

1 Circulation-driven variability of Atlantic anthropogenic carbon transports and uptake

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13 **The ocean absorbs approximately a quarter of the carbon dioxide currently released to the**  
14 **atmosphere by human activities ( $C_{\text{anth}}$ ). A disproportionately large fraction accumulates in**  
15 **the North Atlantic due to the combined effects of transport by the Atlantic Meridional**  
16 **Overturning Circulation (AMOC) and air-sea exchange. However, discrepancies exist**  
17 **between modelled and observed estimates of the air-sea exchange due to unresolved ocean**  
18 **transport variability. Here we quantify the strength and variability of  $C_{\text{anth}}$  transports**  
19 **across 26.5°N in the North Atlantic between 2004 and 2012 using circulation measurements**  
20 **from the RAPID mooring array and hydrographic observations. Over this time period,**  
21 **decreasing circulation strength tended to decrease northward  $C_{\text{anth}}$  transport, while**  
22 **increasing  $C_{\text{anth}}$  concentrations (preferentially in the upper limb of the overturning**  
23 **circulation) tended to increase northward  $C_{\text{anth}}$  transport. These two processes**

24 **compensated each other over the 8.5-year period. While ocean transport and air-sea  $C_{\text{anth}}$**   
25 **fluxes are approximately equal in magnitude, the increasing accumulation rate of  $C_{\text{anth}}$  in**  
26 **the North Atlantic combined with a stable ocean transport supply means we infer a**  
27 **growing contribution from air-sea  $C_{\text{anth}}$  fluxes over the time period. North Atlantic  $C_{\text{anth}}$**   
28 **accumulation is thus sensitive to AMOC strength, but growing atmospheric  $C_{\text{anth}}$  uptake**  
29 **continues to significantly impact  $C_{\text{anth}}$  transports.**

30 The ocean exchanges carbon dioxide ( $\text{CO}_2$ ) rapidly with the atmosphere, with regions of  
31 substantial net  $\text{CO}_2$  uptake and release created by ocean circulation, biological processes and  
32 heat and freshwater fluxes<sup>1</sup>. In pre-industrial times the global net  $\text{CO}_2$  flux from the ocean to the  
33 atmosphere is estimated to have been  $\sim 0.45\text{-}0.78 \text{ PgC yr}^{-1}$  balancing riverine carbon inputs<sup>2,3</sup>.  
34 However, increasing atmospheric  $\text{CO}_2$  concentrations since the beginning of the Industrial  
35 Revolution have reversed the flux, transferring anthropogenic carbon ( $C_{\text{anth}}$ ) into the ocean at a  
36 rate of  $2.6 \pm 0.3 \text{ PgC yr}^{-1}$ <sup>4</sup>, slowing the accumulation of anthropogenic  $\text{CO}_2$  in the atmosphere  
37 and reducing the pace of global warming. This net global oceanic  $C_{\text{anth}}$  uptake accounts for  
38 nearly 50% of all historical fossil fuel emissions<sup>5</sup> and 23% of total contemporary emissions<sup>6</sup>.  
39 Understanding the processes that cause this uptake to occur and their susceptibility to change are  
40 therefore high priority activities.

41 The North Atlantic (NA) and Arctic region (from the Equator to Bering Strait) is a key region as  
42 it plays a disproportionately large role in the uptake of both  $\text{CO}_2$  and  $C_{\text{anth}}$  from the atmosphere.  
43 It was a regional sink for atmospheric carbon in pre-industrial times<sup>7</sup>, and now accounts for  
44 approximately 25% of all contemporary global  $\text{CO}_2$  uptake from the atmosphere<sup>6,8</sup> and 25% of  
45 the global ocean  $C_{\text{anth}}$  inventory<sup>4,5,9,10</sup> despite having only 15% of the global ocean surface. The  
46 “natural” (pre-industrial)  $\text{CO}_2$  uptake results from both the surface cooling of warm water

47 advected polewards prior to sinking, as part of the Atlantic Meridional Overturning Circulation  
48 (AMOC, see Figure 1, adapted from <sup>11</sup>), and from strong biological production<sup>12</sup>. The AMOC  
49 generates a net southward transport of contemporary (natural and anthropogenic) carbon, with  
50 lower carbon concentrations in the warm, upper northward flow being exceeded by higher  
51 concentrations in the cold, deep return flow<sup>7,13</sup>. Conversely, the post-industrial build-up of  $C_{anth}$   
52 in surface waters generates a surface-enhanced concentration profile (Figure 1 for  $C_{anth}$   
53 distribution along 26.5°N); when combined with the action of the overturning circulation this  
54 leads to a net northward transport of  $C_{anth}$  into the NA<sup>13,14</sup>, the opposite direction to the natural  
55 carbon transport and contributes to the highest regional  $C_{anth}$  accumulation rates in the global  
56 ocean<sup>4,5</sup>.

57 The size, variability and controls of the ocean circulation contribution to regional  $C_{anth}$  storage  
58 and hence the resilience of this sink to global change are largely unknown. Prior observational  
59 estimates of NA  $C_{anth}$  accumulation, from individual synoptic repeat hydrographic sections, vary  
60 widely (0.19-0.43 PgC yr<sup>-1</sup> <sup>13-17</sup>, Table 1), with more constrained estimates possible only through  
61 larger-scale, regional/global analyses (0.38-0.47 PgC yr<sup>-1</sup>, from ocean inversion and data  
62 assimilation models or observational integrations<sup>4,10,18</sup>). Cruise-based estimates of northward  
63 ocean  $C_{anth}$  transports meanwhile (0.17-0.25 PgC yr<sup>-1</sup> <sup>13-17</sup>) are typically much higher than  
64 estimates from biogeochemical models, ocean inversions and data assimilations (0.09-0.15 PgC  
65 yr<sup>-1</sup> <sup>4,10,18-20</sup>); this is primarily due to cruise-based  $C_{anth}$  transport estimates being based on single  
66 “snapshot” estimates of ocean circulation (principally the AMOC), and the inability of  
67 biogeochemical models and data assimilations to correctly estimate volume transports<sup>19</sup>.  
68 Between 27% and 66% of  $C_{anth}$  accumulation is thus driven by the northward ocean transport  
69 (the remainder being taken up from the atmosphere). The magnitude of the range is indicative of

70 the uncertainty related to unresolved temporal variability, observational and methodological  
71 limitations, and that each estimate is associated with a single state of the circulation or AMOC  
72 strength.

73 It is now clear that individual snapshot estimates of AMOC strength used in previous  
74 calculations of  $C_{\text{anth}}$  uptake (variability of which is removed by the inversion/ assimilation  
75 techniques described above) do not fully capture true circulation variability<sup>21</sup>. The AMOC  
76 estimated from the RAPID-MOCHA-WBTS programme at 26.5°N<sup>21</sup> (Figure 1) had an average  
77 strength of 17.2 Sv over the 2004-2012 period, with substantial temporal variability (10 day  
78 filtered root mean square variability of 4.6 Sv, variability of annual means of 2.2 Sv)<sup>21,22</sup>.  
79 However this variability was superimposed on a significant decreasing trend in AMOC  
80 magnitude of -0.54 Sv yr<sup>-1</sup> which occurred over the same time period<sup>23,24</sup>. CMIP5 Earth System  
81 models have predicted that weakening of AMOC strength similar in scale to this recently  
82 observed will lead to a decline in both surface CO<sub>2</sub> uptake and accumulation at depth as climate  
83 change feedbacks strengthen<sup>25</sup>.

#### 84 **High frequency anthropogenic carbon transport estimates**

85 In this article we investigate the impact of observed circulation change on  $C_{\text{anth}}$  accumulation in  
86 the NA between 2004 and 2012, combining ten-day AMOC transport fields at 26.5°N<sup>21,26</sup> with  
87  $C_{\text{anth}}$  concentrations estimates. A time series of  $C_{\text{anth}}$  concentration distributions is generated  
88 using regressions constructed from all available hydrographic data at 26.5°N and applied to the  
89 RAPID-Argo ten-day temperature-salinity fields<sup>26</sup> (see Methods, Extended Data Figures 1-3,  
90 Extended Data Table 1). Therefore, it includes variability associated with the changing  
91 distribution of water masses on the section (from RAPID and Argo) and longer-term, water  
92 mass-specific concentration trends (from repeat hydrography). In addition, in the upper 200m of

93 the water column we incorporate a new Scaled Pre-industrial DisEquilibrium (SPIDER) method  
94 based on sea-surface pCO<sub>2</sub> observations to account for seasonal variation of the C<sub>anth</sub>  
95 concentration that has not been included in previous treatments<sup>15</sup>; this ensures feasible year-  
96 round concentration ranges that are consistent with Revelle factor (Rf) variability and air-sea  
97 fluxes (Methods, Extended Data Figures 4-5). For the region east of the Bahamas, estimated C<sub>anth</sub>  
98 distributions are combined with ten-day mooring/float derived transport fields, while in Florida  
99 Straits we calculate a transport-weighted C<sub>anth</sub> (C<sub>anth</sub> transport divided by volume transport) time  
100 series from repeat hydrographic sections that enables combination with the submarine cable-  
101 derived transport time series (Methods, Extended Data Figure 6). Uncertainties in C<sub>anth</sub>  
102 transports were calculated following the approach used for freshwater transport<sup>26</sup> but also  
103 accounting for uncertainties associated with C<sub>anth</sub> estimation and trends (Methods, Extended Data  
104 Table 2). The uncertainty in volume transport contributes 70% to the total error estimate, with  
105 uncertainties relating to the C<sub>anth</sub> concentrations contributing approximately 30%. We analysed  
106 the robustness and appropriateness of the methodology employed for estimating C<sub>anth</sub> and its  
107 transport for the time between hydrographic sections by using model outputs. Predicted C<sub>anth</sub>  
108 transport fields (generated as for observations, using predictive parameterisations of model  
109 ‘truth’ C<sub>anth</sub>) were compared with explicitly determined model C<sub>anth</sub> transport fields (based on  
110 parallel NEMO-MEDUSA 1° model runs with and without atmospheric CO<sub>2</sub> growth and with  
111 identical physical fields), and suggested the approach can reproduce the 2004-2012 model mean  
112 to within 3% of the model truth, and shorter-term estimates (1 month) to within ~9% (worst-  
113 case) (Methods, Extended Data Figure 7). Finally, we tested the back-calculation C<sub>anth</sub> estimation  
114 method employed on hydrographic data by direct application to model outputs; results showed

115 accuracy to within 0.5% for the 2004-2012  $C_{\text{anth}}$  transport model mean and to within ~7% for  
116 shorter, 1-month estimates (Methods, Extended Data Figure 8).

### 117 **Circulation components of anthropogenic carbon transport**

118 Figure 2 summarizes the transport of  $C_{\text{anth}}$  across the 26.5°N section. A mean northwards  $C_{\text{anth}}$   
119 transport is calculated for 2004-2012 of  $0.191 \pm 0.013$  PgC yr<sup>-1</sup> (mean  $\pm$  total uncertainty in time  
120 series mean, Fig. 2a black line, Extended Data Table 2, Methods). This lies within the range of  
121 previous estimates determined from hydrography but is larger than that derived from inversion  
122 models (Table 1). The mean net  $C_{\text{anth}}$  transport is largely set by the difference between the  
123 northward Florida Straits transport and the southward interior transport between 0 and 1,100 db,  
124 the two largest transport components (Fig. 2a, Table 2). Although the mean volume transport in  
125 the Florida Straits (31.6 Sv) is greater than the geostrophic interior transport (-18.6 Sv) the  
126 transport-weighted  $C_{\text{anth}}$  for the interior ( $65.6 \mu\text{mol kg}^{-1}$ ) is higher than that for Florida Straits  
127 ( $54.4 \mu\text{mol kg}^{-1}$ ), reflective of the accumulation of  $C_{\text{anth}}$  in surface waters as they recirculate in  
128 the anticyclonic gyre from the western boundary (Fig. 1). Contributions from northward Ekman  
129  $C_{\text{anth}}$  transports (3.5 Sv, driven by surface winds and calculated from ERA-Interim data) enhance  
130 the net total  $C_{\text{anth}}$  transport, and show strong variability and occasional southward incursions.  
131 While the combined transports between 1,100 and 5,000 db (-18.7 Sv) make up the smallest  
132 contribution to the overall  $C_{\text{anth}}$  transport (southward export of  $0.09$  PgC yr<sup>-1</sup>, transport-weighted  
133  $C_{\text{anth}}$   $12.5 \mu\text{mol kg}^{-1}$ , Table 2, Fig. 2a), they do represent the NA's input to long-term storage of  
134 carbon in the deep ocean, equivalent to 4% of the total annual global  $C_{\text{anth}}$  uptake rate<sup>4</sup>.

