two glacial terminations were associated with poleward shifts in the ACC fronts that led to an initial increase followed by a decrease in Δ SST (Figs. 2b and 3a), as the steepest part of the meridional SST profile moved first to a position sandwiched between the two sites and then to a position partially south of both sites (Supplementary Fig. 15). At the end of both terminations, Δ SST progressed to a lower range (Fig. 3a), signaling that the fronts are most poleward at the beginning of interglacials (Fig. 4d). There appears to be an offset between the progressions of Δ SST during the two glacial terminations (Fig. 3a), which suggests that the SST structure within the ACC may be subject to more variations than our framework assumes. Nevertheless, the similar shape of the Δ SST progression when plotted over EDC temperature during the two terminations argues that they experienced similar changes in ACC frontal positions (Figs. 3a and 4d).

At the end of Termination 1 and in the early Holocene, the lower reconstructed Δ SST suggests that the steepest part of the meridional SST profile was partially south of MD11-3353 and the ACC fronts reached as much as $\sim 4^\circ$ southward of the current position (Fig. 4d). This ACC position agrees with a more southward APF in the Kerguelen region reconstructed previously for this time period²⁵, and is also consistent with the low opal flux observed at MD11-3353 during the last deglaciation and the early Holocene⁴¹ (Supplementary Note 13 and Supplementary Fig. 25). During the late Holocene, while Antarctic air temperature remained stable, the reconstructed Δ SST increased from $\sim 6.5^\circ\text{C}$ to $\sim 8^\circ\text{C}$ (Fig. 2), suggesting a gradual northward shift of the ACC fronts to place a greater portion of the steepest meridional SST transition between MD11-3353 and MD11-3357 (Fig. 4d). A northward ACC shift should correspond to a declining EDC temperature, yet the EDC temperature remained stable during this interval, resulting in a leftward trend that deviates from the linear relationship when the EDC temperature change is plotted over ACC latitude change (Fig. 5a). Here, we explore possible explanations for this deviation.

The location of Kerguelen Plateau in the flow path of the ACC (Fig. 2) may have made the fronts more prone to meander upstream and downstream of the plateau⁵⁵. The modern APF to the west of the Kerguelen Plateau is shown to seasonally meander by as much as 4° because of interaction with local topography⁵⁷. The large meander of the APF path may have caused sporadic changes in the width of the ACC, which may contribute to higher Δ SST between MD11-3357 and MD11-3353. The southern Kerguelen bathymetry (Fig. 2) may also help to explain the Holocene deviation from the relationship between EDC temperature and ACC latitude. Cival-Mazens et al.²⁵ suggested that during the warmer interglacials such as MIS 5e and MIS 9, the ACC is pushed poleward enough that the APF persistently passes through Fawn Trough, which is $\sim 5^\circ$ southward of the current APF, while the APF only briefly passed through Fawn Trough at the end of the last deglaciation and returned northward to its path north of the Kerguelen Plateau over the later part of Holocene because of the relatively mild climate. The authors also suggested a similar APF position for MIS 7, which is interpreted to be another more moderate interglacial. These interpretations agree with the idea that the bathymetric thresholds may be persistently surpassed in warmer interglacials such as MIS 5e, whereas during the intermediate interglacials such as the Holocene, this threshold was overcome only temporarily by the APF. Thus, the northward shift of the ACC fronts within the Holocene may be the consequence of a failed attempt to cross the bathymetric threshold.

Another possibility is that Antarctic Ocean surface water temperature is decoupled from EDC temperature during the Holocene. The decrease in summer insolation at 65°N in the last

