Atlantic Equatorial Undercurrent intensification counteracts warming-induced deoxygenation

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Abstract :

The tropical Atlantic upper-ocean circulation experiences multiannual to decadal changes associated with different climate modes and is simultaneously adjusting to climate warming. The most energetic current in the tropical Atlantic is the Equatorial Undercurrent (EUC), which flows eastwards along the Equator. On the basis of long-term moored observations, we show that the EUC strengthened by more than 20% from 2008 to 2018. The intensification of the EUC is associated with increasing subsurface oxygen concentrations and a thickening of the upper-ocean oxygenated layer in the equatorial Atlantic. These changes counteract climate-warming-induced deoxygenation in the region. The EUC strengthening is found to be mainly forced by trade wind changes in the western tropical North Atlantic. A 60-yr dataset reveals that the recent oxygen increase in the upper equatorial Atlantic is associated with multidecadal variability. This variability is characterized by low oxygen concentrations in the 1990s and early 2000s, and high oxygen concentrations in the 1960s and 1970s. The observed oxygen variability seems to be linked to a compression and expansion of the habitat of tropical pelagic fish, and must be accounted for when evaluating the possible consequences of deoxygenation for marine ecosystems and fisheries. Recent strengthening of the Equatorial Undercurrent counteracts warming-induced deoxygenation in the equatorial Atlantic, according to an analysis of long-term moored observations.

- 44 Ocean circulation redistributes vast amounts of heat, freshwater and biogeochemical tracers,
- 45 like nutrients and oxygen, throughout the climate system. It adjusts to climate warming, but at
- 46 the same time varies with internal modes of natural climate variability. Suggested circulation
- 47 changes due to climate warming include a strengthening of western boundary currents^{1,2}, a
- 48 weakening of the Atlantic Meridional Overturning Circulation (AMOC)^{3,4}, or a general
- 49 acceleration of the mean circulation⁵. Globally, the Atlantic Equatorial Undercurrent (EUC) is
- 50 one of the most energetic currents. It transports thermocline waters eastward along the equator
- 51 as part of the AMOC and the Subtropical Cells (STCs)⁶. The STCs represent shallow

overturning circulations involving subduction in the subtropics and upwelling at the equator^{7,8}. 52 53 The EUC strength is only weakly affected by prescribed AMOC changes as shown in forced simulations with constant wind forcing⁹. Instead, decadal variations of the Atlantic EUC 54 detected in a 50-yr run of an assimilation model shows a close correspondence to the decadal 55 variability of the STC strength¹⁰. Changes in the strength of the EUC may also result from a 56 57 zonal redistribution of the equatorward pathways associated with the STCs within the 58 thermocline, even without changing the STC strength, as found for the Pacific STCs in global warming simulations¹¹. In a high-resolution forced ocean model, an STC weakening in the 59 Pacific Ocean from the 1950s to the 2000s is associated with a weakening of the simulated EUC 60 by 20%¹². By keeping respiration constant in the model, a severe oxygen decline along the main 61 STC thermocline pathways, including the EUC, is found. By implementing fully interactive 62 biology, the effect of reduced ventilation on oxygen levels is, in turn, largely compensated by 63 64 the effect of reduced productivity and associated oxygen consumption. A comparison with observed oxygen changes suggests, however, a likely overestimation of the biological effect in 65 the model. The relative importance of the two competing effects remains unclear¹². 66

67 In the upper tropical Atlantic, moored observations have documented seasonal to multiannual variability of the North Brazil Undercurrent^{13,14} and the EUC^{15,16}. Circulation variability on 68 decadal timescales, however, has not been detected in direct current observations so far. 69 Nevertheless, decadal and multidecadal variability of oxygen concentration is well 70 documented¹⁷⁻²⁰. It is thought to mainly result from circulation changes that redistribute oxygen 71 in the tropical oceans²¹⁻²⁴. This oxygen variability is superimposed on the widespread 72 deoxygenation as the global oceanic oxygen content is decreasing since the 1960s by more than 73 $2\%^{25}$, thereby contributing to an expansion of the tropical oxygen minimum zones (OMZs). 74 Both effects, internal oxygen variability and deoxygenation due to climate warming, must be 75 76 accounted for when evaluating changes in low-oxygen regions and the longer-term impact of these changes on marine ecosystems and fisheries²⁶, in particular the available habitat for
 tropical pelagic fish^{27,28}.