135 There is a high degree of variability over the 8.5-year record, with a maximum annual peak-to-  
136 peak amplitude of  $0.48$  PgC yr<sup>-1</sup> (December 2008 to December 2009, Fig. 2a,d), a standard  
137 deviation of ten-day transport estimates of  $0.08$  PgC yr<sup>-1</sup> and substantial interannual variability

138 with annual means ranging from 0.11 to 0.23 PgC yr<sup>-1</sup> (Fig. 2b). Application of a three-month  
139 low-pass filter reveals a strong seasonal cycle (amplitude 0.08 PgC yr<sup>-1</sup>, Fig. 2c).  
140 Following methods used for freshwater<sup>26</sup> we additionally separated C<sub>anth</sub> transport into  
141 overturning, horizontal and throughflow components (Fig. 2d) as an indication of the dominant  
142 components of C<sub>anth</sub> transport strength and variability: overturning describes the transport's  
143 vertical structure (zonally-averaged C<sub>anth</sub> and velocity fields with the section average removed),  
144 horizontal represents the gyre and eddy transports (calculated as the total C<sub>anth</sub> transport with  
145 mean and overturning contributions removed), and throughflow represents the ~0.8 Sv of Pacific  
146 water that flows southwards through the Atlantic from Bering Strait (see Methods for details).  
147 The throughflow component is almost zero for C<sub>anth</sub> (-0.8 TgC yr<sup>-1</sup>, 1000 Tg=1Pg) as per  
148 previous studies<sup>13,15</sup> and is not shown. The overturning C<sub>anth</sub> transport is northwards (mean ±  
149 standard deviation: +0.31 ± 0.09 PgC yr<sup>-1</sup>), its sign representative of the upper ocean northward  
150 limb having higher C<sub>anth</sub> concentrations than its deep, southward-flowing limb (Fig. 1, Table 2).  
151 The horizontal C<sub>anth</sub> transport is southwards (mean ± standard deviation: -0.11 ± 0.02 PgC yr<sup>-1</sup>)  
152 and derives from the west-east C<sub>anth</sub> concentration gradient combining with both the north- and  
153 southward gyre and eddy transports, and the horizontal component of the Florida Straits transport  
154 being compensated by southward flow in the upper ocean of the interior east of the Bahamas.  
155 The horizontal C<sub>anth</sub> transport component is smaller in magnitude and less variable than the  
156 overturning component (Fig. 2d), with AMOC volume transport variability describing 80% of  
157 the variance in C<sub>anth</sub> transports. This strong AMOC:C<sub>anth</sub> transport correlation at 26.5°N (Fig. 3a)  
158 is supported by model outputs<sup>19</sup> and here indicates a 1 Sv increase in overturning is associated  
159 with an 18 TgC yr<sup>-1</sup> increase in C<sub>anth</sub> transport. There is temporal structure in the correlation's  
160 residual (Fig. 3b) with the residual growing over the length of the time series; this represents that

161 part of the variability that is not correlated with the AMOC (such as increasing  $C_{\text{anth}}$  loadings)  
162 and can be interpreted as an increase in the sensitivity of  $C_{\text{anth}}$  transports per Sverdrup of AMOC.  
163 Despite increasing  $C_{\text{anth}}$  concentrations there is no trend in the total  $C_{\text{anth}}$  transport across 26.5°N  
164 between 2004 and 2012. Significant trends are, however, present in the subregions, with the  
165 largest (and near-compensating) trends associated with the two largest components (positive  
166 trend, Florida Straits; negative trend, upper mid-ocean, Table 2). Although the  $C_{\text{anth}}$  transport-  
167 AMOC correlation and a decrease in AMOC strength of  $-0.54 \text{ Sv yr}^{-1}$  observed between 2004-  
168 2012<sup>23</sup> predicts a decreasing overturning component trend ( $-10 \text{ TgC yr}^{-2}$ ), the observed value is  
169 much smaller ( $-6 \text{ TgC yr}^{-2}$ ) due to increasing  $C_{\text{anth}}$  concentrations. The overturning trend is not  
170 replicated in the total  $C_{\text{anth}}$  transport trend ( $-0.4 \text{ TgC yr}^{-2}$ ) due to a compensating trend in the  
171 horizontal gyre component ( $+5 \text{ TgC yr}^{-2}$ ).

#### 172 **Circulation change and water column $C_{\text{anth}}$ accumulation**

173 We can separate the impact of circulation change and water column  $C_{\text{anth}}$  accumulation on total  
174 and component  $C_{\text{anth}}$  transports by removing water-mass-specific  $C_{\text{anth}}$  trends from the predicted  
175  $C_{\text{anth}}$  fields and recombining the residual with the volume transport estimates. The time series  
176 generated represents the effect of volume-transport trends on an unchanging  $C_{\text{anth}}$  field while the  
177 difference from the full transport time series reflects the effect of additional  $C_{\text{anth}}$  load (Fig. 4 and  
178 Table 2). For the total northwards  $C_{\text{anth}}$  transport, this shows that circulation changes cause a  
179 decline of  $94 \text{ TgC yr}^{-1}$  over 8.5 years.

180 However, this is balanced by an increasing transport due to growing  $C_{\text{anth}}$  concentrations derived  
181 from air-sea exchange of  $89 \text{ TgC yr}^{-1}$ . Together they generate a total  $C_{\text{anth}}$  transport with no  
182 significant trend, thus implying that for 2004-2012  $C_{\text{anth}}$  increases are counter balanced by the  
183 effect of circulation change on the total oceanic supply of  $C_{\text{anth}}$  to the NA. For individual  $C_{\text{anth}}$



184 transport components and subregions, the Florida Straits and the upper ocean interior still  
185 dominate; the increasing northward trend in Florida Straits is driven by growing  $C_{\text{anth}}$  loads (19  
186  $\text{TgC yr}^{-1}$ ); the increasingly southward (negative) interior trend is approximately one-third due to  
187 increasing  $C_{\text{anth}}$  concentrations ( $-6 \text{ TgC yr}^{-1}$ ) and approximately two-thirds due to volume  
188 transport decreases ( $-12 \text{ TgC yr}^{-1}$ ).

189 The horizontal  $C_{\text{anth}}$  transport is increasing (becoming more northward) because the Florida  
190 Straits transport-weighted  $C_{\text{anth}}$  trend is larger than the trend in the interior. The difference in the  
191 trends is due to  $C_{\text{anth}}$  concentrations increasing faster at the western boundary than at the eastern  
192 boundary, thereby diminishing the west-to-east gradient (Fig. 1). The decreasing trend in  
193 overturning volume transport over the period is produced by balancing increases in southward  
194 moving upper waters ( $-0.48 \text{ Sv yr}^{-1}$ ) and reductions in southward-moving deep waters (between  
195 3,000 and 5,000 db;  $+0.48 \text{ Sv yr}^{-1}$ ). This then creates an associated reduction in the northward  
196  $C_{\text{anth}}$  overturning transport.

### 197 **The NA $C_{\text{anth}}$ budget**

198 For the NA and Arctic region ( $26.5^{\circ}\text{N}$  to Bering Strait), a regional  $C_{\text{anth}}$  budget of ocean  
199 transport, storage and air-sea fluxes can be formed using a storage rate of  $0.39\text{-}0.47 \text{ PgC yr}^{-1}$  for  
200 2004<sup>10,15,18</sup>. Combining our derived northward transport across  $26.5^{\circ}\text{N}$  of  $0.191 \text{ PgC yr}^{-1}$  with the  
201 total  $C_{\text{anth}}$  contribution through the Bering Strait ( $0.008 \text{ PgC yr}^{-1}$ )<sup>15</sup>, suggests that lateral oceanic  
202 transport supplies between 42% and 51% of the  $C_{\text{anth}}$  accumulating in the NA and Arctic. The  
203 remainder of the storage term must then originate from air-sea uptake ( $0.19\text{-}0.27 \text{ PgC yr}^{-1}$ ).

204 The dominant air-sea flux contribution calculated here compares well with estimates from ocean  
205 inversions<sup>18</sup> and ocean assimilations<sup>10</sup> for the same timeframe ( $0.28\text{-}0.35 \text{ PgC yr}^{-1}$ , Table 1),  
206 despite ocean  $C_{\text{anth}}$  transport estimates differing somewhat. However, it differs markedly from

207 the only previous estimate from observations where ocean transport dominates and air-sea uptake  
208 supplies only 0.13 PgC yr<sup>-1</sup> (33%) to C<sub>anth</sub> inventory growth for 2004<sup>15</sup>. This difference comes  
209 largely from our revised estimate of the ocean transport term that, as the time series and our  
210 seasonal correction to the near-surface concentrations show, exhibits large seasonal and  
211 interannual variability which have not previously been taken into consideration and are aliased in  
212 hydrographic-only transport estimates.

213 Contemporary sea-to-air CO<sub>2</sub> flux estimates calculated using sea surface ΔpCO<sub>2</sub> observations  
214 suggest an annual uptake for the NA-Arctic region north of 14-18°N of -0.53-0.63 PgC yr<sup>-1</sup> for  
215 2004<sup>27,28</sup> (regional extents differ somewhat from ours, due to the choice of latitudinal boundaries  
216 by previous studies). Our C<sub>anth</sub> uptake estimate of -0.19-0.27 PgC yr<sup>-1</sup> constitutes 40% of this  
217 signal, with the remainder (mean ± range -0.35 ± 0.08 PgC yr<sup>-1</sup>) being the “natural” uptake that  
218 would also have existed pre-industrially, a value consistent with global inverse model outputs  
219 (natural air-sea CO<sub>2</sub> flux neglecting riverine contribution -0.33 ± 0.08 PgC yr<sup>-1</sup>, and C<sub>anth</sub> air-sea  
220 flux -0.31 ± 0.08 PgC yr<sup>-1</sup> scaled to 2004)<sup>18,29</sup>. Our revised estimate for the C<sub>anth</sub> transport into  
221 the region provides consistency between observational and model estimates of the anthropogenic  
222 and pre-industrial components of the NA’s uptake of atmospheric CO<sub>2</sub>.

223 The results presented here establish a strong relationship between the strength of the Atlantic  
224 overturning circulation and the oceanic contribution to the growing NA C<sub>anth</sub> inventory (as  
225 inferred from rising air-sea CO<sub>2</sub> uptake<sup>28,30</sup> and historical storage increases<sup>31</sup>), confirming the  
226 recent outputs of a biogeochemical model<sup>19</sup>. The northward C<sub>anth</sub> transport is highly variable on  
227 both short (10 day) and annual time periods, but when averaged over a nearly decadal period it  
228 shows no significant trend. Although as regional C<sub>anth</sub> accumulation continues to increase<sup>4</sup>, this  
229 implies a decrease in the relative contribution from northward ocean C<sub>anth</sub> transport. This result

230 places greater emphasis on air-sea fluxes as the means by which local  $C_{\text{anth}}$  storage rates are  
231 maintained.

232 The overturning circulation is still the primary conduit in the NA by which  $\text{CO}_2$  is both absorbed  
233 from the atmosphere (the AMOC-related transport and fluxes of heat and nutrients drive the  
234 strength of both physical and biological carbon pumps) and  $C_{\text{anth}}$ -rich waters are isolated from  
235 the surface on extended timescales<sup>12,32</sup>. While the long-term NA carbon sink is currently thought  
236 to be tracking the atmospheric  $\text{CO}_2$  increase<sup>30</sup>, surface warming is beginning to affect the uptake  
237 capacity of the subtropics<sup>33</sup>. This change combined with predicted long-term changes in AMOC  
238 strength<sup>34</sup> and buffering capacity<sup>35</sup> imparts substantial uncertainty to the future behaviour of the  
239 NA carbon sink over the twenty-first century<sup>20,25</sup> and its ability to slow atmospheric  $\text{CO}_2$  increase  
240 rates.

241

## 242 ONLINE CONTENT

243 Methods, along with any additional Extended Data display items and Source Data, are available  
244 in the online version of the paper; references unique to these sections appear only in the online  
245 paper

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342

#### 343    AUTHOR CONTRIBUTIONS

344    E.L.M., B.A.K, R.S. and A.J.W designed the study. P.J.B performed the analysis. P.J.B., E.L.M.,  
345    R.S. and A.J.W wrote the manuscript. D.S., U.S., M.O.B., C.S.M. and R.W. gave technical

346 support and conceptual advice. M.O.B., C.S.M., A.Y., U.S. & M.-J.M. contributed observational  
347 data.