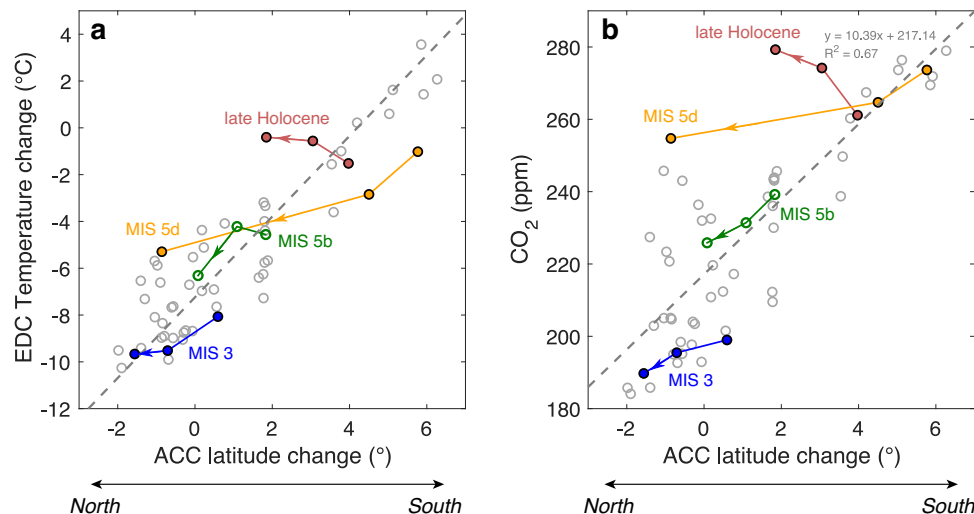


Fig. 5 EDC temperature change and atmospheric CO₂ compared to temporal changes in the latitude range of the ACC. Gray circles represent interpolated **a** EDC temperature changes⁴⁸ and **b** CO₂⁷² compared to changes in the latitudinal position of the ACC relative to today reconstructed from Δ SST between MD11-3353 and MD11-3357. Gray dashed line in (**a**) represents the best-fitting linear model between EDC temperature and ACC latitude. Gray dashed line in (**b**) represents a linear regression between atmospheric CO₂ and reconstructed ACC latitude change. Filled symbols and lines correspond to the shaded intervals in Fig. 4. Red symbols and arrowed line represent the progression during the late Holocene from 6 ka to 1 ka. Yellow symbols and arrowed line represent the progression during MIS 5d from 116.5 ka to 111.5 ka. Navy symbols and arrowed line represent the progression during MIS 3 from 36.5 ka to 31.5 ka. Open green symbols and arrowed line represent the progression at MIS 5b from 94 ka to 89 ka when obliquity is at maxima. Increased deviation of data from the linear relationship during MIS 2 and MIS 3 in (**a**) may be due to errors in the reconstructed ACC latitude during millennial scale events which are poorly resolved in the TEX₈₆ SST records. Increased deviation of data from the linear relationship during MIS 2–4 in (**b**) may be due to stronger effects of iron fertilization in the SAZ on CO₂ during these intervals.

10 ka is much smaller compared to that of 115–125 ka, and its cooling effect through the albedo feedback is weak, mostly constrained to the extratropical Northern Hemisphere⁵⁸. The lowering obliquity during the Holocene decreases the insolation received at high latitudes, but it may lead to a relatively weak cooling effect at Antarctica's inland ice core sites, as high albedo would result in little changes in net absorbed radiation. On the other hand, stronger cooling may occur at Antarctica's continental margins and the surrounding Antarctic Ocean. Similar to the TEX₈₆-SST at MD11-3353, diatom-based SST records from the AZ in the Indian and Atlantic sector also show a decline during the Holocene^{49,59}. SST reconstructions at different sites near the Western Antarctic Peninsula as well as the δ D record at Taylor Dome also show cooling temperatures for the last 10 ka, tracking the decline in local insolation⁴⁶. The cooling of the Antarctic Ocean would correspond with a northward shift of the ACC, as predicted by our linear model between Antarctic climate and ACC latitude.

A related explanation, which will be discussed further below, involves the role of obliquity in Southern Ocean upwelling. Declining obliquity over the Holocene is expected to have strengthened the SWW and thus northward Ekman surface water transport and upwelling in the AZ^{60,61}, consistent with diatom-bound nitrogen isotope reconstructions^{12,62} (Fig. 4f, g). Independent of any change in the meridional position of the SWW, this would have pushed surface isotherms equatorward (i.e., increasing the meridional tilt of isopycnals)⁶³. Thus, decoupling of ACC frontal position from Antarctic air temperature may be a fingerprint of obliquity-driven changes in upwelling.