79 Strengthening of the Atlantic Equatorial Undercurrent

The velocity field of the EUC has been measured using direct current observations from a large 80 number of research cruises crossing the equator at different longitudes^{15,29,30}. Here, we focus on 81 the central equatorial Atlantic at 23°W, where the EUC starts supplying the equatorial 82 upwelling east of that longitude¹⁵. The EUC is located between 2°S and 1.5°N above a depth 83 of 250 m. Its core is at about 80 m depth and is associated with an oxygen maximum with 84 85 oxygen levels declining north- and southward from the core latitude close to the equator (Fig. 1b)¹⁹. Since December 2001, a long-term mooring has been operated almost continuously on 86 the equator at 23°W (Fig. 1c, Supplementary Tab. 1)^{31,32}. The mooring data have been used to 87 derive an EUC transport time series starting in May 2005¹⁶, here updated to September 2019 88 (Fig. 1a). 89

The most prominent signal in the EUC transport time series is a strengthening of the EUC from its lowest values in 2007 to its highest values in 2018 (Fig. 1a). We estimate a ten-year EUC transport increase from August 2008 to July 2018 of 3.3 ± 1.6 Sv decade⁻¹. This ten-year trend, which does not substantially change when shifting the examined ten-year period by a few years, corresponds to an increase of the EUC transport of more than 20% compared to its mean transport of about 14 Sv¹⁶.

The time series of eastward velocity anomalies at the equator at 23°W shows an eastward velocity increase between about 70 m and 250 m. A maximum amplitude of nearly 0.2 m s⁻¹ decade⁻¹ at 100 m depth can be observed during the period from August 2008 to July 2018 (Fig. 1c, d). Above this layer, observed velocities become increasingly westward during the same period, with the ten-year trend reaching about -0.1 m s⁻¹ decade⁻¹. Moored observations at the 101 equator at 10°W (Supplementary Fig. 1b) generally confirm the existence of a strengthening
102 trend in the eastward velocity at thermocline level in the decade 2008-2018 (Supplementary
103 Fig. 2).

104 Wind forcing of the circulation variability

105 The EUC is predominantly forced by the easterly wind along the equator that establishes an eastward pressure gradient with the sea level sloping downwards toward the east³³. This local 106 107 forcing results in an EUC transport variability in accordance with the dominantly multiannual variability of the Atlantic Niño, which is most pronounced in boreal summer^{34,35}. Besides the 108 109 local forcing, the EUC is also forced remotely by easterly winds in the tropics away from the equator driving poleward Ekman transport in both hemispheres. The resulting meridional 110 Ekman transport divergence is directly related to the strength of the STCs and the EUC^{8,10}. 111 112 Typically, this Ekman divergence is quantified by the difference in the meridional Ekman transport across the latitudes 10°N and 10°S^{8,36}. 113

Meridional Ekman transports derived from different wind products consistently show an 114 increase in the Ekman divergence between 10°N and 10°S for the decade 2008-2018 (Tab. 1, 115 116 Fig. 1a, Supplementary Fig. 5). Since the westward wind stress at the equator shows no significant increase (Supplementary Tab. 3), it can be ruled out as a possible forcing of the EUC 117 118 strengthening. The obtained ten-year trends in the Ekman divergence are, however, generally 119 too small to account for the observed ten-year trend in the EUC transport. Nevertheless, it suggests a strengthening of the Atlantic STCs during the recent decade. Variations between the 120 121 different wind products are substantial, but within the statistical uncertainties. All wind products suggest that the dominant forcing is in the northern hemisphere associated with a strengthening 122 123 of the northeast trades (Tab. 1). Further analysis suggests that the wind changes occur 124 dominantly in the western basins, with the eastern basins having only weak or even reversed ten-year trends (Supplementary Fig. 6, Supplementary Tab. 2). 125

126 Increased oxygenation of the upper equatorial Atlantic

127 The oxygen distribution along the equator (Fig. 2a) as measured during the recent cruise TRATLEQ 1 (Trans-Atlantic Equatorial cruise 1, Sep./Oct. 2019) is characterized by the 128 presence of an OMZ in the eastern basin at mid-depth (lowest oxygen concentrations at about 129 130 400 m at 5°E off São Tomé). At the western boundary, the energetic North Brazil Current (NBC) transports high-oxygen waters northwestward. After crossing the equator, the NBC 131 partly retroflects into the EUC contributing to the enhanced oxygen levels in the equatorial 132 band³⁷. The core of the EUC follows isopycnal surfaces shallowing from west to east (Fig. 2a, 133 c). Water within the EUC core shows decreasing oxygen levels on its way toward the eastern 134 boundary, mainly due to lateral eddy mixing with low-oxygen waters carried westward by the 135 flows to the north and south of the EUC^{19} . 136