348

349 COMPETING INTERESTS

350 The authors declare no competing interests.

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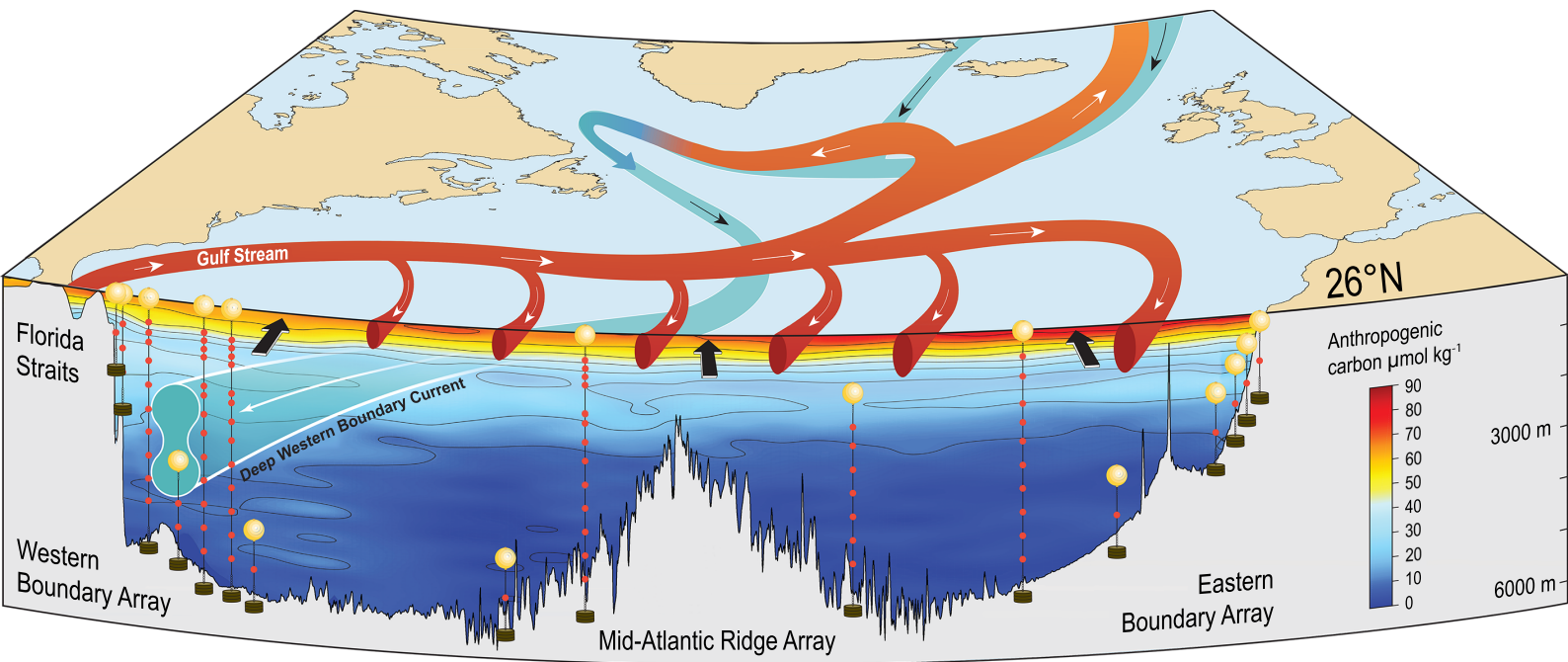
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354 FIGURES

355 Figure 1. AMOC observing system mooring array at 26.5°N with 2010 anthropogenic carbon  
356 distribution. Ekman transport is represented by black arrows, warm water circulation in the top  
357 1,100 m is represented by white arrows on red, and black and white arrows on teal represent the  
358 mainly southward flow of colder, deeper waters. Adapted from <sup>11</sup> – reprinted with permission  
359 from AAAS.

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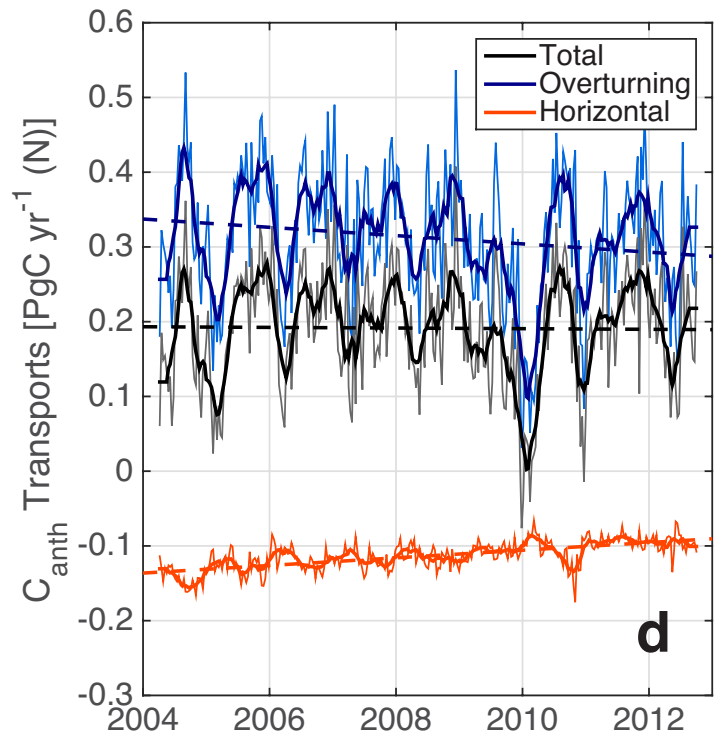
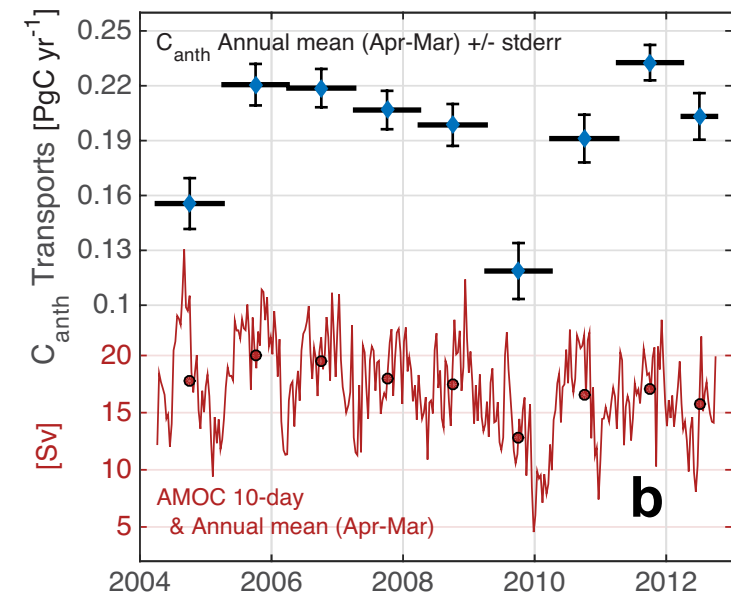
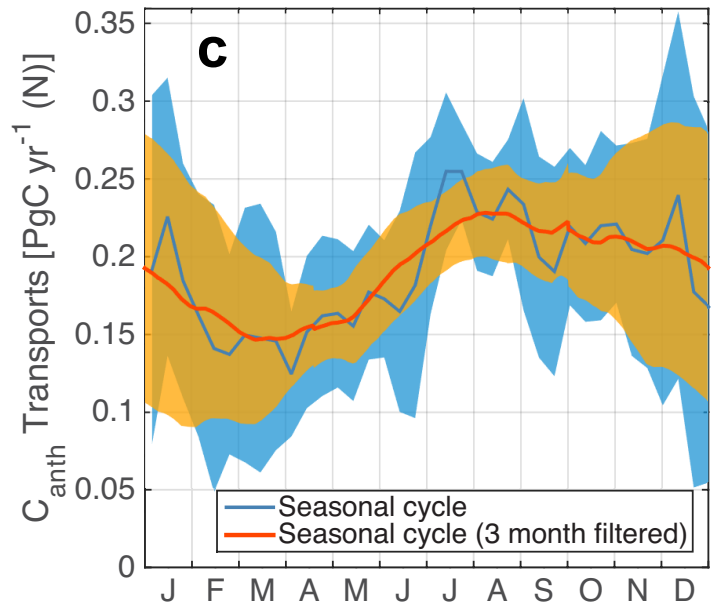
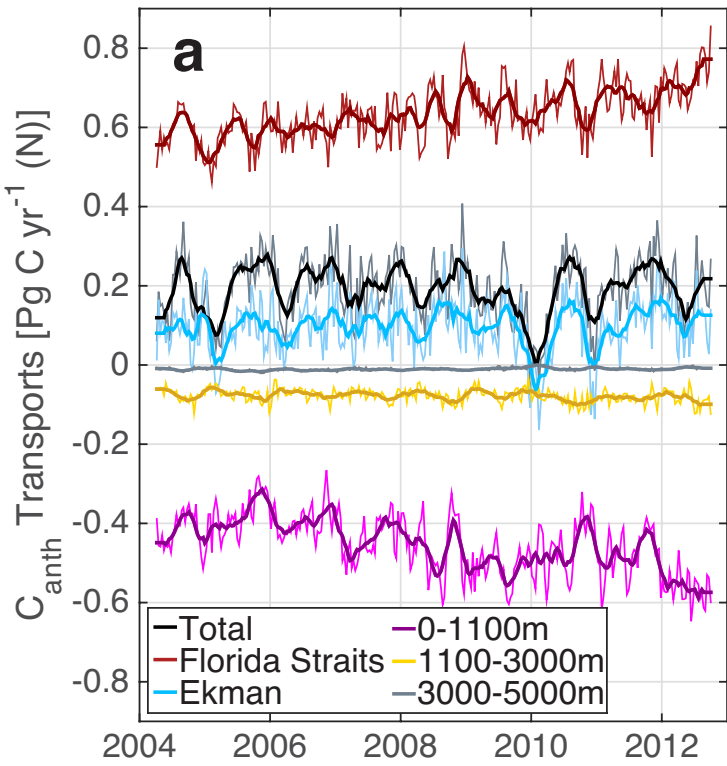
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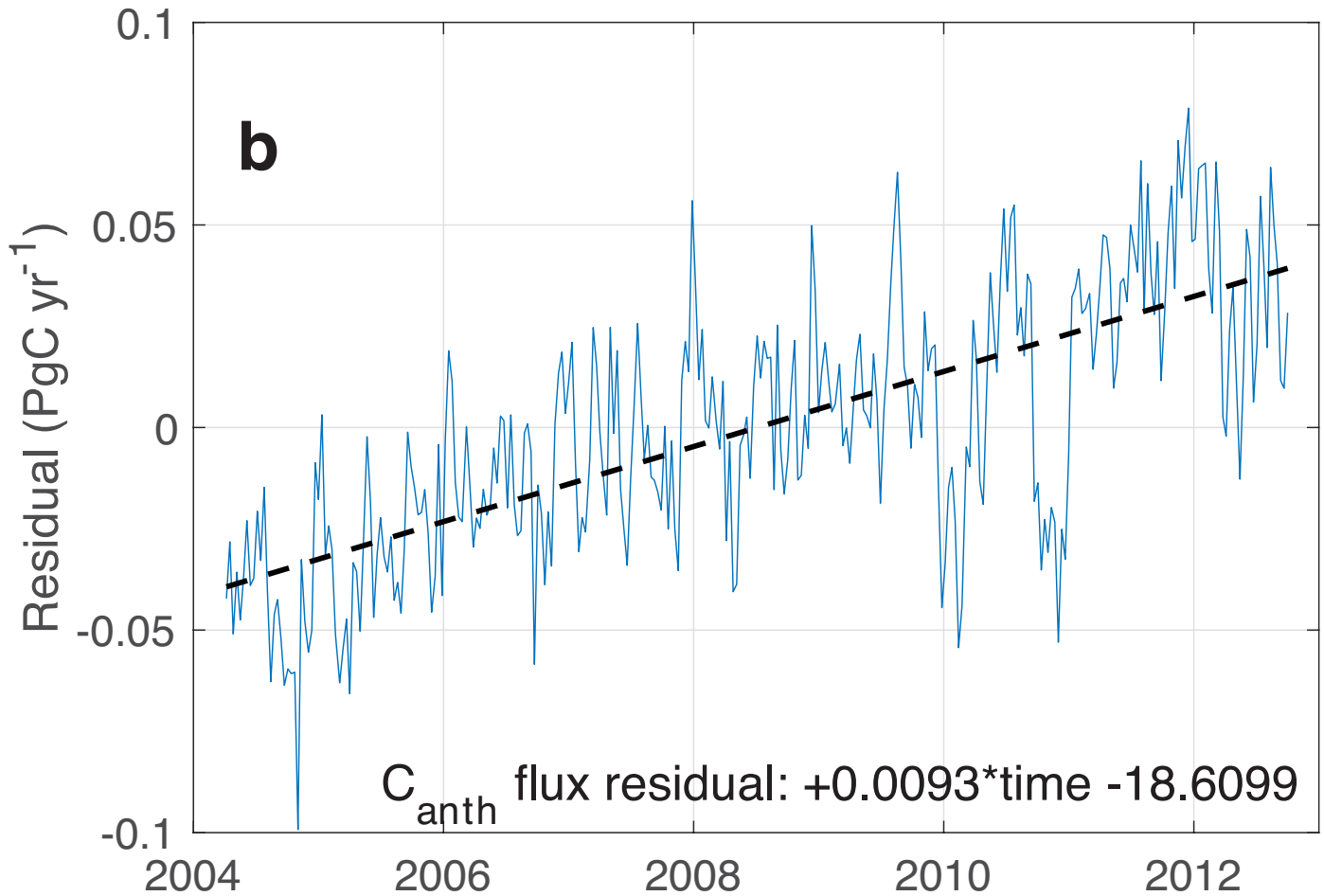
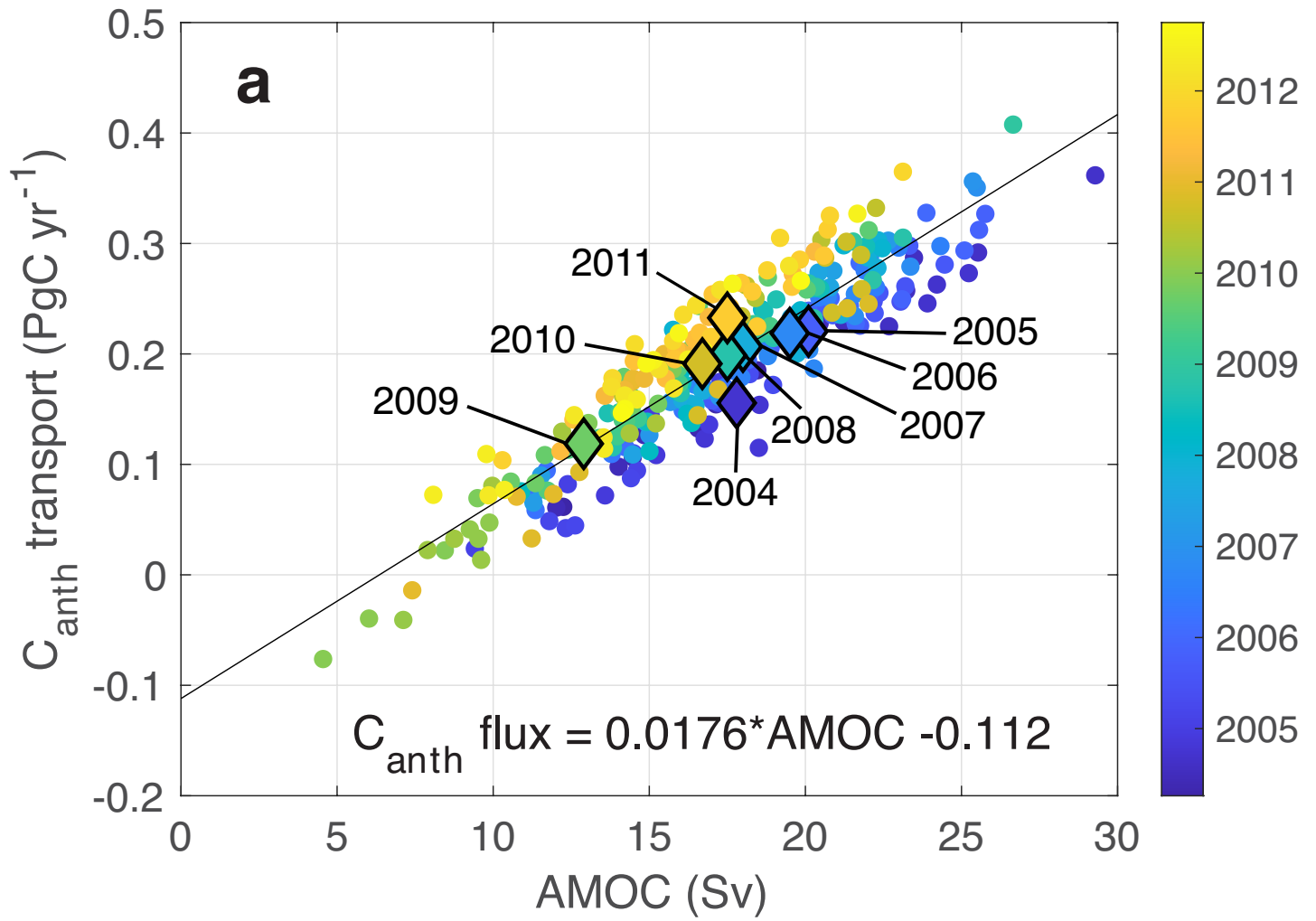
362 Figure 2.  $C_{\text{anth}}$  transports across 26.5°N in the subtropical NA. (a) Ten-day and three month low-  
363 pass (bold) time series of  $C_{\text{anth}}$  transports in (from top to bottom): Florida Straits Gulf Stream  
364 (red), total transport (black), Ekman layer (blue), waters between 3,000 and 5,000 m (grey),  
365 waters between 1,100 and 3,000 m (yellow), and waters shallower than 1,100 m (pink-magenta)  
366 from April 2004 to October 2012. (b) Annual averages and standard error of the mean of  $C_{\text{anth}}$   
367 transports for April-March. (c) Seasonal cycle of  $C_{\text{anth}}$  transports using monthly data and 3 month  
368 low-pass filtered data, error envelope of 1 s.d. (d) Ten-day and three month low-pass (bold) time  
369 series of total anthropogenic carbon transport (black) and its overturning (blue) and horizontal  
370 (orange) components. Dashed lines indicate the linear trend over the same timeframe. Positive  
371 values indicate northward transport.

