# Supplementary Information for

Regional Wind Variability Modulates the Southern Ocean Carbon Sink

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#### Supplementary Information Text

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#### S1. The effect of Sea Level Pressure on the Southern Annular Mode (SAM)

Previous studies have shown that the SAM has a zonal asymmetry that affects the mixedlayer depth and temperature<sup>1,2</sup>. Fig. S1 highlights the zonal asymmetry of the SAM, indicating
that the negative correlation between the SAM and sea level pressure reaches further north in the
eastern Pacific compared to the rest of the study region.

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9 S2. The available carbon dioxide (CO<sub>2</sub>) observations and robustness of the interpolated
10 data

11 The Southern Ocean is historically an under-sampled region, due to the harsh conditions 12 and the relative remoteness. The available data of the partial pressure of  $CO_2$  (p $CO_2$ ) in the 13 Southern Ocean come mainly from shipboard measurements, which have steadily increased in 14 number in the past several decades, with the Drake Passage and the Tasman Sea being the best-15 sampled region within the Southern Ocean since the 2000s (Fig. S2A)<sup>3,4</sup>. Despite the substantial 16 increase in observational  $pCO_2$  data in the Southern Ocean, the spatio-temporal distribution 17 remains sparse compared to other regions<sup>3</sup>. The robustness of the neural-network interpolated pCO<sub>2</sub> data until December 2011 has been demonstrated in previous studies<sup>5-7</sup>. Here, we show 18 19 the robustness of the method for the most recent period.

Averaged over the most recent time period (2012 through 2016) the observations (Fig.
S2B) are relatively well represented in the interpolated pCO<sub>2</sub> (Fig. S2C). Although some regional
biases are present (Fig. S2D), they mostly cancel out when averaged over the study region (1.4
µatm). The standard deviation at each grid point is shown in Fig. S2E, which add up to 5.6 µatm.
The Antarctic coastal areas display the largest standard deviation; however, our study mainly
focuses on observations north of 65°S, due to the data availability of the temperature and salinity.

# S3. The effect of the El Niño Southern Oscillation (ENSO) on the Southern Ocean air-sea CO<sub>2</sub> flux

We investigate the effect of the ENSO on the Southern Ocean carbon uptake, similarly as we did for the SAM (Fig. S3). We find the regional effect of the ENSO considerably smaller than the regional effect by the SAM. However, similar as the SAM, integrated over each of the three sectors, and over the whole Southern Ocean, the net effect of the ENSO on the Southern Ocean carbon uptake is ~zero.

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#### 35 S4. The regional relationship between sea surface temperature (SST) and the CO<sub>2</sub> flux

The air-sea  $CO_2$  flux partially depends on SST, as  $CO_2$  dissolves better in colder water However, other factors including biological production and vertical circulation also affect the oceanic  $CO_2$  uptake. Here, we demonstrate the relationship between the SST and the air-sea  $CO_2$ flux in the different sectors and interfrontal zones from 2004 through 2016 (Fig. S4).

In all three sectors of the Antarctic Zone, (AAZ, from 65°S to ~55°S), the SST ranges
approximately from -2 to 5°C, and the carbon flux varies approximately from -5 to 3 mol m<sup>-2</sup>
year<sup>-1</sup>. There is a slight trend where warmer surface waters tend to coincide with more uptake in
the Atlantic and Indian sectors of the AAZ, indicating that solubility is not the main driver here.
Concurrently, the Pacific sector of the AAZ does not show a considerable trend.

In the Polar Frontal Zone (PFZ, from ~55°S to ~40°S), the SST ranges approximately from 0 to 17°C, and the carbon flux varies from approximately -4 to 2 mol m<sup>-2</sup> year<sup>-1</sup>. In the Atlantic and Indian sectors of the PFZ, warmer surface waters tend to coincide with more uptake. However, the Pacific sector is a lot more variable and the colder surface waters have a similar 49 trend as the Atlantic and Indian sectors, but the warmer waters in this region have a reversal of50 this trend.

51 In the Subtropical Zone (STZ, from  $\sim 40^{\circ}$ S to  $30^{\circ}$ S), the SST ranges approximately from 52 10 to 25°C, and the carbon flux varies approximately from -5 to 1 mol m<sup>-2</sup> year<sup>-1</sup>. In all three 53 sectors of the STZ, there is a trend of colder surface waters tending to coincide with more uptake. 54 55 S5. Mean sea surface properties and air-sea CO<sub>2</sub> flux of the sectors 56 Here, we show the zonal mean sea SST, sea surface salinity (SSS) and the air-sea  $CO_2$ 57 flux in the Southern Ocean sectors to provide context (Fig. S5); the anomalies are shown in S6. 58 59 S6. Sea surface property anomalies and the air-sea CO<sub>2</sub> flux anomalies of the sectors 60 We analyse the sea-air  $CO_2$  flux anomalies in comparison with the physical sea surface 61 properties of the Southern Ocean (Fig. S6). Generally, we find that warmer and saltier surface 62 waters tend to coincide with a stronger carbon sink. Therefore, it is evident that solubility is not 63 the dominant mechanism driving the sink variability, but rather reflects the reduction in vertical 64 mixing that usually brings cool but carbon-rich deep water to the surface. However, strong 65 differences exist between both the different sectors and the interfrontal zones (see also S4). 66 Similar to the sea-air CO<sub>2</sub> flux, the SST and SSS anomalies are strongest in the Atlantic 67 sector (Fig. S6A-C). Here, the temporal evolution is dominated by a warm anomaly in 2011, 68 north of the Polar Front (PF), which coincides with saltier surface waters and a stronger carbon 69 sink. A similar, but weaker anomalous period can be observed around 2009, north of the PF.