Controls on ACC front latitudes. As a result of the back-calculation based on the best-fitting linear model, the temporal evolution of the ACC position deduced from Δ SST is generally correlating with changes in both ice core air temperature⁴⁸ and compiled

Southern Ocean SSTs⁵² (Fig. 4a, c, d). Our results provide quantitative evidence for the connection between Antarctic climate and the position of ACC flow path in the Indian sector of the Southern Ocean over glacial cycles, which allows identification of specific mechanisms that drive changes in the SWW in the Indian sector during climate transitions. ACC shifts during the last glacial cycle reconstructed in the Pacific and Atlantic sector have a similar glacial-interglacial trend as in the Indian sector, but the extents of the shifts appear to be different²⁶. It is proposed that in the Pacific Southern Ocean, tropical forcing of the SWW prevails over mid-to-high latitude forcing, suggesting heterogeneity in the changes of the SWW in different Southern Ocean sectors over orbital timescales⁶⁴. Thus, the interpretations of frontal latitude change in the Kerguelen region likely reflect the response of the ACC flow in the Indian Ocean, and the mechanisms identified in the following discussions may not be applicable to other sectors, while this quantitative method opens the door for future investigation of sector-specific ACC dynamics.

Variations in the latitude of SWW and the strong SST gradient that defines the ACC are found to be strongly coupled in modern oceanographic observations^{17,53} (Fig. 1). Applying these relationships to frontal shifts in the Indian Southern Ocean over the last glacial cycle, the northward displacements of the ACC during MIS 5d, MIS 4, and MIS 2 argue for coincident northward (equatorward) shifts of the SWW. These intervals are associated with global cooling driven by changes in Earth's orbital parameters, which, according to global climate model simulations, should have driven an equatorward shift of the westerly winds as part of a cooling-driven contraction of the Hadley cell^{60,65}. However, the cooling at MIS 5d does not bring global temperature or EDC temperature to LGM levels^{48,66}, while the coinciding equatorward shift of the ACC does (Fig. 4c, d), which results in an upward trend that slightly deviates from the linear relationship between EDC temperature and ACC latitude (Fig. 5a). Thus, some additional driver is needed to explain the extent of ACC equatorward shift at MIS 5d.

As introduced previously, another important factor in the mid-latitude westerly winds is Earth's obliquity⁶¹. As a result of the linear correlation between ACC latitude and Antarctic climate and the strong 40 kyr component in the EDC temperature record, the reconstructed ACC latitude over the last glacial cycle partially covaries with the obliquity cycle, with a more northward position associated with low obliquity (Fig. 4d, e). However, obliquity seems to be playing an additional role through its impact on SWW wind intensity, affecting upwelling in the Antarctic Zone and northward transport of cold water. In global climate model simulations, lower obliquity can enhance the mid-latitude temperature gradient, which in turn drives intensification of the mid-latitude westerly winds^{60,61,67,68}. In model simulations in which changes in eddy fluxes only partially cancel changes in wind-driven Ekman flow, an increase in wind strength would enhance the residual circulation of the Southern Ocean upper cell and increase the transport of cold water northward, leading to surface cooling to the north of the AZ⁶³, corresponding with a northward frontal shift. When we compare the progression of EDC temperature with the reconstructed latitudinal migration of the ACC in the Indian Southern Ocean, MIS 5d and the late Holocene, which are characterized by low or declining obliquity, fall to the left of the linear relationship (Fig. 5a), indicating greater northward ACC shift than predicted by EDC temperature change alone. This pattern becomes evident when comparing to MIS 5b, another relatively well-constrained period in our record that is associated with cooling and northward ACC shift but high obliquity, which plots along the linear relationship between EDC temperature and the latitudinal position of the ACC. The difference in the EDC temperature-ACC location relationship between these time intervals suggests that low obliquity can contribute to northward ACC migration by enhancing Antarctic upwelling. Unlike during the late Holocene when the effect of obliquity sustained strong upwelling in the AZ, during MIS 5d, this enhancement in upwelling by obliquity is a secondary effect which is masked by the dominating impact of equatorward ACC shift on the general Southern Ocean overturning circulation that acts to reduce surface-deep exchange. However, similar patterns in the deviation from the observed relationships between EDC temperature and ACC latitude, and between ACC latitude and atmospheric CO₂ during MIS 5d and the late Holocene, point to a uniform link to obliquity, which will be discussed in detail next.