372

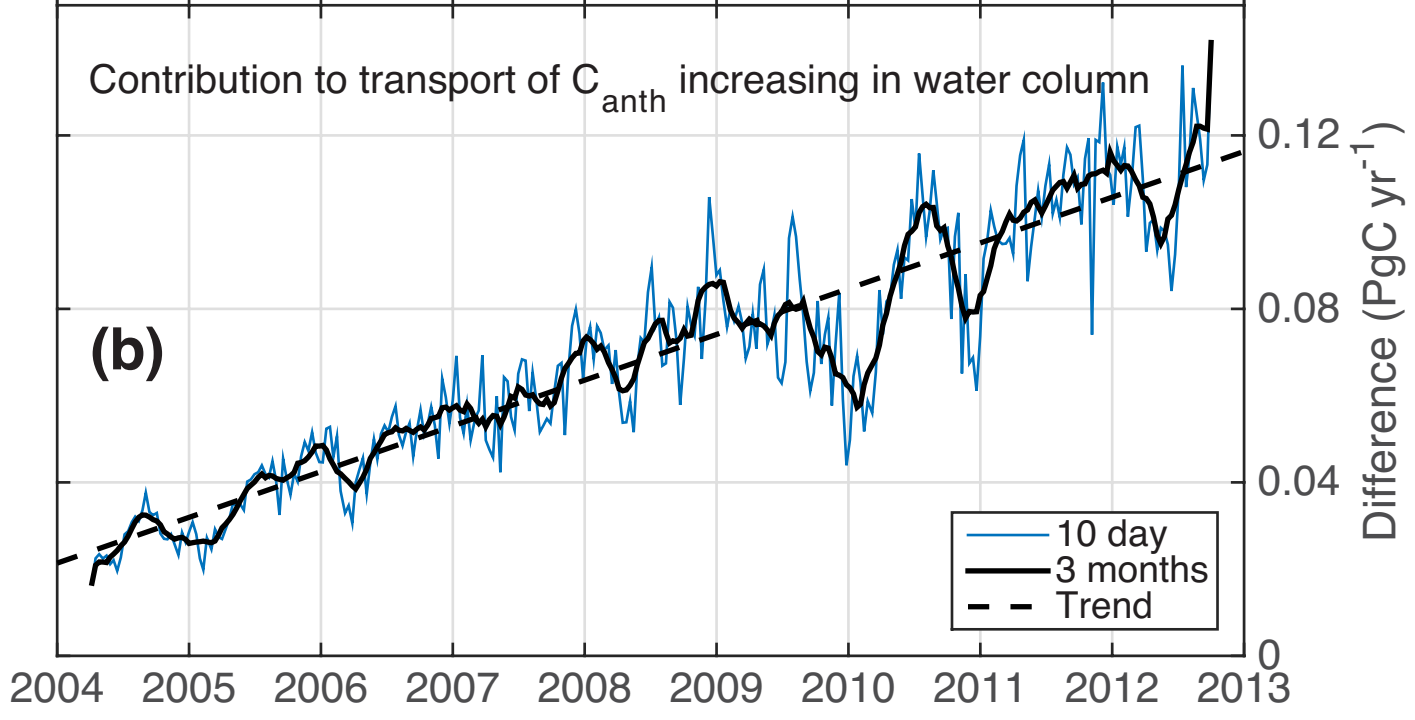
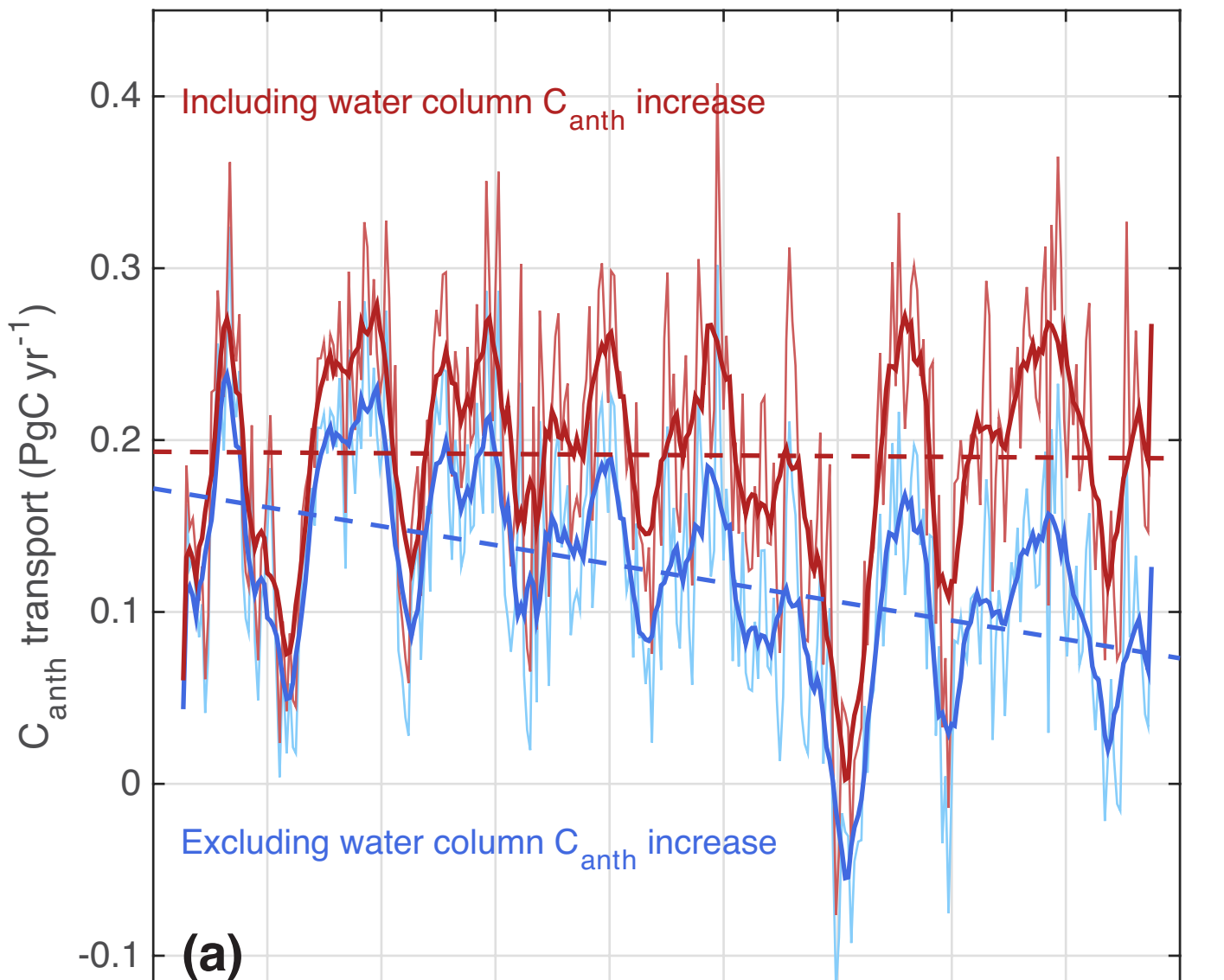
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374 Figure 3. AMOC- $C_{\text{anth}}$  transport co-variability and non-AMOC variability.  
375 (a) The relationship between strength of meridional overturning circulation and magnitude of  
376  $C_{\text{anth}}$  transport at 26.5°N. Colour scale relates each data point to the time series in Fig. 1.  
377 Diamonds represent April to March annual means with AMOC values from ref 17. (b) Residual  
378 between observed  $C_{\text{anth}}$  transport and that predicted by linear AMOC- $C_{\text{anth}}$  transport relationship  
379 versus time, describing variability that does not vary coherently with the AMOC. The dotted line  
380 is the linear trend of this residual between April 2004 and October 2012.  
381  
382