After this event, the Atlantic sector becomes cooler and fresher, while the carbon sink becomes
weaker again, especially north of the PF.

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72	In the Pacific sector, the signal varies on shorter time scales compared to the Atlantic
73	sector in all three variables (Fig. S6 $D$ - $F$ ), which strongly coincides with the ENSO (see S3),
74	suggesting the influence of remote modes of variability on the Southern Ocean CO <sub>2</sub> sink. While
75	throughout the time period, warm SST anomalies usually coincide with saltier phases and vice
76	versa, the carbon sink appears disconnected from this pattern. Warmer and saltier waters
77	coincide with less carbon uptake in the PFZ from 2004 through 2011, which was previously <sup>7</sup>
78	considered as evidence that the CO <sub>2</sub> flux trends in the Pacific sector are solubility dominated <sup>8</sup> .
79	However, subsequently colder and fresher waters coincide with less carbon uptake in the PFZ
80	after 2011, challenging this view.

81 The Indian sector behaves similarly to the Atlantic sector in terms of SST, similar to the 82 Pacific sector in terms of SSS, and like a mixture between the Atlantic and Pacific sectors in 83 terms of its  $CO_2$ -flux (Fig. S6*G-I*). For example, the period of much higher SST around 2011 84 north of the PF that was observed in the Atlantic, is also present in the Indian sector, albeit with 85 less intensity. In the following years, the surface waters in the STZ of both the Pacific and the 86 Indian sectors are saltier than the mean. This trend moves further south in ~2016.

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#### S7. Trends of the pCO<sub>2</sub>, its components, and drivers in the reinvigoration period

89 Here, we show the trends of the reinvigoration period to put our findings on the trends 90 during the most recent period in context. As discussed in Landschützer et al. [2015]<sup>8</sup>, in the 91 reinvigoration period, the  $\Delta pCO_2$  decreased in the Southern Ocean (Fig. S7A), resulting in 92 enhanced  $CO_2$  uptake by the ocean. The authors demonstrated that in this period the westerly 93 winds were stronger in the Pacific and weaker in the Atlantic due to a dipole in sea level pressure 94 (Fig. S7D). This change in surface wind patterns is thought to have caused enhanced 95 downwelling and warmer surface waters in the Atlantic sector. The non-thermal component (Fig. 96 S7C) dominated over the thermal component (Fig. S7B), resulting in an overall decrease in

- 97  $\Delta pCO_2$  (Fig. S7A). Concurrently, the stronger westerlies in the Pacific sector caused enhanced
- 98 upwelling and colder surface waters. Here, the thermal component (Fig. S7*B*) dominated over
- 99 the non-thermal component (Fig. S7*C*), resulting in an enhanced CO<sub>2</sub> uptake by the ocean.



**Fig. S1.** As Fig. 2*B* but with the correlation between the SAM and sea level pressure: Correlation coefficients between the sea level pressure [hPa] and the standardized SAM index, smoothed

102 with a 3-month running average, between January 1982 and December 2016. Coefficients with

significance <95% are hatched. The mean positions of the PF ( $\sim55^{\circ}$ S) and the STF ( $\sim40^{\circ}$ S) are

illustrated as thin black lines, and the three Southern Ocean sectors are delimited by dashed blacklines.



B.

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107 **Fig. S2.** Available pCO<sub>2</sub> observations [ $\mu$ atm] and robustness of the interpolated data in the most 108 recent period (2012 through 2016): (*A*) The distribution of the shipboard pCO<sub>2</sub> observations in 109 the Southern Ocean from the SOCATv5 database for each 1°x1° grid point (*B*) The mean 110 observed pCO<sub>2</sub> from the SOCATv5 database (*C*) The mean interpolated pCO<sub>2</sub> from 111 Landschützer et al. [2015] (*D*) The mean residual pCO<sub>2</sub> (interpolated minus observed pCO<sub>2</sub>). (*E*) 112 The standard deviation of the residual pCO<sub>2</sub>.