Changes in upwelling and CO₂ outgassing. Changes in the latitude range of the ACC and the SWW may have important consequences for the release of carbon from the deep ocean through its communication with the atmosphere in the Southern Ocean¹⁴. A northward shift in the SWW would decrease upwelling of deep water in the upper cell of the overturning circulation in the Southern Ocean¹³, which would promote carbon storage through a combination of mechanisms⁹. In addition, decreased upwelling of the relatively warmer Circumpolar Deep Water under more equatorward SWW would promote the expansion of quasi-permanent sea ice and shoal the density interface between the lower and upper cells of the Southern Ocean overturning⁶⁹, decreasing the deep turbulent mixing and isolate Antarctic Bottom Water from the other water masses in the ocean interior, maintaining CO₂ in the deep ocean^{70,71}. Our reconstructed temporal changes in the latitudinal position of the ACC shows a generally linear relationship with atmospheric CO₂⁷² (Fig. 5b). There is more scatter in the data of MIS 2-4 (towards bottom left in Fig. 5b), which may be due to effects of increased iron-fertilization in the SAZ on atmospheric CO₂ during these intervals that may not strictly correspond with ACC latitude change^{5,12}.

Two discrepancies between our reconstructed frontal latitude and the atmospheric CO₂ record are worth noting. Specifically, the fronts shifted strongly northward at MIS 5d while CO₂ declined only modestly, and the fronts shifted northward through the late Holocene while CO₂ rose (Figs. 4a, d and 5b). These discrepancies can be explained by the intensity of AZ upwelling (as reconstructed with diatom-bound $\delta^{15}\text{N}$ ¹²; Fig. 4g), which does not have a unique relationship with the mean latitude of the westerly winds. As previously discussed, the low obliquity at MIS 5d and the declining obliquity during the late Holocene should have increased the temperature gradient between the middle and high latitudes, which is supported by the increase in temperature difference between moisture source and ice core site of Vostok⁷³. This increase in temperature gradient should have intensified the SWW, compensating for the equatorward displacement of the winds so as to maintain and/or increase upwelling and thus permit CO₂ outgassing from the AZ¹². The progression of CO₂ level compared with that of ACC latitude during MIS 5d and the late Holocene with low(er) obliquity falls towards the left of the linear trend, in contrast to MIS 5b with high obliquity that closely follows the linear trend (Fig. 5b), suggesting less CO₂ drawdown than predicted based on ACC latitude change, supporting a compensation from intensified SWW and strengthened upwelling. In addition, as described above, the strong SWW-driven (Ekman) transport of AZ surface waters northward driven by low(er) obliquity at MIS 5d and the late Holocene may have worked to push surface isotherms northward (Fig. 5a). Together, these processes can explain the otherwise anomalous conditions of MIS 5d and the late Holocene of a northward frontal position (Fig. 4d), stronger AZ upwelling than expected from ACC latitude (Fig. 4g), and relatively high atmospheric CO₂ (Fig. 4a, b).

Two potential issues with this mechanism are noted here. First, the compiled data (Fig. 4) suggest that the role of obliquity on AZ upwelling was muted during the coldest climates of the last glacial cycle, as there is no evident deviation in the progression of Antarctic temperature or atmospheric CO₂ compared to ACC latitude during a cooling event at the end of MIS 3 when obliquity was low (Fig. 5). This may be due to greater sensitivity of AZ upwelling to changes in obliquity-driven SWW intensity when the SWW is more poleward. Another issue points to the stronger deviation during the late Holocene compared to MIS 5d, despite relatively higher obliquity of the former. In other words, the diatom-bound N isotope upwelling proxy and atmospheric CO₂ suggest that the enhancement of wind strength during the late Holocene was able to overcome the impact of northward ACC latitude to drive a trend of stronger AZ upwelling. Why? It is possible that the effect of obliquity on the strength of the SWW and subsequent effects on AZ upwelling and CO₂ outgassing is dependent on some other yet unclear climate components, which might arise in future studies by comparing similar low-obliquity intervals in several glacial-interglacial cycles.