383 Figure 4. Impact of increasing anthropogenic carbon concentrations on ocean  $C_{\text{anth}}$  transport. (a)  
384 Ten-day (normal) and three month low-pass (bold) time series of total  $C_{\text{anth}}$  transport including  
385 (red) and ignoring (blue) effect of  $C_{\text{anth}}$  accumulating in the water column since 2002 for time-  
386 period between April 2004 and October 2012. (b) Difference between the two time series in (a).  
387 The effect of  $C_{\text{anth}}$  accumulating in the water column since 2002 on ocean  $C_{\text{anth}}$  transports at  
388  $26.5^{\circ}\text{N}$  on ten-day (blue) and three month low-pass (black) time scales.  
389  
390





391  
392

Method	Year	$C_{\text{anth}}$ Transport (PgC yr <sup>-1</sup> ) & Contribution to storage <sup>a</sup>	Storage (PgC yr <sup>-1</sup> )	Air-sea $C_{\text{anth}}$ flux (PgC yr <sup>-1</sup> ) & Contribution to storage	Citation
<i>FROM GLOBAL ESTIMATES</i>					
Biogeochemical Model	2000	0.15 ± 0.01	-	-	20
Ocean Inversion	2007	0.09 ± 0.02 (31%)	0.29	0.20 (69%)	19
Ocean assimilation	1995	0.12 ± 0.01 (33%)	0.39	0.28 (67%)	18
Observational Integration	2004	0.12 ± 0.01 (27%)	0.47	0.35 (73%)	10
Observational Integration	2000	-	0.38	-	4
<i>FROM SYNOPTIC OBSERVATIONS</i>					
Hydrographic sections	1992	0.24 ± 0.08 (58%)	0.43	0.18 (42%)	16
	1992	0.23 ± 0.08 (122%)	0.19-0.43 <sup>b</sup>	-0.05 to 0.19 (-26 to 44%)	14
	1992	0.17 ± 0.06 (82%)	0.22 <sup>c</sup>	0.04 (18%)	13
	1992	0.20 ± 0.02			17
	1998	0.20 ± 0.08 (95%)	0.22 <sup>c</sup>	0.01 (5%)	13
	2004	0.25 ± 0.05 (66%)	0.39	0.13 (24%)	15
This study	2004 to 2012	0.191 ± 0.013	0.39-0.47 <sup>d</sup> to 0.45-0.53 <sup>d</sup>	0.19-0.27 (~53%) to 0.25-0.33 (~59%)	
	2004	0.16 ± 0.08 (36%) <sup>e</sup>	0.430 <sup>d</sup>		
	2005	0.22 ± 0.07 (50%) <sup>e</sup>	0.438 <sup>d</sup>		
	2006	0.22 ± 0.06 (49%) <sup>e</sup>	0.445 <sup>d</sup>		
	2007	0.21 ± 0.06 (46%) <sup>e</sup>	0.453 <sup>d</sup>		
	2008	0.20 ± 0.07 (43%) <sup>e</sup>	0.460 <sup>d</sup>		
	2009	0.12 ± 0.09 (25%) <sup>e</sup>	0.468 <sup>d</sup>		
	2010	0.19 ± 0.08 (40%) <sup>e</sup>	0.475 <sup>d</sup>		
	2011	0.23 ± 0.06 (48%) <sup>e</sup>	0.483 <sup>d</sup>		
	2012	0.20 ± 0.08 (41%) <sup>e</sup>	0.490 <sup>d</sup>		

393

394 Table 1. Summary of historical estimates of  $C_{\text{anth}}$  transport across 26.5°N, and storage / air-sea  
395 flux terms derived from North Atlantic  $C_{\text{anth}}$  budgets. <sup>a</sup>Relative contribution to storage reflects  
396 total oceanic  $C_{\text{anth}}$  transport and thus includes Bering Strait contribution. <sup>b</sup>Storage range  
397 calculated following ref <sup>14</sup>, using range of surface layer carbon change of 0.75-1.75  $\mu\text{mol kg}^{-1}$ .  
398 <sup>c</sup>Storage term calculated as residual of other components (transport, air-sea fluxes). <sup>d</sup>Storage  
399 estimates for 2004 (and scaled to 2012) from refs <sup>10</sup> and <sup>18</sup>. <sup>e</sup>Annual averages are calculated on an  
400 April to March basis due to time series beginning in April 2004; contributions to storage are  
401 calculated as an average from different storage estimates.

402

Variable	Volume transport		Transport-weighted $C_{anth}$		$C_{anth}$ transport		Contribution to $C_{anth}$ transport trend due to	
	Mean (s.d.)	Trend (standard error)	Mean (s.d.)	Trend (standard error)	Mean (s.d.)	Trend (standard error)	Volume transport changes	$C_{anth}$ field changes
	Sv	Sv yr <sup>-1</sup>	$\mu\text{mol kg}^{-1}$	$\mu\text{mol kg}^{-1}\text{yr}^{-1}$	TgC yr <sup>-1</sup>	TgC yr <sup>-2</sup>	TgC yr <sup>-2</sup>	TgC yr <sup>-2</sup>
Florida Straits	31.58 (2.71)	-0.091 (0.062)	54.4 (3.9)	1.57 (0.0001)	634 (68)	17 (1.3)	-2	19
Ekman	3.53 (2.56)	0.002 (0.059)	74 (9.2)	1.19 (0.2)	97 (71)	2 (2)	0.1	2
Interior: Waters between 0 and 1,100 db minus Ekman	-18.37 (3.43)	-0.476 (0.074)	65.6 (4.4)	0.86 (0.09)	-453 (76)	-18 (1.5)	-12	-6
Waters between 1,100 and 3,000 db	-12.25 (2.26)	0.004 (0.052)	16.7 (1.52)	0.38 (0.03)	-77 (17)	-2 (0.4)	0	-2
Waters between 3,000 and 5,000 db	-6.45 (2.82)	0.477 (0.059)	4.4 (1.18)	0.11 (0.03)	-10 (4)	0.6 (0.1)	0.8	-0.3
Total					191 (79)	-0.4 (2)	-11	11
Horizontal	0 (0)	0 (0)			-114 (20)	5 (0.4)	0	5
Overturning	17.21 (4.13)	-0.55 (0.09)			312 (88)	-6 (2)	-10	4

Section average  $C_{anth}$  concentration: 14.7  $\mu\text{mol kg}^{-1}$  in 2004 to 17.1  $\mu\text{mol kg}^{-1}$  in 2012

405 Table 2. Averages and trends for different components of  $C_{\text{anth}}$  transports, volume transports, and  
406 transport-weighted anthropogenic carbon concentrations with associated standard deviation /  
407 standard error estimates, and their contribution to  $C_{\text{anth}}$  transport trends.

408 Transport-weighted  $C_{\text{anth}}$  concentrations are calculated by dividing the  $C_{\text{anth}}$  transport by the  
409 volume transport. Volume transport values come from ref <sup>23</sup>. The interior relates to the ocean  
410 east of the Bahamas (essentially all transport excluding Florida Straits). 1000 TgC = 1 PgC.

411

412

413 METHODS

414 **Hydrographic Data.** Dissolved inorganic carbon (DIC), total alkalinity, oxygen, dissolved  
415 inorganic nutrients [nitrate, phosphate, silicate], CFC-12 and salinity from bottle samples  
416 combined with temperature and pressure data from CTD sensors were used from repeat cruises at  
417 24.5°N in 1992<sup>14,36</sup>, 1998<sup>13</sup>, 2004<sup>37</sup>, 2010<sup>38</sup> and 2011<sup>39</sup> and across the Florida Straits in 2012<sup>40</sup>.  
418 Data consistency was ensured by comparing with historical data as part of GLODAPv2.2019<sup>41</sup>;  
419 all adjustments identified were applied.  $C_{\text{anth}}$  was calculated for each bottle using four techniques  
420 ( $\phi\text{CT}_o$ <sup>42</sup>, TrOCA<sup>43</sup>,  $\Delta C^*$ <sup>44</sup>, Transit Time Distributions-TTD<sup>45</sup>) following established methods<sup>39</sup>.  
421 Although its representativeness is questioned<sup>46</sup> TrOCA was included to enable comparison with  
422 previous studies<sup>9,39,42</sup>.

423

424 Mixed layer bottle locations (density within  $\sigma_\theta = 0.03 \text{ kg m}^{-3}$  of the surface<sup>47</sup>) were treated  
425 separately as here traditional techniques struggle to quantify  $C_{\text{anth}}$  and its seasonal cycle - either  
426 relationships between nutrient utilisation, remineralisation and oxygen concentrations (used  
427 within back-calculation methods) break down, or the behaviour of CFCs and  $\text{CO}_2$  (used by TTD  
428 and  $\Delta C^*$  methods) decouple<sup>48</sup> due to their saturation state being dependent on distinct processes  
429 (for example, temperature (both), biology and  $R_f$  (carbon only)). Mixed layer  $C_{\text{anth}}$  was therefore  
430 calculated using a new method: SPIDEr (Scaled Pre-industrial DisEquilibrium).

431

432 **SPIDEr method for mixed layer anthropogenic carbon.** This circumvents/corrects a number  
433 of assumptions inherent in many  $C_{\text{anth}}$  methods (for example, constant pre-industrial seasonal  
434 atmospheric  $\text{CO}_2$  concentration,  $\text{CO}_2$  disequilibrium unchanged from pre-industrial era, oxygen  
435 at 100% saturation). Extended Data Figure 4 summarizes the calculation pathway applied to

436 individual 4°latitude x 5° longitude boxes between 24-28°N and 78-12°W, and an additional  
437 Florida Straits box (25-27°N, 80.2-79.3°W). It involves the following:

- 438 1. Calculate regional seasonal cycles in sea surface pCO<sub>2</sub> disequilibrium from modern  
439 observations: following ref<sup>49</sup>, historical observations of contemporary sea surface fCO<sub>2</sub> are from  
440 the Surface Ocean Carbon Dioxide Atlas (SOCAT) database<sup>50</sup> and temporally coincident  
441 observations of the dry mole fraction of atmospheric CO<sub>2</sub> (XCO<sub>2</sub>) are from ref. <sup>51</sup>; both were  
442 converted to pCO<sub>2</sub><sup>52</sup> using in situ temperature and NCEP local sea-level atmospheric pressure  
443 fields<sup>53</sup> to generate regionally-specific ΔpCO<sub>2</sub> time series. Mean annual ΔpCO<sub>2</sub> cycles were  
444 calculated by Fourier analysis; their removal from the sea surface timeseries revealed no  
445 significant trend between 2002-2012; the mean ΔpCO<sub>2</sub> cycle (winter-spring undersaturation,  
446 summer-fall oversaturation) was therefore considered representative of the observational period.
- 447 2. Adjust seasonal ΔpCO<sub>2</sub> cycles to pre-industrial era by estimating the difference between the  
448 impact of physical (temperature/salinity) and biological (nutrient) changes on modern and pre-  
449 industrial carbon concentrations. Spring-to-fall changes in temperature/salinity were calculated  
450 from climatological data<sup>54</sup> and applied to annual mean climatological chemical properties (DIC,  
451 alkalinity, salinity, nutrients<sup>54</sup>) using CO2SYS<sup>55</sup> to propagate their impact on ΔpCO<sub>2</sub>. The impact  
452 of biological activity was estimated using winter-to-summer changes in phosphate converted to  
453 ΔDIC using a C/P stoichiometric ratio of 117 following the ‘ΔC\*’ C<sub>anth</sub> method – this integrative  
454 C/P estimate has been successfully applied in the Atlantic and globally to derive C<sub>anth</sub> fields and  
455 enhance intercomparison of studies<sup>4,29,56</sup>, but likely underestimates true system variability<sup>57</sup>;  
456 ΔDIC was then applied to annual mean climatological chemical properties (temperature,  
457 alkalinity, salinity<sup>54</sup>) using CO2SYS<sup>55</sup> to calculate biologically-mediated ΔpCO<sub>2</sub>. Both steps  
458 were repeated for a pre-industrial scenario by removing the mean annual C<sub>anth</sub> signal (calculated

459 using the  $\phi_{CT_0}$  method applied to climatological data) from contemporary DIC levels; changes  
460 in pre-industrial  $pCO_2$  caused by temperature or biological activity were 69-72% of the change in  
461  $pCO_2$  observed at contemporary DIC levels.