137 The measurements performed in Sep./Oct. 2019 show a specific pattern of elevated oxygen levels with respect to the climatological state of the oxygen distribution estimated for the year 138 2000 as taken from²⁵ (Fig. 2b, see ²⁵ for details). The largest oxygen increase of more than 20 139 μ mol kg⁻¹ is found in the upper 250 m east of 10°W. Generally, enhanced oxygen levels in 140 Sep./Oct. 2019 are found along the whole path of the EUC toward the eastern boundary as well 141 142 as within the NBC close to the western boundary. The high oxygen levels thus represent a continuation of an oxygenation in the upper equatorial Atlantic estimated for the period 2006-143 144 2018 using oxygen data from a large number of research cruises along 23°W in the central equatorial Atlantic (Supplementary Fig. 10a). 145

146 The upper-ocean oxygen changes correspond to changes in the thickness of the uppermost 147 oxygenated layer. Here, we define the oxygenated layer thickness (OLT) to be the depth range 148 between the ocean surface and the shallowest depth of the 120 μ mol kg⁻¹ oxygen surface. While 149 the chosen oxygen level is relatively high with respect to intermediate hypoxias defined 150 elsewhere³⁸, it is suitable to describe long-term changes in the near-surface habitat of tropical

pelagic fish^{28,39}. The mean OLT in the tropical Atlantic shows a characteristic pattern having 151 152 small values above the OMZs of the eastern tropical North and South Atlantic and slightly larger values along the equator. At the western boundary and in the subtropics poleward of the 153 154 OMZs, an extensive oxygenated layer is present (Fig. 3a). Using a comprehensive 60-year oxygen dataset, we provide evidence that the equatorial Atlantic undergoes a substantial 155 156 multidecadal variability with a particularly large OLT in the 1960s and 1970s and a reduced 157 OLT in the 1990s and 2000s (Fig. 3b). Since approximately 2005, a deepening of the 120 μ mol kg⁻¹ oxygen surface is observed with largest OLTs occurring in Sep./Oct. 2019. This 158 multidecadal variability that is similarly seen in the subsurface oxygen levels (Fig. 3c) 159 dominates any long-term changes that might be present²⁸ and clearly affects trends in the OLT 160 calculated for different time spans, e.g. over the periods 1960-2005 or 1960-2020 161 162 (Supplementary Fig. 9).

163 Mechanisms of equatorial Atlantic oxygen variability

The global oceanic oxygen content has declined since the 1960s by about 2%²⁵ with notable 164 deoxygenation occurring in the upper tropical ocean (Supplementary Fig. 8). About half of the 165 deoxygenation in the upper 1000 m is suggested to be the result of changing oxygen solubility 166 167 due to warming waters²⁵. In general, the vertical structure of warming-induced oxygen changes might be more complicated as other effects like increased stratification or poleward migration 168 of outcropping density surfaces might come into play²⁴ (see supplementary information). 169 170 Additionally, the deoxygenation pattern associated with a warming ocean is superimposed by ocean variability on different timescales related to the internal variability of the climate 171 system^{12,23,40}. Oxygen observations during the last decades reveal substantial variability in the 172 tropical Atlantic on multiannual to decadal timescales^{19,23}. However, large uncertainty exists 173 regarding the mechanisms of decadal oxygen changes. Observed oxygen trends calculated over 174 the last 50 years are largely not in agreement with oxygen trends diagnosed from 175

biogeochemical model runs⁴¹. Depending on the specific model used, projections of subsurface 176 oxygen levels also deviate⁴². The here reported strengthening of the Atlantic STCs and EUC in 177 the decade 2008-2018 in response to an increased Ekman divergence between 10°N and 10°S 178 179 (Fig. 1a) add a so far undescribed mechanism for decadal subsurface oxygen variability in the equatorial Atlantic. The vertical structure of the ten-year velocity trend at the equator at 23°W 180 181 (Fig. 1d) shows that the strengthening of the EUC is associated with an intensifying near-182 surface westward flow. The intensified westward flow balances the increased Ekman divergence predominantly occurring in the western basin (Supplementary Fig. 6, 183 Supplementary Tab. 2). Other mechanisms, such as changing STC pathways¹¹, may also 184 185 contribute to the observed strengthening of the EUC at 23°W.