Enabled by the application of the same paleothermometry method across a large latitudinal difference in the Southern Ocean and a framework imitating the impact of ACC migrations on Southern Ocean SST, the approach taken here provides a quantitative, temporally continuous view of how the boundary between the thermally contrasting Antarctic and subtropical surface waters has migrated over a full glacial cycle in the Indian Southern Ocean. The results suggest that cooling was a dominant driver of the equatorward shift of the SWW during the ice ages, with changes in the wind strength driven by obliquity also contributing to reconstructed changes. Through its effects on Southern Ocean upwelling and related vertical circulation, the equatorward shift of the SWW during ice ages should have enhanced the storage of carbon in the deep ocean, helping to explain the lower atmospheric CO₂ levels of the ice ages. During MIS 5d and the late Holocene, low obliquity and thus an increased

mid-to-high latitude temperature gradient may have strengthened the westerly wind-driven AZ upwelling, compensating for the equatorward SWW location so as to sustain the upwelling in the AZ and thus maintaining/raising atmospheric CO₂¹². At the same time, strong Ekman upwelling forces the ACC northward during these particular time intervals. Thus, the effects of obliquity may explain the deviation of MIS 5d and the late Holocene from the overarching tendency for a more northward ACC to be associated with Antarctic cooling, reduced AZ upwelling, and lower atmospheric CO₂ over the last glacial cycle.

The quantitative framework employed in this study is a rather coarse representation of the surface ocean temperature transition across the ACC and has multiple underlying assumptions. However, this approach is diagnostic and allows us to identify a robust connection between ACC latitude and climate in the Indian Southern Ocean, and to investigate its influence on atmospheric CO₂. With generation of SST records of higher resolution and refinements in the parameterization of the quantitative framework, this approach promises to provide multiple constraints on the climatic controls on ACC frontal location and circulation in different sectors of the Southern Ocean.

Methods

Study area. Marine sediment cores MD11-3353 (50.57°S, 68.39°E, 1568 m water depth) and MD11-3357 (44.68°S, 80.43°E, 3349 m water depth) were recovered by the *R.V. Marion Dufresne* in 2011 around the Kerguelen Archipelago in the southeast Indian Ocean (Fig. 1). Both cores were recently described elsewhere^{12,41,62}. MD11-3353 is located slightly south of the modern Antarctic Polar Front (APF), whereas MD11-3357 is located in the Subantarctic Zone (SAZ), north of the Subantarctic Front (SAF). The Kerguelen Plateau exerts a strong influence on the ACC flow such that 60% of the current is deflected northwards of the Plateau, followed by a southeastward flow east of the plateau, and the integrated ACC flow is estimated to reach 150 Sv around the Kerguelen Plateau⁷⁴.

Age models. This study relies on previously published age models for all cores^{12,41}. Briefly, the age model for MD11-3357 relies on graphical alignment of the GDGT-based SST reconstruction with the EDC deuterium record⁴¹. The original age model for MD11-3353⁴¹, aligning GDGT-based SST with the EDC deuterium record, has been updated by adjusting the youngest and oldest tie points and adding two tie points in MIS 3 based on diatom-bound δ¹⁵N correlation with the diatom-bound δ¹⁵N record of MD12-3394¹².

SST reconstructions. GDGT measurements were performed at the Max Planck Institute for Chemistry (MPIC) following the method proposed in ref. ⁷⁵. Briefly, the GDGT-fraction was extracted from 3–5 g of freeze-dried sediment and simultaneously separated from other organic biomarkers using an Accelerated Solvent Extractor (ASE 350) and analyzed with a high-pressure liquid chromatograph coupled to a single quadrupole mass spectrometer detector (HPLC-MS; Agilent 1260 Infinity)⁷⁶. Temperature of the surface ocean was reconstructed using a revised TEX₈₆^L calibration that linearly fits the global core-top TEX₈₆^L to World Ocean Atlas 2009⁴⁵ 0–200 m integrated surface ocean temperature (Supplementary Note 1). Intra-laboratory standard TEX₈₆^L-SST error for replicate measurements of a standard sediment sample extracted in each batch of samples ($n = 13$) was 0.34 °C, similar to literature estimates⁴⁴. We discuss the uncertainties in absolute SST reconstruction and ΔSST reconstruction by the updated calibration function in the Supplementary Note 3. We discuss potential contribution of non-thermal factors to the estimated TEX₈₆^L temperatures in the

Kerguelen region over the last glacial-interglacial cycle using a series of GDGT-based indices in the Supplementary Note 5. We provide an estimate of the uncertainty of the reconstructed ΔSST in Supplementary Note 6.