462 3. Combine pre-industrial  $\Delta pCO_2$  seasonal cycles with estimated pre-industrial atmospheric  $CO_2$   
463 seasonal cycles to generate  $4^\circ$ latitude  $\times$   $5^\circ$  longitude box-specific pre-industrial seawater  $pCO_2$   
464 cycles. Pre-industrial atmospheric  $CO_2$  is calculated from modern GLOBALVIEW- $CO_2$   
465 atmospheric  $CO_2$ <sup>51</sup> combined with NCEP/NCAR temperature and sea level pressure fields<sup>53</sup> and  
466 deconvolved into a long-term atmospheric  $C_{anth}$  increase and a seasonally variable natural  
467 background signal.

468 4. Using in situ alkalinity and nutrients (assumed unaffected by anthropogenic  $CO_2$  invasion)  
469 with pre-industrial  $pCO_2$  at the time of year of the modern measurements, calculate the water  
470 sample's pre-industrial DIC.

471 5. The residual between pre-industrial and contemporary DIC concentrations is  $C_{anth}$ .

472

473 **RAPID-MOCHA-WBTS-Argo array data.** Ten-day temperature and salinity fields across  
474  $26.5^\circ N$ <sup>26</sup> were used to calculate volume transports and ten-day  $C_{anth}$  fields. For the upper 1,760  
475 dbar,  $0.25^\circ$  longitude  $\times$  20 dbar grids of temperature and salinity are generated every 10 days by  
476 optimal interpolation of data from Argo floats and moored sensors; below 1,760 dbar, salinity  
477 and temperature fields are linearly interpolated between moored sensors on the boundaries, with  
478 regions deeper than the moorings accounted for by extrapolation based on repeat hydrography  
479 abyssal structure. Volume transports were calculated by combining horizontal velocities from the  
480 gridded fields with circulation elements in the RAPID overturning calculation<sup>21</sup>. The UK-US  
481 RAPID array (Fig. 1) uses submarine-cable-based transport estimates through the Florida Straits

482 at 27°N<sup>58</sup>, ERA-Interim wind derived estimates of Ekman transport<sup>59</sup> and ocean interior transport  
483 estimates from moored data. The calculations generate a net volume (or freshwater) transport of  
484 1.17 Sv southward across 26.5°N on the basis of a salinity flux constraint at the Bering Strait <sup>26</sup>.

485

#### 486 **Predictive regression equations (PREs) for C<sub>anth</sub>.**

487 For each C<sub>anth</sub> method, C<sub>anth</sub> is determined for all available hydrographic bottle data prior to  
488 recalculating mixed layer values according to the SPIDeR approach. Linear C<sub>anth</sub> growth rates  
489 were calculated in six isopycnal intervals (uNACW:  $\sigma_0 < 26.7 \text{ kg m}^{-3}$ , INACW:  $26.7 \text{ kg m}^{-3} < \sigma_0 < 27.2 \text{ kg m}^{-3}$ , AAIW:  $27.2 \text{ kg m}^{-3} < \sigma_0 < 27.6 \text{ kg m}^{-3}$ , uNADW:  $\sigma_0 > 27.6 \text{ kg m}^{-3}$  and  $\sigma_2 < 37 \text{ kg m}^{-3}$ , INADW:  $\sigma_2 > 37 \text{ kg m}^{-3}$  and  $\sigma_4 < 45.9 \text{ kg m}^{-3}$ , AABW:  $\sigma_4 > 45.9 \text{ kg m}^{-3}$ ) in five longitude  
491 ranges (Florida Straits, 78-70°W, 70-46°W, 46-30°W, 30-10°W)<sup>39</sup>, and used to normalise all  
492 C<sub>anth</sub> data to a mid-year of 2002.5. As the constituent data are from multiple seasons, the pooled  
493 normalised data cover a greater parameter range than individual hydrographic cruises,  
494 particularly in surface waters. Predictive regression equations (PREs) are generated by applying  
495 multiple linear regressions of the normalised C<sub>anth</sub> according to  $\text{normC}_{\text{anth}} = a*\theta + b*\text{Sal} + c*\text{pres} + d*\text{lon} + y^0$ , where a-d are predictive coefficients, ‘ $\theta$ ’ is potential temperature, ‘Sal’ is salinity,  
496 ‘pres’ is pressure, ‘lon’ is longitude and ‘ $y^0$ ’ is a constant. Individual PREs are generated for  
497 each isopycnal-regional box as in Extended Data Fig. 1, with outliers identified using a 3x mean  
498 Cook’s Distance discriminating threshold and removed prior to rerunning. Extended Data Table  
499 1 shows PRE coefficients for the  $\Delta C^*$  C<sub>anth</sub> method. PRE root-mean-square errors (Extended  
500 Data Fig. 1b) are largest (but lowest relative to signal size) in surface layers where C<sub>anth</sub> loadings  
501 and seasonal variability are highest, but are generally at or below C<sub>anth</sub> estimation uncertainty (~6  
502  $\mu\text{mol kg}^{-1}$ ). PRE goodness-of-fit (Extended Data Fig. 1c) shows greater variability, and  
503  
504



505 highlights where either the predictive parameter is insufficiently covered by available  
506 measurements, or where the predictive parameters do not co-vary sufficiently with  $C_{\text{anth}}$ . PREs  
507 perform less well where  $C_{\text{anth}}$  levels change quickly with depth but temperature and salinity do  
508 not (typically ~800-1800 dbar, associated with  $C_{\text{anth}}$  minimum and maximum of Antarctic  
509 Intermediate Water and upper North Atlantic Deep Water respectively). PRE residuals are  
510 normally distributed about zero with no apparent vertical or spatial structure (Extended Data Fig.  
511 2). However, PRE goodness-of-fit plots (Extended Data Fig. 3) display a general trend of  
512 regressions over(under)-estimating lower (higher) concentrations; that is estimated values tend  
513 towards the isopycnic/regional box mean. The variability in available predictive parameter space  
514 (temperature, salinity, pressure, longitude) thus does not fully describe  $C_{\text{anth}}$  variability, but on a  
515 regional box basis uncertainties will likely cancel and errors in predicted values tend towards the  
516 regional  $C_{\text{anth}}$  mean. For all methods, analyses of standardized (Z-score) predictors identify  
517 salinity as the most important predictor variable, except in the upper layers away from the  
518 western boundary where temperature and pressure have similar influence.

519

520 **Ten-day estimates of  $C_{\text{anth}}$ .** For each ten-day period between spring 2004 and fall 2012, the  
521 predictive regressions are applied to temperature and salinity fields<sup>26</sup> derived from RAPID  
522 mooring / Argo float data (binned according to Extended Data Fig. 1a criteria) to estimate  $C_{\text{anth}}$ .  
523 The mixed layer is defined as the maximum mixed layer depth (MLD, determined using density  
524 within  $\sigma_{\theta} = 0.03 \text{ kg m}^{-3}$  of the surface<sup>47</sup>) from the preceding winter – ensuring that winter waters  
525 temporarily isolated from atmospheric interaction during summer are still described by the same  
526 regression equation as the waters above, rather than falling within the bin below. Predicted  
527 surface layer  $C_{\text{anth}}$  (Extended Data Fig. 5 for 2009, 63.375°W) shows highest concentrations (late

528 summer/early fall) associated with potential temperature maxima and neutral density,  $R_f$  and  
529 MLD minima. The  $C_{anth}$  signal is diluted as cooling drives stratification breakdown, reaching a  
530 spring minimum as MLD (and  $R_f$ ) peaks. Pooled together, ten-day estimates of time-independent  
531  $C_{anth}$  (normalized to 2002.5) are created. For each time-point  $\Delta C_{anth}$  growth rates are  
532 reintroduced, using identical linear trends that normalized the original data set, generating final  
533  $C_{anth}$  estimates reflective of the 2004-2012 time period.

534

535  **$C_{anth}$  transports across 26.5°N.** Ten-day  $C_{anth}$  and velocity fields are combined according to  
536  $T_{(C_{anth})} = \iint v C_{anth} dx dz$ , where the  $C_{anth}$  transport,  $T_{(C_{anth})}$ , is given by the horizontal (x) and vertical  
537 (z) integral of the  $C_{anth}$  field multiplied by the velocity field  $v^{17}$ . The overturning transport  
538 component  $T^o_{(C_{anth})}$  is calculated as  $T^o_{(C_{anth})} = \int \langle v \rangle \langle C_{anth} \rangle dz$ , where zonally-averaged fields of  
539 anthropogenic carbon  $\langle C_{anth} \rangle$  and velocity  $\langle v \rangle$  with section average removed are combined and  
540 vertically integrated (z) across the full section. The horizontal transport component  $T^h_{(C_{anth})}$   
541 meanwhile is calculated as  $T^h_{(C_{anth})} = \iint v' C_{anth}' dx dz$ , and is the horizontal (x) and vertical (z)  
542 integral of the combination of the deviation from the zonal-mean anthropogenic carbon  $C_{anth}'$  and  
543 velocity  $v'$  fields. The throughflow component  $T^f_{(C_{anth})}$  is calculated as  $T^f_{(C_{anth})} = T^f(C_{anth}^{(26.5N)} -$   
544  $C_{anth}^{(BS)})$  where  $C_{anth}'$  is the zonal-mean field for  $C_{anth}$  at 26.5°N (calculated here) and Bering  
545 Strait (BS, from ref <sup>15</sup>) and  $T^f$  is the net volume throughflow transport. The Florida Straits are  
546 treated separately; here,  $C_{anth}$  (including updated mixed layer  $C_{anth}$  estimates) from hydrographic  
547 sections in 2004, 2010 and 2012 (US GOMECC<sup>40</sup>) are combined with volume transport  
548 estimates derived from hydrographic CTD profiles. Transport-weighted  $C_{anth}$  estimates are used  
549 to create temporally predictive regressions (Extended Data Fig. 6a) that are applied to the high-  
550 frequency time series of subsea-cable-derived volume-transport estimates. Combining Florida

551 Straits  $C_{\text{anth}}$  transports with ocean interior analogues yields ten-day  $C_{\text{anth}}$  transports across 26.5°N  
552 (Extended Data Fig. 6b,c). All  $C_{\text{anth}}$  methods show small, temporally consistent systematic  
553 offsets from each other. These are due to slight differences in mean surface-to-depth  $C_{\text{anth}}$   
554 gradients caused by the differing methodological assumptions of each technique. The TTD  
555 method is an exception; its offset changes with time, resulting from using CFC-12 alone to  
556 estimate mean water mass age. Decreasing atmospheric CFC-12 levels since ~2000 inhibit its  
557 ability to fully characterise the ventilation of the youngest waters, but it is the only transient  
558 tracer to have been measured on all hydrographic cruises with carbon data.

559

560 **Uncertainties in  $C_{\text{anth}}$  transport estimates from observations.** Following the approach used  
561 for salinity and freshwater transports across 26.5°N<sup>26</sup> the uncertainty of individual ten-day  
562 normalized  $C_{\text{anth}}$  transport estimates is calculated by estimating and combining  $C_{\text{anth}}$ -derived  
563 uncertainty ( $\sigma_{\text{CT}_C}$ ) and transport-derived uncertainty ( $\sigma_{\text{CT}_T}$ ). The uncertainty associated with  
564 both initial estimates of  $C_{\text{anth}}$  and the linear trends in  $C_{\text{anth}}$  (treated independently in the full  
565 section and Florida Straits) is then also assessed. The two combine to generate final  $C_{\text{anth}}$   
566 transport uncertainties. For each subregion,  $\sigma_{\text{CT}_C}$  is calculated by combining the uncertainty in  
567  $C_{\text{anth}}$  concentrations ( $\sigma_{C_{\text{reg}}}$ ) with the average volume transport ( $T_{\text{reg}}$ ). The transport-derived  
568 uncertainty is calculated by combining the subregional transport uncertainty  $\sigma_{\text{CT}_T}$  and the  $C_{\text{anth}}$   
569 anomaly ( $C_{\text{reg}} - C_{\text{sect}}$ ) where the  $C_{\text{anth}}$  section average is 19.2  $\mu\text{mol kg}^{-1}$ . Uncertainties were  
570 calculated for individual regional water masses, the Bering Strait, the Ekman layer, and the  
571 Florida Straits<sup>26</sup> (Extended Data Table 2). Uncertainty relating to input  $C_{\text{anth}}$  fields and  $\Delta C_{\text{anth}}$   
572 trends was calculated by a Monte-Carlo approach: individual systematic offsets randomly  
573 derived from a normal distribution of twice the estimation uncertainty (6  $\mu\text{mol kg}^{-1}$ ) were applied

574 to each input hydrographic cruise dataset while similar offsets were applied to trends, randomly-  
575 derived from within the trend uncertainties<sup>39</sup>. The average standard deviation of 600 individual  
576 estimates at each timepoint gave an uncertainty of 0.037 PgC yr<sup>-1</sup>. Combining all the above  
577 uncertainties in quadrature generates an estimate of the total uncertainty for each ten-day C<sub>anth</sub>  
578 transport estimate of 0.135 PgC yr<sup>-1</sup>. If it is assumed that within a year there can be 12  
579 independent estimates of the C<sub>anth</sub> transport, then uncertainty in the annual average C<sub>anth</sub> transport  
580 is  $0.135 / (12)^{1/2} = 0.039$  PgC yr<sup>-1</sup>. For the 8.5-year time series there are then 102 independent  
581 estimates of the C<sub>anth</sub> transport, meaning the uncertainty of the full time series average C<sub>anth</sub>  
582 transport is  $0.135 / (102)^{1/2} = 0.0134$  PgC yr<sup>-1</sup>.