186 Here we have shown that the observed strengthening of the EUC is associated with a substantial oxygen increase in the upper equatorial Atlantic (Fig. 2b, Fig. 3c, Supplementary Fig. 10). A 187 quantification of the link between EUC intensification and subsurface oxygenation can be made 188 189 by the evaluation of the oxygen budget of a subsurface volume (see methods). Estimating the flushing time of a subsurface box (100-200 m, 4°S-4°N, 35°W-5°W) by the intensifying EUC 190 yields a timescale similar to the here reported ten-year period of EUC intensification 191 192 (Supplementary Fig. 4). This short flushing timescale substantiates the dominant role of the 193 advective oxygen supply by the EUC to the oxygen budget. However, negative feedback mechanisms might dampen the oxygen response to the intensifying inflow of oxygenated EUC 194 195 waters. These mechanisms may include an oxygen reduction due to changing advection (mean and eddy advection) as well as vertical mixing in response to increasing subsurface oxygen 196 197 levels. As indicated by model studies, part of the enhanced ventilation might also be compensated by enhanced primary productivity and enhanced oxygen consumption¹². So far, 198 enhanced productivity in the equatorial Atlantic is not observed⁴³. This could indicate that a 199 200 possible compensation effect due to enhanced productivity is not of the same order as the

enhanced ventilation. For the eastern tropical North Pacific away from the equator, changes in the biological productivity forced by the trade winds are instead suggested to be responsible for decadal to centennial oxygen changes⁴⁰. According to that mechanism, enhanced trade winds force a shallowing of the thermocline that results in enhanced primary production and respiration and consequently leads to reduced oxygen levels in the thermocline. Such behavior resulting from a similar forcing, i.e. the strengthening or weakening of the trade winds, would imply opposing oxygen changes in different parts of the tropical oceans.

208 The variability of the northeast trade winds is likely linked to the Atlantic Multidecadal Variability (AMV) changing from its cold phase in the 1970s to its warm phase in the 2000s 209 followed by another cold phase⁴⁴⁻⁴⁶. The AMV affects the trade winds in the northern 210 hemisphere, which are weakest during its warm phase^{47,48}. While all analyzed wind products 211 212 generally confirm a strengthening of the Ekman divergence in the decade 2008-2018 (mostly due to the increase in northern hemisphere Ekman transport), its magnitude varies by almost a 213 214 factor of two (Tab. 1). Similar uncertainties in wind trends for specific periods were obtained when analyzing different reanalysis products⁴⁹. For some wind products it is explicitly stated 215 they are not well suited for studies 216 that of long-term wind trends (e.g. 217 https://climatedataguide.ucar.edu/climate-data/ccmp-cross-calibrated-multi-platform-wind-

218 vector-analysis). Despite the uncertainties in multidecadal wind variability, equatorial oxygen 219 observations reveal a multidecadal cycle of deoxygenation and oxygenation in the equatorial 220 Atlantic (Fig. 3). This cycle is possibly linked to the AMV via its effect on the STCs. This internal variability of the climate system likely impacts marine ecosystems and fisheries in the 221 equatorial Atlantic by compressing and expanding the habitat of tropical pelagic fish^{28,50} on 222 decadal timescales. A better understanding and prediction of locally amplified internal 223 variability, as observed in the equatorial Atlantic, is crucial in order to improve the performance 224 225 of forced ocean biogeochemistry circulation models. Furthermore, it substantially aids the

- evaluation of impacts of climate change induced global deoxygenation on the marine ecosystem
- 227 and its socioeconomic dependencies.

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- 377 R.Ko., F.P.T., J.H. calculated and analyzed EUC transport time series, J.H., F.P.T. analyzed
- 378 different wind products, R.Ki., B.B., R.C, M.D. contributed additional data and expertise on
- 379 equatorial ocean dynamics and oxygen changes. All authors discussed the results and wrote the
- 380 manuscript.

Tab. 1 Ten-year (August 2008 to July 2018) trend in Ekman divergence (10°N-10°S),
northward Ekman transport at 10°N, and southward Ekman transport at 10°S with 95%
confidence interval for different wind products.