ΔSST calculation. To calculate past ΔSST, the data from different cores have been interpolated at a time grid of 2.5 kyr, which best resembles the initial resolution in both cores. ΔSST was then determined by subtraction:

$$\Delta\text{SST}(t_x) = \text{SST}(t_x)_{\text{core1}} - \text{SST}(t_x)_{\text{core2}} \quad (1)$$

with t_x describing the same age point in the cores, core 1 being MD11-3357 and core 2 being MD11-3353.

Quantitative framework setup. The initial meridional SST profile is the zonally averaged annual mean temperature of 0–200 m depth of the region 68.5°E to 80.5°E, 34.5°S to 60.5°S from World Ocean Atlas 2009⁴⁵. The initial meridional SST profile is simplified to three segments: the Antarctic Zone (AZ) segment, the Polar Transition Zone (PTZ, i.e., the Polar Frontal Zone (PFZ) and the SAZ combined) segment, and the Subtropical Zone (STZ) segment (Supplementary Fig. 15). From higher to lower latitudes, the AZ-PTZ boundary (denoted lat1) and PTZ-STZ boundary (denoted lat2) are the latitudes with the largest increase and decrease in the slope of the meridional SST profile, respectively. These changes in slope represent the transition from the cold polar surface water mass towards the warm STZ surface water. The SST within each segment was then fitted to a linear line:

$$\text{SST}_{\text{AZ}}(\text{lat}) = k_{\text{AZ}} * \text{lat} + m_{\text{AZ}}, \text{lat} < \text{lat1} \quad (2)$$

$$\text{SST}_{\text{PTZ}}(\text{lat}) = k_{\text{PTZ}} * \text{lat} + m_{\text{PTZ}}, \text{lat1} < \text{lat} < \text{lat2} \quad (3)$$

$$\text{SST}_{\text{STZ}}(\text{lat}) = k_{\text{STZ}} * \text{lat} + m_{\text{STZ}}, \text{lat} > \text{lat2} \quad (4)$$

Two parameters, range_{AZ} and range_{STZ}, represent the maximum glacial-interglacial SST change (i.e., warmest SST minus coldest SST) in the two regions, respectively. EDC relative air temperatures were used as a reflection of Antarctic climate change. Temperature changes at EDC were transferred into different amounts of SST change in the AZ and the STZ due to polar amplification. For any given EDC temperature change at time t , we assume that the SST of the AZ and STZ will increase/decrease a fraction of the maximum SST change of the zone, and we can get the SST lines in the AZ and the STZ at time t (Supplementary Fig. 15, with the constraint that the lowest SST is −2 °C, the freezing point of sea water, for the AZ):

$$\begin{aligned} \text{SST}_{\text{AZ}}(t, \text{lat})_{\text{no shift}} &= k_{\text{AZ}} * \text{lat} + m_{\text{AZ}} \\ &+ \frac{\Delta T_{\text{EDC}}(t)}{\max(\Delta T_{\text{EDC}}) - \min(\Delta T_{\text{EDC}})} * \text{range}_{\text{AZ}}, \\ &\text{lat} < \text{lat1} \end{aligned} \quad (5)$$

$$\begin{aligned} \text{SST}_{\text{STZ}}(t, \text{lat})_{\text{no shift}} &= k_{\text{STZ}} * \text{lat} + m_{\text{STZ}} \\ &+ \frac{\Delta T_{\text{EDC}}(t)}{\max(\Delta T_{\text{EDC}}) - \min(\Delta T_{\text{EDC}})} * \text{range}_{\text{STZ}}, \\ &\text{lat} > \text{lat2} \end{aligned} \quad (6)$$

The new SST line of the PTZ segment at time t is a linear regression between the new SSTs at lat1 and lat2. (Supplementary

Fig. 15):

$$SST_{PTZ}(t, lat)_{no\ shift} = \frac{SST_{STZ}(t, lat2)_{no\ shift} - SST_{AZ}(t, lat1)_{no\ shift}}{lat2 - lat1} * lat + m'_{PTZ}, \quad lat1 < lat < lat2 \quad (7)$$