583

#### 584 **Uncertainties from surface C<sub>anth</sub> seasonality calculation**

585 The impact of not accounting for seasonality in surface C<sub>anth</sub> concentrations was investigated by  
586 propagating three additional surface C<sub>anth</sub> estimates to that described in the preceding section  
587 through the C<sub>anth</sub> transport calculation: (1) using unadjusted raw bottle C<sub>anth</sub> estimates; (2)  
588 assuming C<sub>anth</sub> to be 100% saturated at all times; (3) applying SPIDeR (Extended Data Figure 4),  
589 but assuming modern and pre-industrial ΔpCO<sub>2</sub> cycles are identical. For (1) the C<sub>anth</sub> seasonal  
590 cycle amplitude was ~3x larger than any other application (and implausible through what we  
591 know of sea-surface CO<sub>2</sub> flux dynamics); much higher C<sub>anth</sub> concentrations for ~9-10 months of  
592 the year, resulted in elevated Ekman, horizontal and total C<sub>anth</sub> transports (with full time series  
593 average ~15% higher) and exaggerated seasonal cycles in each. A negligible horizontal transport  
594 trend led to the total C<sub>anth</sub> transport trend becoming negative. For cases (2) and (3), a reversed  
595 seasonal cycle resulted: C<sub>anth</sub> highest (lowest) in winter (summer), the opposite to that expected  
596 from R<sub>f</sub> variability<sup>5,54</sup>. In (2), a greatly reduced west-to-east gradient in C<sub>anth</sub> concentrations

597 resulted, leading to reduced southward horizontal circulation and a total transport average ~12%  
598 higher than that presented here. In (3), a west-to-east concentration gradient was maintained but  
599 at systematically higher concentrations; this generated stronger  $C_{\text{anth}}$  overturning and horizontal  
600 components but to differing extents, causing a net decrease in the average total  $C_{\text{anth}}$  transport of  
601 ~4% compared to results presented here. Failing to account for seasonality in  $\text{CO}_2$  disequilibria  
602 and  $C_{\text{anth}}$  can therefore generate inverted seasonal cycles, and unfeasible concentration ranges  
603 and longitudinal gradients. These subsequently affect calculated Ekman, horizontal, overturning  
604 and total  $C_{\text{anth}}$  transports and their trends, and may be a factor in previous hydrographic section-  
605 derived  $C_{\text{anth}}$  transport estimates.

606 **Uncertainties in  $C_{\text{anth}}$  transport estimates from PRE and  $C_{\text{anth}}$  methodologies.** We test the  
607 robustness and appropriateness of the PRE method using an analysis of model data where model  
608  $C_{\text{anth}}$  truth is known. We use monthly fields from the 1° NEMOv3.2 ocean model with the  
609 MEDUSA-2 marine biogeochemistry model embedded (for example, ref. 60), between 1980 and  
610 2100 across 26.5°N. Model truth  $C_{\text{anth}}$  was calculated as the residual of parallel runs (with  
611 atmospheric growth of carbon and climate change effects at RCP8.5, and without), and combined  
612 with directly output velocity fields to give  $C_{\text{anth}}$  transports for 2004-2013 of  $0.223 \pm 0.061$  PgC  
613  $\text{yr}^{-1}$  (mean  $\pm$  standard deviation of monthly values). PRE-predicted  $C_{\text{anth}}$  fields (estimated using  
614 PRE methodology applied to model truth  $C_{\text{anth}}$ , temperature, pressure, salinity outputs as for  
615 observations) were combined with the same velocity fields, enabling direct comparison with  
616 model truth  $C_{\text{anth}}$  transports (Extended Data Fig. 7). Within this, several experiments were  
617 conducted, adjusting PRE data and trend inputs/treatments additively, to quantify the  
618 contributions of individual PRE methodological assumptions and their impact on the overall  
619 uncertainty in  $C_{\text{anth}}$  transport estimates. These were: (1) PRE method applied as for observations,

620 using same vertical data resolution (~20 data points per station), input data timepoints (one  
621 month each from 1992-1998-2004-2010-2011), identical longitudinal/isopycnal boxes optimised  
622 to observational hydrographic distributions, and assuming linear  $\Delta C_{\text{anth}}$  trends; (2) PRE regions  
623 optimised to model hydrographic distributions/transport fields (these differed substantially from  
624 observations due to low model resolution); (3) PRE training data extended to cover all months of  
625 years 1992-1998-2004-2010-2011; (4) non-linear  $\Delta C_{\text{anth}}$  trends; and (5) increased vertical data  
626 resolution (~60 data points per station). Iteration (1) resulted in a 2004-2013  $C_{\text{anth}}$  transport mean  
627  $\pm$  standard deviation of  $0.234 \pm 0.059 \text{ PgC yr}^{-1}$ , a net residual from the model truth of 5% ( $0.011$   
628  $\text{PgC yr}^{-1}$ ), with essentially identical monthly variability. Approximately 35% of the residual from  
629 model truth was explicable by insufficient vertical data resolution, ~23% by the assumption of  
630 linear  $C_{\text{anth}}$  growth rates, and the remainder due to PRE regions being poorly optimised to local  
631 hydrographic/transport fields. Iteration (2) was most faithful to the method's application to  
632 observations, and gave a 2004-2013 mean  $\pm$  standard deviation of  $0.229 \pm 0.061 \text{ PgC yr}^{-1}$ , a  
633 2.9% residual from model truth ( $0.223 \pm 0.061 \text{ PgC yr}^{-1}$ ). Individual monthly transport estimates  
634 had an average absolute residual of 4%, with best estimates in May-June (average 1.6%  
635 difference), poorest in September-October (average ~8.5% difference). Iteration (5) is considered  
636 the best estimate of the abilities of the PRE method; for 2004-2013 it reduced the mean to within  
637 1% of model truth, and average absolute residuals of monthly estimates to 2.5%. This underlines  
638 the suitability of the PRE methodology in estimating the magnitude of  $C_{\text{anth}}$  transports over  
639 multiple timescales, and application to observational datasets.

640 'Back-calculation'  $C_{\text{anth}}$  estimation methods have been widely used to quantify the accumulation  
641 of  $C_{\text{anth}}$  in the oceans<sup>e.g.4,5,9,13–15,17,37,39,42–44,56,61,62</sup>, and we applied three derivations based on  
642 biogeochemical parameters to observations. Of these we applied the  $\Delta C^*$  method<sup>44</sup> to model

643 outputs to test its effectiveness in estimating  $C_{\text{anth}}$  distributions and  $C_{\text{anth}}$  transport variability and  
644 magnitude compared to model truth. Ref<sup>44</sup> was followed for the calculation of ‘ $\Delta C^*$ ’, but using  
645 alternative parameterizations for preformed alkalinity<sup>63</sup> and preformed pre-industrial DIC<sup>62</sup>. The  
646 disequilibrium term was determined from ‘ $\Delta C^*$ ’ derived from the model control run (with a pre-  
647 industrial atmosphere).  $C_{\text{anth}}$  estimates were combined with model velocity fields and the  
648 resultant  $C_{\text{anth}}$  transports compared to model truth (Extended Data Fig. 8). A correlation of 0.97  
649 between the two time series occurred with an average residual of  $2.2 \times 10^{-4}$  PgC yr<sup>-1</sup> (0.5%) for  
650 the 2004-2013 period. Individual monthly transport estimates had mean absolute residuals of  
651 7.2%, and annual average absolute differences of 0.010 PgC yr<sup>-1</sup> (4.5%). These differences are  
652 small, predominantly caused by control run ‘ $\Delta C^*$ ’ drift and deficiencies in the model’s  
653 biogeochemical fields that impact the use of observation-based parameterizations (for example  
654 preformed alkalinity). Together, the estimates indicate that the back-calculation is useful for  
655 estimating  $C_{\text{anth}}$ .  
656

657

## 658 DATA SOURCES

659 Raw hydrographic datasets are at <https://cchdo.ucsd.edu/>. Final adjusted hydrographic datasets  
660 are available from GLODAP (<https://www.glodap.info/>). AMOC estimates are available from  
661 the RAPID programme website (<https://www.rapid.ac.uk/>).

662 Atmospheric CO<sub>2</sub> is available from the GLOBALVIEW-CO<sub>2</sub> web resources (GLOBALVIEW-  
663 CO<sub>2</sub>. Cooperative Atmospheric Data Integration Project - Carbon Dioxide; NOAA ESRL,  
664 Boulder, Colorado; Also available on Internet via anonymous FTP to ftp.cmdl.noaa.gov, Path:  
665 ccg/co2/GLOBALVIEW). Sea surface pCO<sub>2</sub> observations are from the Surface Ocean Carbon  
666 Dioxide Atlas SOCAT: <https://www.socat.info/>. NCEP/NCAR temperature and sea level  
667 pressure fields are available from  
668 <https://psl.noaa.gov/data/gridded/data.ncep.reanalysis.surface.html>.

669

## 670 DATA AVAILABILITY

671 The carbon transport data that support the findings of this study are available from the British  
672 Oceanographic Data Centre (<https://www.bodc.ac.uk/>) at  
673 [https://www.bodc.ac.uk/data/published\\_data\\_library/catalogue/10.5285/b6bb9f45-f562-68a4-  
674 e053-6c86abc0e48b/](https://www.bodc.ac.uk/data/published_data_library/catalogue/10.5285/b6bb9f45-f562-68a4-e053-6c86abc0e48b/). The doi of this dataset is 10.5285/b6bb9f45-f562-68a4-e053-  
675 6c86abc0e48b, and the data citation is : Brown P.J., McDonagh E., Sanders R., Watson A.J.,  
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680 Environment Research Council, UK. doi: 10/fn4j. The dataset will also be accessible from the  
681 RAPID-Atlantic Biogeochemical Fluxes programme webpage (<http://www.rapid.ac.uk/abc>).  
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755

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## EXTENDED DATA LEGENDS

758

**Extended Data Figure 1. PRE regions and performance statistics.** (a) Data bin locations for

759

generation of independent predictive multiple linear regressions for  $C_{\text{anth}}$  estimation, (b)