Wind	Ekman Divergence	Northward Ekman	Southward Ekman
Product	$(10^{\circ}N - 10^{\circ}S)$	Transport across 10°N	Transport across 10°S
	[Sv decade ⁻¹]	[Sv decade ⁻¹]	[Sv decade ⁻¹]
ASCAT	2.0 ± 1.2	1.5 ± 1.2	0.4 ± 0.6
CCMP	1.1 ± 1.2	1.0 ± 1.1	0.1 ± 0.6
JRA55-do	1.5 ± 1.0	1.3 ± 1.0	0.2 ± 0.7

387 Figure captions



Fig. 1 The Atlantic Equatorial Undercurrent (EUC) at 23°W. a, EUC transport anomaly 389 390 (monthly data, grey thin line; mean and annual and semi-annual harmonics subtracted and 270day low-pass filtered, black thick line; ten-year (August 2008 to July 2018) trend, black dashed 391 line; with 95% confidence interval, grey shading) and STC transport anomaly calculated from 392 Ekman divergence between 10°N and 10°S using different wind forcing products (ASCAT, red; 393 CCMP, blue; mean and annual and semi-annual harmonics subtracted and 270-day low-pass 394 filtered). **b**, Mean eastward velocity (color) and dissolved oxygen (μ mol kg⁻¹, contours) from 395 396 shipboard measurements after¹⁹. c, Time series of eastward velocity anomaly at the equator 397 with mean and seasonal cycle subtracted. d, Ten-year (August 2008 to July 2018) trend in eastward velocity (blue, with 95% confidence interval, light blue shading) and mean eastward 398 399 velocity (red) at the equator.



Fig. 2 Shipboard measurements along the Atlantic equator in Sep./Oct. 2019. a, Dissolved
oxygen concentration. b, Dissolved oxygen anomaly relative to the climatological year-2000
state²⁵. c, Eastward velocity. Grey areas mark bottom topography at the western boundary.
Black lines mark the 25 kg m⁻³, 26 kg m⁻³, 26.5 kg m⁻³, 27 kg m⁻³ and 27.25 kg m⁻³ isopycnals.



Fig. 3 Surface oxygenated layer thickness (OLT) in the tropical Atlantic. a, Mean OLT. b,
Time series of OLT anomaly in the equatorial region (35°W-5°W, 4°S-4°N) marked in (a). c,
Time series of the oxygen anomaly in the box 100-200m, 24°W-22°W, 4°S-4°N marked in (a)
by the hatched area. Indicated in (b) and (c) are the ten-year median anomalies (black squares),

413 the probable error of the median derived from the median absolute deviation (open circles), as 414 well as the corresponding interquartile range (black lines) of the individual data anomalies (grey 415 dots). The triangle marks the median anomaly of data taken in Sep./Oct. 2019. OLT is defined 416 by the depth range between ocean surface and shallowest depth of the 120 μ mol kg⁻¹ oxygen 417 surface.

419 Methods

We use different observational datasets from moored and shipboard measurement programs
(particularly from cruise TRATLEQ 1, RV Meteor cruise M158 in September/October 2019),
different wind products, and historical oxygen data within this study.

423 Moored velocity data

Velocity data from the equator at 23°W (Fig. 1c) were acquired using moored acoustic Doppler 424 current profilers (ADCPs). They cover the whole depth range of the EUC for most of the 12 to 425 18 months long consecutive mooring periods except for a few years at the beginning³¹. All 426 velocities were detided using a 40-h low-pass filter and subsampled to 12-h intervals. The 427 oceanic variability on short timescales (i.e. during a single mooring period) clearly exceeds the 428 measurement accuracy of the different instruments. Errors in ADCP compass calibration are 429 expected to be unsystematic for the different instruments used, not able to produce an artificial 430 431 eastward velocity trend for a ten-year period that encompasses several, typically 1.5-year long 432 mooring periods. Similar trends in northward velocity are substantially smaller and not significant. Moored velocity data from the equator at 10°W were acquired by single upward 433 looking ADCPs. Data treatment was the same as for the 23°W moored velocity data. 434

435 EUC transport

For five years as part of the Tropical Atlantic Climate Experiment (TACE), i.e. from mid-2006 to mid-2011, additional moorings were installed at 0°45'N and 0°45'S to obtain a well-defined EUC transport time series. The EUC transport was obtained using variability patterns derived from shipboard observations that were regressed onto the moored time series. Error estimates of these calculations are given as RMS differences¹⁶. The EUC transport based on three moorings (RMS difference of 0.79 Sv) was used to validate the reconstruction of the EUC transport using only the central mooring (RMS difference of 1.29 Sv), which was the only 443 mooring operated from mid-2011 onwards¹⁶. The EUC transport represents the integral of the 444 eastward velocity, u, with u>0 of the reconstructed sections over latitude and depth within the 445 domain covering 30-300 m depth and 1°12'S - 1°12'N. The EUC transport is characterized by 446 substantial intraseasonal variability of 2.3 Sv (standard deviation of 8-to-90-day band-pass 447 filtered data), a seasonal cycle of 1.2 Sv (standard deviation of the monthly mean seasonal 448 cycle), and multiannual variability of 1.1 Sv (standard deviation of detrended time series with 449 annual and semi-annual harmonics subtracted and 270-day low-pass filtered).