We then assume that a change in Antarctic temperature leads to a latitudinal shift of all three SST lines, and the amount of shift is linearly related to the amount of EDC temperature change (note that the slopes of all three SST lines are the same as in the no-shift scenario):

$$\Delta lat(t) = a * \Delta T_{EDC}(t) + b (\Delta lat > 0 \text{ represents a poleward shift}) \quad (8)$$

The SST lines after the shift are:

$$SST_{AZ}(t, lat)_{shift} = k_{AZ} * (lat + \Delta lat(t)) + m_{AZ} + \frac{\Delta T_{EDC}(t)}{\max(\Delta T_{EDC}) - \min(\Delta T_{EDC})} * range_{AZ}, \quad lat + \Delta lat(t) < lat1 + \Delta lat(t) \quad (9)$$

$$SST_{STZ}(t, lat)_{shift} = k_{STZ} * (lat + \Delta lat(t)) + m_{STZ} + \frac{\Delta T_{EDC}(t)}{\max(\Delta T_{EDC}) - \min(\Delta T_{EDC})} * range_{STZ}, \quad lat + \Delta lat(t) > lat2 + \Delta lat(t) \quad (10)$$

$$SST_{PTZ}(t, lat)_{shift} = \frac{SST_{STZ}(t, lat2)_{no\ shift} - SST_{AZ}(t, lat1)_{no\ shift}}{lat2 - lat1} * (lat + \Delta lat(t)) + m'_{PTZ}, \quad lat1 + \Delta lat(t) < (lat + \Delta lat(t)) < lat2 + \Delta lat(t) \quad (11)$$

Determination of the optimal parameters. To tune our model to match the reconstructed ΔSST , we need to determine the four variables: the maximum range of SST change in the AZ and STZ, i.e., $range_{AZ}$ and $range_{STZ}$, and the slope and intercept of the linear model between Δlat and ΔT_{EDC} , i.e., a and b . The sensitivity analysis (Supplementary Note 8) shows that $range_{AZ}$ and $range_{STZ}$ have limited impact on when the maximum ΔSST occurs, thus we tentatively choose $6^\circ C$ to be $range_{AZ}$ and $2.5^\circ C$ to be $range_{STZ}$, based on glacial temperature reconstructions⁷⁷.

The sensitivity analysis shows that with realistic values for a , the maximum ΔSST between the two sites would occur when the ACC is $\sim 2^\circ$ southward of its current position within the observed maximum ΔSST range (Supplementary Fig. 17). The maximum TEX^{L}_{86} -reconstructed ΔSST occurs when the temperature change at EDC is around $-3^\circ C$ to $-5^\circ C$, and the sensitivity analysis shows that this only agrees with conditions of $b > 0$ (Supplementary Fig. 17), which means that the ACC should be southward of its current position when EDC temperature is at the current level, inconsistent with the frontal locations inferred from the modern meridional SST profile. This inconsistency leads us to consider the possibility that the modern ACC latitude is an outlier compared to the relationship between frontal movement and EDC temperature from MIS 6 to MIS 2 and we should consider a new initial meridional SST profile.

A straight-forward option is to choose the scenario when the steep PTZ segment is optimally sandwiched in between the core's locations as the new initial meridional SST profile. This would also be the scenario when ΔSST is the largest. According to the TEX^{L}_{86} -reconstructed data, this scenario would be when the temperature change at EDC is around $-4^\circ C$ and the ACC is around 2° southward of its current position. However, the exact meridional SST profile of this time is unknown. According to the TEX^{L}_{86} -reconstructed data, when the EDC temperature change was between $-3^\circ C$ and $-5^\circ C$, the frontal shift placed the steep PTZ segment between MD11-3353 and MD11-3357, and the mean

value of the ΔSST is $\sim 7.7^\circ C$, which is similar to the SST difference between the two endpoints of the PFZ segment in the current WOA meridional SST profile, which is $\sim 8^\circ C$. Thus, it is a fair estimate that the new initial scenario is the current meridional SST profile shifted 2° southward, at the time when the EDC temperature change was $-4^\circ C$. The actual meridional SST profile may be higher or lower than our assumed profile, but for the ΔSST , the difference in the absolute value will be canceled off. We define $\Delta lat'$ as the ACC latitude relative to the new initial SST profile, and the relationship between Δlat and ΔT_{EDC} becomes:

$$\Delta lat' = \Delta lat - 2 = a' * \Delta T'_{EDC} + b' = a' * [\Delta T_{EDC} - (-4)] + b' \quad (12)$$