Fig. S3. CO<sub>2</sub> flux as a function of SST in each of the Southern Ocean sectors and interfrontal
zones, using monthly means from 2004 through 2016: Atlantic (A), Pacific (B), and Indian sector
(C), for the AAZ (green), PFZ (blue), and STZ (red).



**Fig. S4.** As Fig. 2, but the mean instead of the anomalies: Hovmöller plots of the zonal means117of the Southern Ocean sectors as a function of time (x-axis) and latitude (y-axis) from  $35^{\circ}S$  to118 $65^{\circ}S. SST [^{\circ}C] (A,D,G)$  and SSS (B,E,H) in comparison to the carbon flux [mol m-<sup>2</sup> yr<sup>-1</sup>] (C,F,I)119for the Atlantic (A-C), Pacific (D-F), and Indian sectors (G-I). The mean positions of the STF120 $(40^{\circ}S, 40^{\circ}S, 42^{\circ}S)$  and PF  $(53^{\circ}S, 60^{\circ}S, 52^{\circ}S)$  are shown for the Atlantic, Pacific, and Indian121sectors respectively as dashed black lines. Negative values in the CO<sub>2</sub>-flux indicate oceanic122uptake. The seasonal cycle is not removed, but we smoothed with a 3-month running mean.



123 Fig. S5. Hovmöller plots of the zonal mean anomalies of the Southern Ocean sectors as a function of time 124 (x-axis) and latitude (y-axis) from 35°S to 65°S. SST anomalies [°C] (A, D, G), SSS anomalies (B, E, H) and 125 the carbon flux anomalies [mol m<sup>-2</sup> yr<sup>-1</sup>] (C, F, I) for the Atlantic (A-C), Pacific (D-F), and Indian sectors 126 (G-I). The mean positions of the Subtropical Front (STF, 40°S, 40°S, 42°S) and PF (53°S, 60°S, 52°S) are 127 illustrated for the Atlantic, Pacific, and Indian sectors respectively as dashed black lines. The anomalies 128 are based on the mean between 2004 and 2016, and the first and last 3 months are removed in the 129 smoothing. Negative values in the CO<sub>2</sub>-flux anomalies indicate a stronger sink. Note that while Fig. 1 130 extends until the Antarctic coast (~77°S), Fig. 2 only extends until 65°S due to the data availability of the 131 SST and SSS. See also S5 for the mean values instead of the anomalies.





134 Fig. S6. As Fig. 4, but with the Multivariate ENSO Index (MEI) instead of the SAM index: The 135 relationship between the MEI and the  $CO_2$  flux anomaly between January 1982 and December 136 2016. (A) Standardized MEI smoothed with a 3-month running mean. Positive is shown in red, 137 negative in blue. The start of the reinvigoration (Jan 2002) and the current period (Jan 2012) are 138 marked with thin black lines. (B) Correlation coefficients between the air-sea  $CO_2$  flux anomaly 139  $[mol m^{-2} yr^{-1}]$  and the standardized MEI. Coefficients with significance <95% are hatched. (C) 140 The slope of the regression fit between the air-sea  $CO_2$ -flux anomalies [mol m<sup>-2</sup> yr<sup>-1</sup>] and the 141 standardized MEI. As the MEI is standardized to have a mean of 0 and a standard deviation of 142 1, (C) illustrates the change in the CO<sub>2</sub> flux [mol  $m^{-2}$  yr<sup>-1</sup>] per standard deviation of the MEI. (B-143 C) The mean positions of the PF ( $\sim$ 55°S) and the STF ( $\sim$ 40°S) are shown as thin black lines, the 144 three Southern Ocean sectors are delimited by dashed black lines, and the coastal areas are 145 masked white.



146 Fig. S7. As Fig. 4, but for the reinvigoration period (2004 through 2011) instead of the most 147 recent period (2012 through 2016). Trends of the pCO<sub>2</sub>, its components, and the sea level 148 pressure and 10 m wind velocity during the reinvigoration period (2004 through 2011). (A) trend 149 of the sea level pressure (hPa decade<sup>-1</sup>) (color) and trend of the 10 m wind velocity (m s<sup>-1</sup> decade<sup>-1</sup>) 150 <sup>1</sup>) (vectors). (B) Trend of the  $\Delta pCO_2$  (µatm year<sup>-1</sup>); (C) trend of the thermal component of the 151 pCO<sub>2</sub> ( $\mu$ atm year<sup>-1</sup>); (D) trend of the non-thermal component of the  $\Delta$ pCO<sub>2</sub> ( $\mu$ atm year<sup>-1</sup>); The 152 mean positions of the PF and the STF are shown as thin black lines and dashed black lines delimit 153 the three Southern Ocean sectors. Note: a similar figure was shown in Landschützer et al. [2015] 154 <sup>8</sup> for the period from 2002 through 2011. Note that the scale is smaller than in Fig. S3 for *B-D*.

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