To test the sensitivity of the ten-year trend of the EUC transport to the used definition, we have 450 calculated different versions of the EUC transport: Version 1) only positive u, 30-300m and 451 1°12'S - 1°12'N (as we used in the manuscript), Version 2) positive and negative u, 30-300m 452 and 1°12'S - 1°12'N and Version 3) positive and negative u, 30-200m and 1°S - 1°N. The area 453 in version 3 was reduced in order to avoid most areas with westward velocities. All three 454 versions show a clear increase in the EUC transport (Supplementary Fig. 3). Version 2 shows 455 456 the strongest intensification, which is due to the fact that areas with westward velocities additionally decrease during EUC intensification. Version 3 shows the smallest increase, which 457 458 is due to the fact that part of the EUC is missing, when shrinking the area. In summary, the 459 estimated ten-year trend of the EUC transport that we present in the manuscript is more on the 460 conservative side of possible estimates.

461 Shipboard measurements during TRATLEQ 1

Salinity, temperature, depth, oxygen (CTD-O₂) measurements during TRATLEQ 1 were carried out with a Seabird Electronics (SBE) 9plus system that was equipped, in addition to its own pressure sensor, with two parallel sensor sets for temperature, conductivity, and oxygen (Supplementary Tab. 4). The oxygen measurements were calibrated against Winkler-titrated oxygen from discrete water samples. For the calibration a linear correction polynomial depending on pressure, temperature and the actual oxygen value was fitted. A total of 403

oxygen data points were recorded, which resulted in an RMS-misfit of about 1.1 µmol kg⁻¹. 468 469 Velocities along the equator during TRATLEQ 1 were measured by two vessel-mounted ADCP systems (Supplementary Tab. 4). A 75-kHz RDI Ocean Surveyor mounted in the ship's hull 470 provided the velocity distribution in the upper 650 m with a vertical resolution of 8 m. The 471 second instrument, a 38-kHz RDI Ocean Surveyor installed in the sea chest, had a measurement 472 range of at least 1000 m at a vertical resolution of 32 m. Both datasets were vertically linearly 473 474 interpolated on a 10-m grid and then combined with a linear weight transition for 75-kHz : 38kHz velocities of 5:1 in the upper 350 m depth, 3:1 in the depth range between 350 and 500 m 475 depth and 1:1 below 500 m depth. The combined dataset was then mapped onto a common grid 476 477 of $0.2^{\circ} \times 10$ m resolution using Gaussian mapping scales with a horizontal half width scale of 0.2° and cut-off scale of 0.6° and vertical mapping scales of 8 m for half width and 16 m for 478 cut-off. The data were horizontally linearly interpolated between 2.6°E and 5°E to fill the data 479 480 gap.

481 Ekman transport from different wind products

482 The Ekman transport was calculated from different wind products. The meridional Ekman
483 volume transport per unit length [Sv m⁻¹] is

$$T_{Ek,y} = \frac{\tau_x}{\rho_0 f}$$

with τ_x the eastward wind stress, ρ_0 water density (taken here to be 1025 kg m⁻³) and f the Coriolis parameter. Following⁵¹, τ_x is calculated using the 10-m wind vector, \vec{v}_{10} , and the 10m eastward wind component, u_{10}

488
$$\tau_x = \rho_{air} c_D u_{10} |\vec{v}_{10}|$$

489 with ρ_{air} air density (taken here to be 1.223 kg m⁻³) and c_D drag coefficient for neutrally 490 stable conditions⁵²

491
$$c_D = \left(\frac{2.70}{|\vec{v}_{10}|} + 0.142 + 0.0764|\vec{v}_{10}|\right) \times 10^{-3}$$

The meridional Ekman transport [Sv] through 10°N and 10°S was eventually calculated by zonal integration of $T_{Ek,y}$ along the respective latitudes between the western and eastern boundaries. The Ekman divergence [Sv] was calculated as the difference between the meridional Ekman transport through 10°N and 10°S. Annual and semi-annual cycles were calculated for the same period, that was used for the ten-year trend calculation (2008-2018), and subsequently removed from the whole time series. Derived time series were then 270-day low-pass filtered.