We take $range_{AZ} = 6^\circ C$, and $range_{STZ} = 2.5^\circ C$ and use sequential least squares programming (SLSQP) optimizer to find a' within $[0, +\infty]$ and b' within $[-\infty, +\infty]$ that best fit the reconstructed data. The resulting a' and b' with realistic values that produce the smallest difference between the modeled results and the actual data is 0.58 and -0.12 , respectively (Supplementary Fig. 19):

$$\begin{aligned} \Delta lat' &= \Delta lat - 2 = a' * \Delta T'_{EDC} + b' = a' * [\Delta T_{EDC} - (-4)] + b' \\ \Delta lat - 2 &= 0.58 * \Delta T'_{EDC} - 0.12 = 0.58 * [\Delta T_{EDC} - (-4)] - 0.12 \\ \Delta lat &= 0.58 * \Delta T_{EDC} + 4.20 \end{aligned} \quad (13)$$

With this best-fitting pair of a' and b' , the ACC shifts southward(northward) by $\sim 0.58^\circ$ with every $^\circ C$ of EDC warming(cooling). When EDC temperature change is 0 relative to the modern ($\Delta T_{EDC} = 0$), the ACC is 4.20° south of its current position ($\Delta lat = 4.20$).

Reconstruction of ACC latitude changes in the past 150 kyr.

Based on the relationship between the ΔSST of sites MD11-3357 and MD11-3353 and the change of ACC latitude inferred from our framework, we use the reconstructed TEX^{L}_{86} -SST at the two sites to reconstruct the relative frontal positions of the past 150 kyr. Because the relationship is non-monotonic, within the relevant range, each ΔSST corresponds to two ACC positions, and we select the position that makes more sense for the corresponding EDC temperature in our optimized model: If the EDC temperature is lower than $-4^\circ C$, we choose the latitude that is more southward than 2° (the upper part of the curve in Supplementary Fig. 21). When ΔSST is higher than $6.7^\circ C$ and lower than $7.7^\circ C$, the lower limit of the confidence interval for reconstructed ACC that is more southward than 2° (i.e., the upper part of the curve) is assumed to deviate the same amount from the reconstructed ACC latitude as the upper limit, and the upper limit of the confidence interval for the lower part of the curve is assumed to deviate the same amount from the reconstructed ACC latitude as the lower limit. When ΔSST is higher than $7.7^\circ C$, the reconstructed ACC latitude is taken to be the mean of the upper and lower limit and is represented by the dashed line in Fig. 4d.

Data availability

The TEX^{L}_{86} -SST records calculated with the original calibration for 0–200 m integrated temperature³³ are available from the PANGAEA database: <https://doi.pangaea.de/10.1594/PANGAEA.931020> and <https://doi.pangaea.de/10.1594/PANGAEA.907123>. The biomarker fractional abundances and indices and TEX^{L}_{86} -SST calculated with the revised calibration for each core site, the SST gradient between the two sites, and the reconstructed Antarctic Circumpolar Current latitude change in the last 150 kyr are available from the Zenodo data repository (<https://doi.org/10.5281/zenodo.10479199>).

Code availability

MATLAB and Python code used for data analysis and quantitative framework simulations are available from the corresponding author upon request.

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Author contributions

L.M.T., X.E.A., S.L.J., A.M.G., and D.M.S. devised the study. L.M.T., A.A., S.M., and M.S. performed the GDGT analyses supervised by A.M.G. L.M.T. calculated the SST difference between the two sites. X.E.A. set up the quantitative framework and ran simulations. E.M. and A.M. planned the cruise to retrieve the sediment cores presented here. A.S.S., M.W., and P.K.B. contributed to data interpretation. X.E.A. and L.M.T. wrote the manuscript with editing by D.M.S. and contributions from all co-authors.

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