499 Trend calculation and significance

500 Linear trends presented in this study were obtained from a linear regression of a time series of limited length. The 95% confidence interval was calculated following⁵³ as product of the 501 estimated standard deviation of the trend and the t-score of the Student's t-distribution for 95% 502 503 significance and n-2 degrees of freedom, where n is the number of independent values used for the linear regression. n was estimated from the autocorrelation functions for the different time 504 series, which revealed an average decorrelation scale of 6 months for time series with annual 505 506 and semi-annual cycles removed and 270-day low-pass filtered to remove seasonal and shorter period variability. Hence, the trend calculations were evaluated based on 6-months averages. 507 508 The trend errors of Ekman transports and divergences do not account for possible biases inherent in the different wind products. However, differences in the trends derived from 509 different wind products provide an estimate of the uncertainty. 510

511 Oxygen data and analysis

All used oxygen data are listed in Supplementary Tab. 5. Duplicates were avoided by using the
first profile in the combined dataset within 24 h and 5 km to all others. For each used profile

the uppermost depth of the 120 μ mol kg⁻¹ oxygen surface was determined by linear vertical 514 interpolation. The climatological mean state of this oxygen surface was then computed by a 515 least squares model on a $0.5^{\circ} \times 0.5^{\circ}$ grid. For each grid point to be mapped all data within a 516 radius of 1200 km are used by applying a Gaussian weighting using a half folding width of 275 517 km. Prior to the mapping a linear gradient in latitude and longitude as well as a quadratic fit in 518 latitude was subtracted from the original data. An absolute minimum weight of 0.01 was applied 519 520 to the Gaussian weighting to take the larger distribution and horizontal gradients of the depth of the 120 μ mol kg⁻¹ oxygen surface better into account. For each profile the depth anomaly of 521 522 the 120 μ mol kg⁻¹ oxygen surface compared to the local climatological mean was derived. All anomalies within the equatorial box (35°W-5°W, 4°S-4°N) were used to derive a monthly 523 median offset. The final temporal OLT (120 μ mol kg⁻¹ oxygen surface) anomaly was computed 524 by the median of all anomalies within 10 years, corrected by the monthly offset. 525

To verify the statistical significance of the median we compute the median absolute deviation (MAD) as a robust measure of the variability of the sample, in addition to the interquartile range. The probable error of the median as derived from the MAD as provided in Fig. 3b and 3c is calculated as follows. The MAD is defined as the median of all deviation from the median. Assuming a normal distribution we get the probable error by multiplying the MAD with 1.4826 ⁵⁴.

For a detailed description of the data handling of historical data including the stability of oxygen measurements and the likelihood of systematic biases as well as a verification of the mapping bias the reader is referred to²⁵. Modern oxygen data since 2006 are validated by a crossover analysis for all recent data⁵⁵. The accuracy of oxygen data taken during cruises since 2006 (Supplementary Tabs. 4 and 6) is estimated to be better than 2 μ mol kg⁻¹ as derived from the calibration with the Winkler titration method.

538 Oxygen budget and flushing time

To provide a more quantitative view on the link between EUC intensification and oxygenation, 539 540 we specifically focus on the layer between 100 and 200 m depth that contains in most places the mean depth of the 120 μ mol kg⁻¹ oxygen surface (Fig. 3). Here, we want to provide some 541 bulk estimates for oxygen changes and volume flushing rates. To relate the OLT estimated in 542 the region 35°W-5°W, 4°S-4°N (Fig. 3b) to oxygen changes in the layer 100-200m, it is most 543 convenient to look at the 23°W section, which provides best data coverage (Supplementary Fig. 544 7). Taking oxygen data presented in Fig. 3c representing the box 100-200m, 24°W-22°W, 4°S-545 4°N, we find an oxygen decrease of $-1.7 \pm 0.6 \,\mu$ mol kg⁻¹ decade⁻¹ for the period 1960-2004 and 546 an oxygen increase of $+9.5 \pm 1.8 \ \mu mol \ kg^{-1}$ decade⁻¹ for the period 2005-2020. This variability 547 of the subsurface oxygen concentration is in general agreement with the thinning and thickening 548 of the surface oxygenated layer during the corresponding periods found in the region 35°W-549 5°W, 4°S-4°N (Fig. 3b). 550

The main oxygen supply to the box 100-200m, 4°S-4°N, 35°W-5°W is via the EUC. However, how much the intensification of the EUC during the period August 2008 to July 2018 did contribute to the oxygen increase depends not only on the EUC inflow, but similarly on the EUC outflow at the eastern boundary of the box, other inflows and outflows such as associated with the different branches of the South Equatorial Current as well as on the remaining terms of the oxygen budget. Formally the volume integrated oxygen budget can be written as follows:

557
$$\int_{V} \frac{\partial O}{\partial t} dV = V \frac{\partial O_{Box}}{\partial t} = \oint_{\partial V} (O\vec{u}) \cdot \vec{n} dS + R$$

where *V* is the box volume, *O* is oxygen, *t* is time, O_{Box} is the mean oxygen concentration in the box, \vec{u} is the velocity vector, ∂V is the boundary of the volume and \vec{n} the inward normal vector to ∂V . Mass conservation requires $\oint_{\partial V} \vec{u} \cdot \vec{n} dS = 0$ or the inflow into the box must equal the outflow out of the box. The residuum, *R*, includes all other budget terms, particularly lateral eddy fluxes, diapycnal mixing, and oxygen consumption that all might change for anintensifying EUC and increasing oxygen concentration.

While we have provided an estimate of the temporal change of the mean box oxygen concentration by calculating the oxygen change along $\sim 23^{\circ}$ W (Fig. 3c), the other budget terms are largely unknown. However, we can give an estimate of the oxygen supply into the box due to the EUC. For the climatological mean state, we can write the volume integrated oxygen budget as follows:

569
$$0 = \oint_{\partial V} (O_c \vec{u}_c) \cdot \vec{n} dS + R_c$$

where O_c is the climatological oxygen concentration, \vec{u}_c is the climatological velocity vector, 570 and R_c is the climatological residuum that balances the oxygen transport divergence in a 571 climatological mean state. Here, we can approximate the mean advective oxygen supply by the 572 climatological EUC as $O_{in}T_0$, where O_{in} is the temporal mean, transport-weighted oxygen 573 concentration of the climatological EUC with transport T_0 . An intensification of the EUC would 574 result in a flushing of the box volume with excess EUC waters that, in case of a complete 575 576 flushing and no other damping terms, would increase the mean box oxygen concentration by $O_{in} - O_{Box,0}$, with $O_{Box,0}$ being the mean oxygen concentration in the box at the time, t_0 , when 577 578 the EUC intensification starts.

579 The flushing time,
$$t_{flush}$$
, can be estimated as

580
$$\int_{t_0}^{t_0+t_{flush}} (T-T_0)dt = V$$

where *T* is the EUC transport. Here, we can only calculate the EUC transport time series at 23° W, which is not at the western boundary of our box. However, the EUC at 23° W is a direct continuation of the EUC arriving at 35° W and can serve as a good approximation of the

increasing EUC oxygen supply. The transport-weighted mean oxygen concentration of the EUC 584 585 flow at 23°W, 100-200m, 1.2°S-1.2°N that can be derived from Fig. 1b is 153 μ mol kg⁻¹. It is thus substantially higher than the mean oxygen concentration in the box estimated at 23°W, 586 100-200m, 4°S-4°N to be 120 μ mol kg⁻¹. The EUC transport at 23°W in that layer before the 587 EUC intensification (averaged between August 2005 and July 2008) is 5.4 Sv (Supplementary 588 Fig. 4a). For the excess transport due to the intensifying EUC, $T - T_0$, a flushing time of the 589 590 box volume can be estimated to be about 10 years (Supplementary Fig. 4b). Note that the 591 flushing time of the box volume by the climatological EUC transport, T_0 , is only 1.7 years. The 592 excess EUC transport is thus strong enough to potentially exchange the whole box volume during about the period of EUC intensification discussed here. However, due to several negative 593 594 feedback mechanisms, the mean box oxygen concentration will not reach the oxygen level of the inflowing EUC. Among the negative feedback mechanisms are an increasing oxygen 595 concentration of the outflow (that is part of the term $\oint_{\partial V} (O\vec{u}) \cdot \vec{n} dS$) as well as a changing 596 597 residuum, R. The latter include processes like enhanced lateral oxygen eddy fluxes out of the box and reduced diapycnal oxygen flux into the box from above due to changed lateral and 598 vertical oxygen gradients, respectively, all associated with an increasing mean oxygen 599 600 concentration in the box. Changes in consumption could occur as well, e.g., associated with an 601 enhanced nutrient supply of the equatorial upwelling by the EUC intensification, enhanced 602 biological production and consequently enhanced consumption due to heterotrophic respiration of sinking biological material. However, these terms of the oxygen budget cannot be 603 meaningfully quantified with the observational data at hand. 604

605 Data and code availability

All data supporting the findings of this study are publicly available as referenced within the paper and in the supplementary material (Supplementary Tabs. 1, 4, and 5). All necessary

- 608 code for the data analysis and preparation of the figures of this manuscript is freely available
- 609 at <u>https://doi.org/10.5281/zenodo.4436007</u>.

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