760

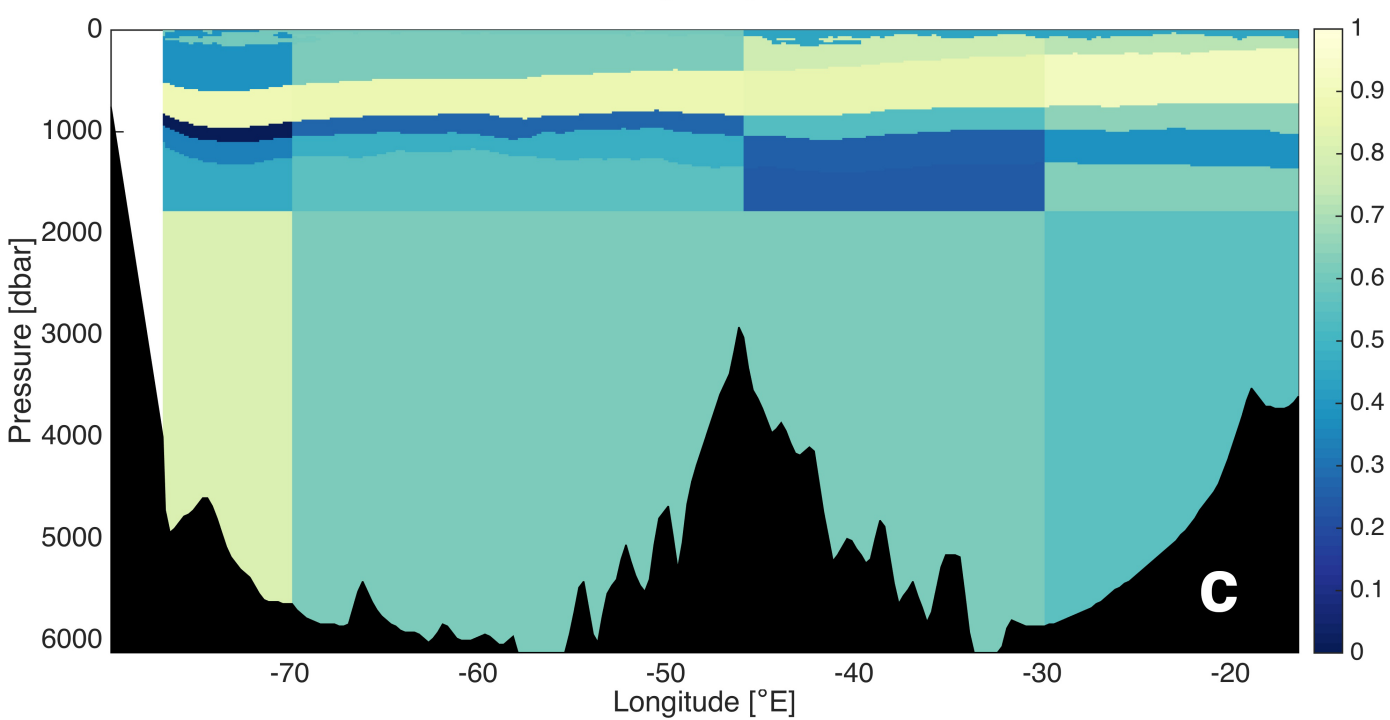
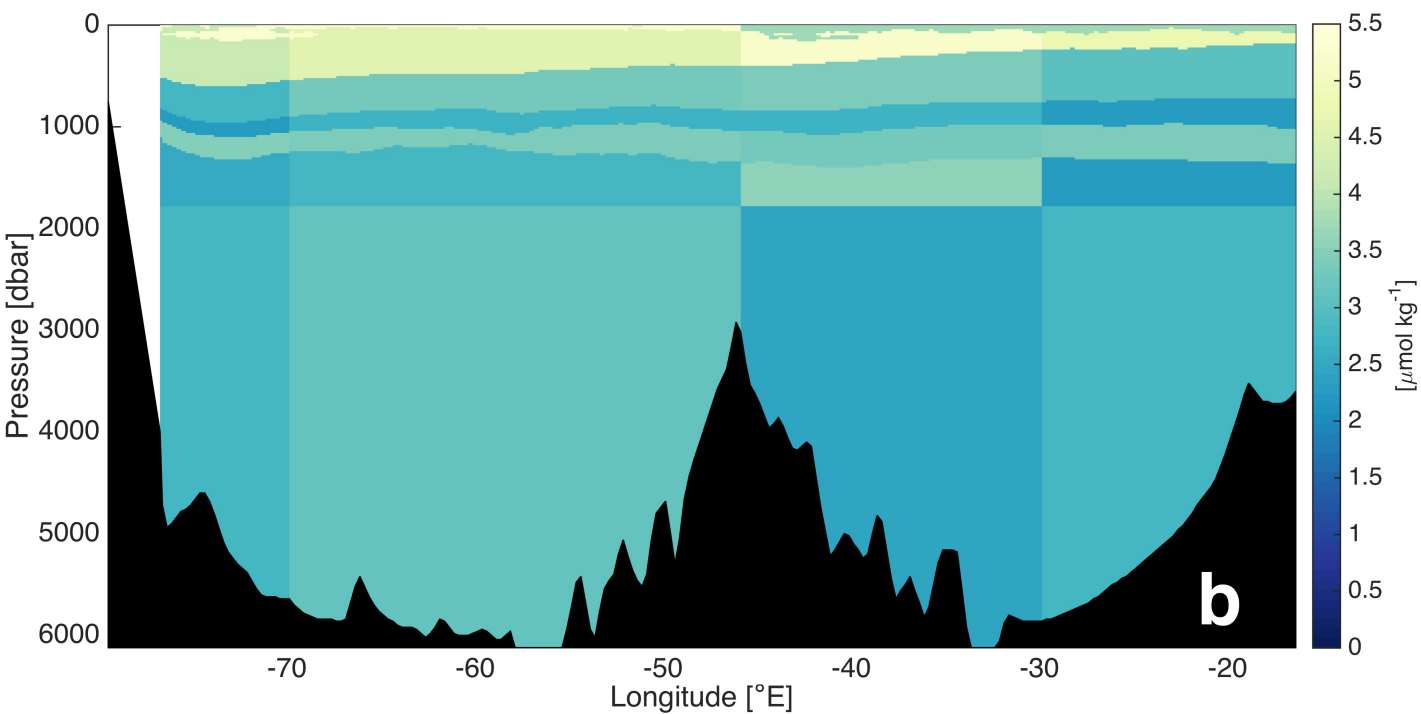
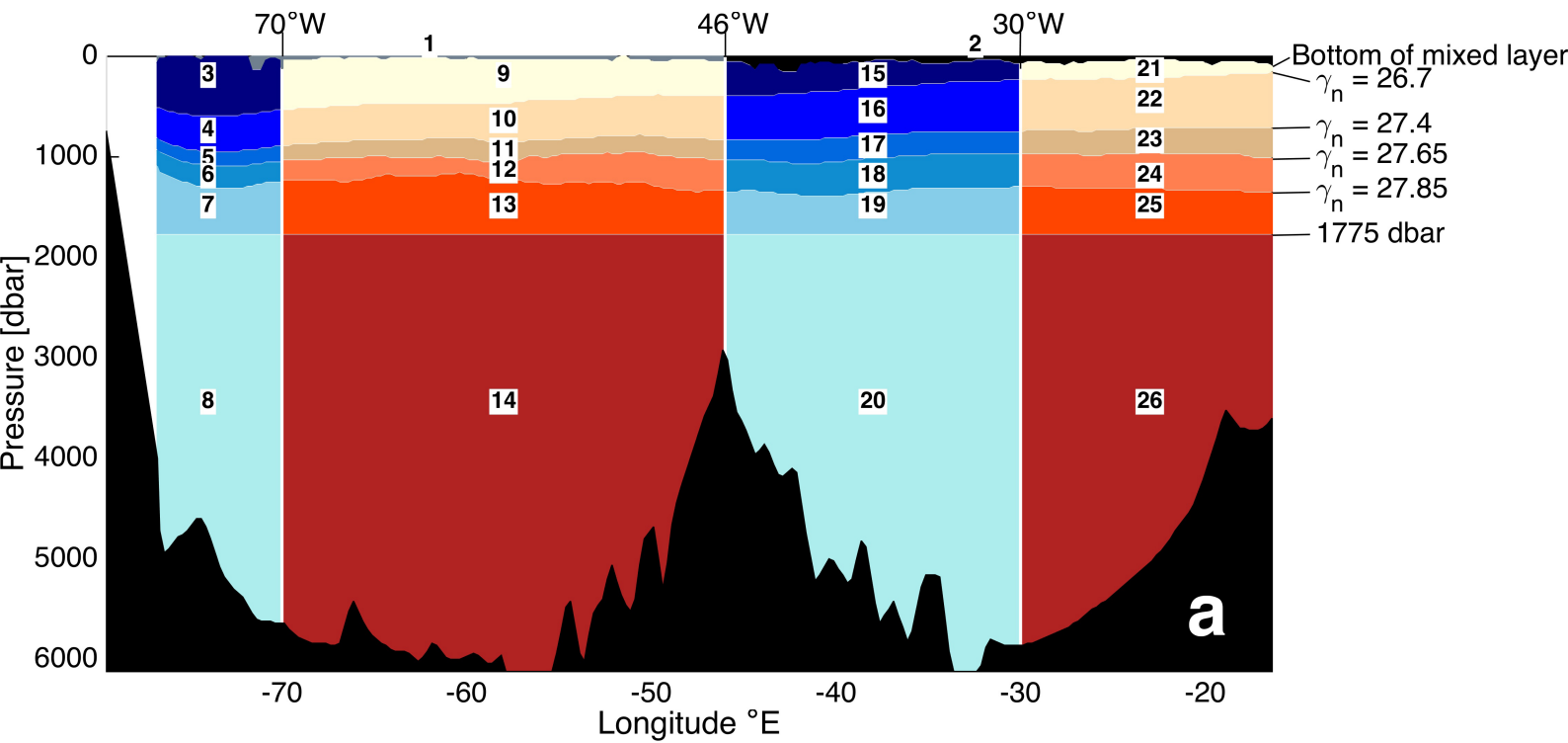
individual predictive PRE root mean square error, and (c), individual predictive PRE  $R^2$  for each

761

data bin for  $\Delta C^* C_{\text{anth}}$ . Box colors and numbers relate to Extended Figures 3 & 4.

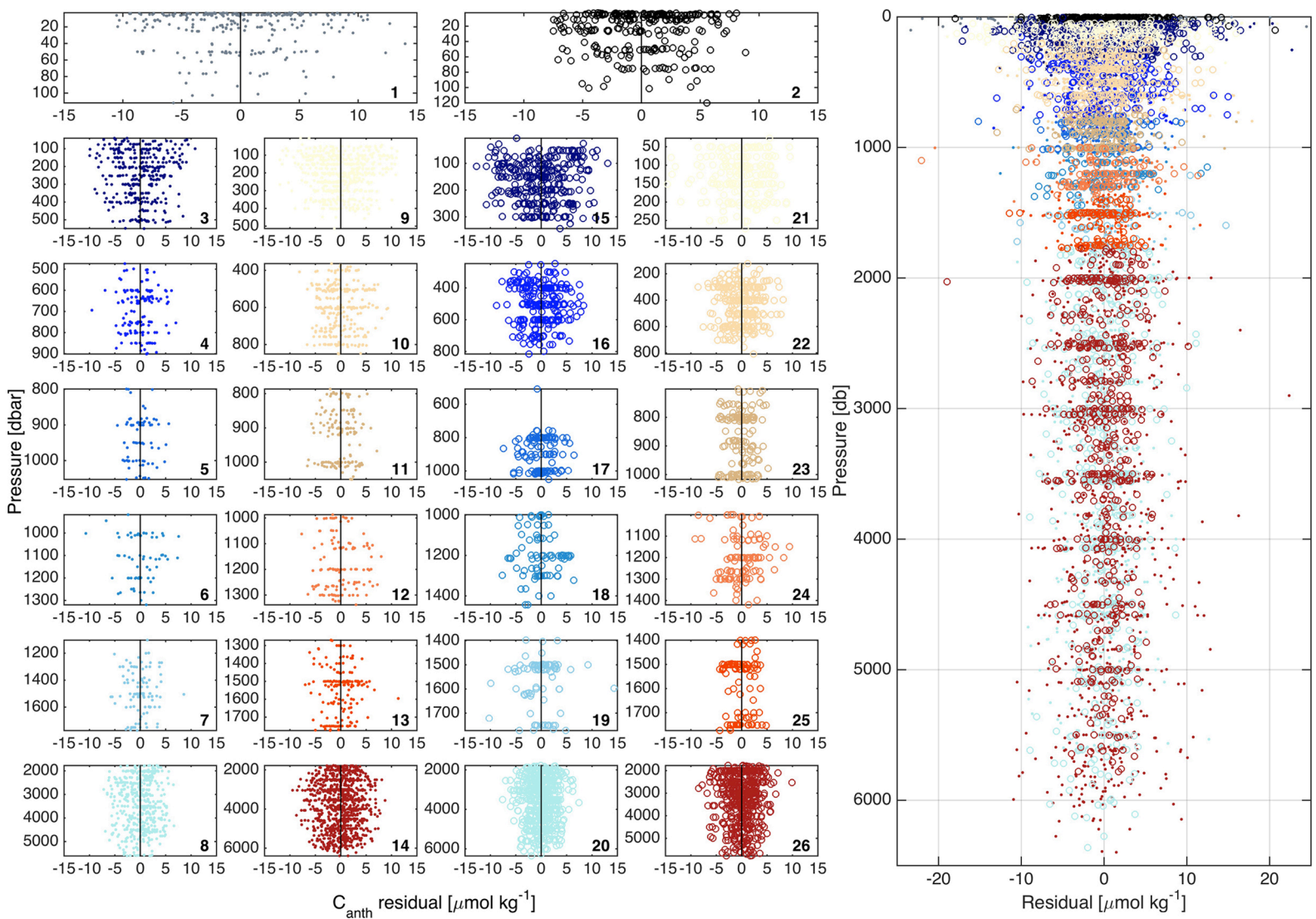
762

763

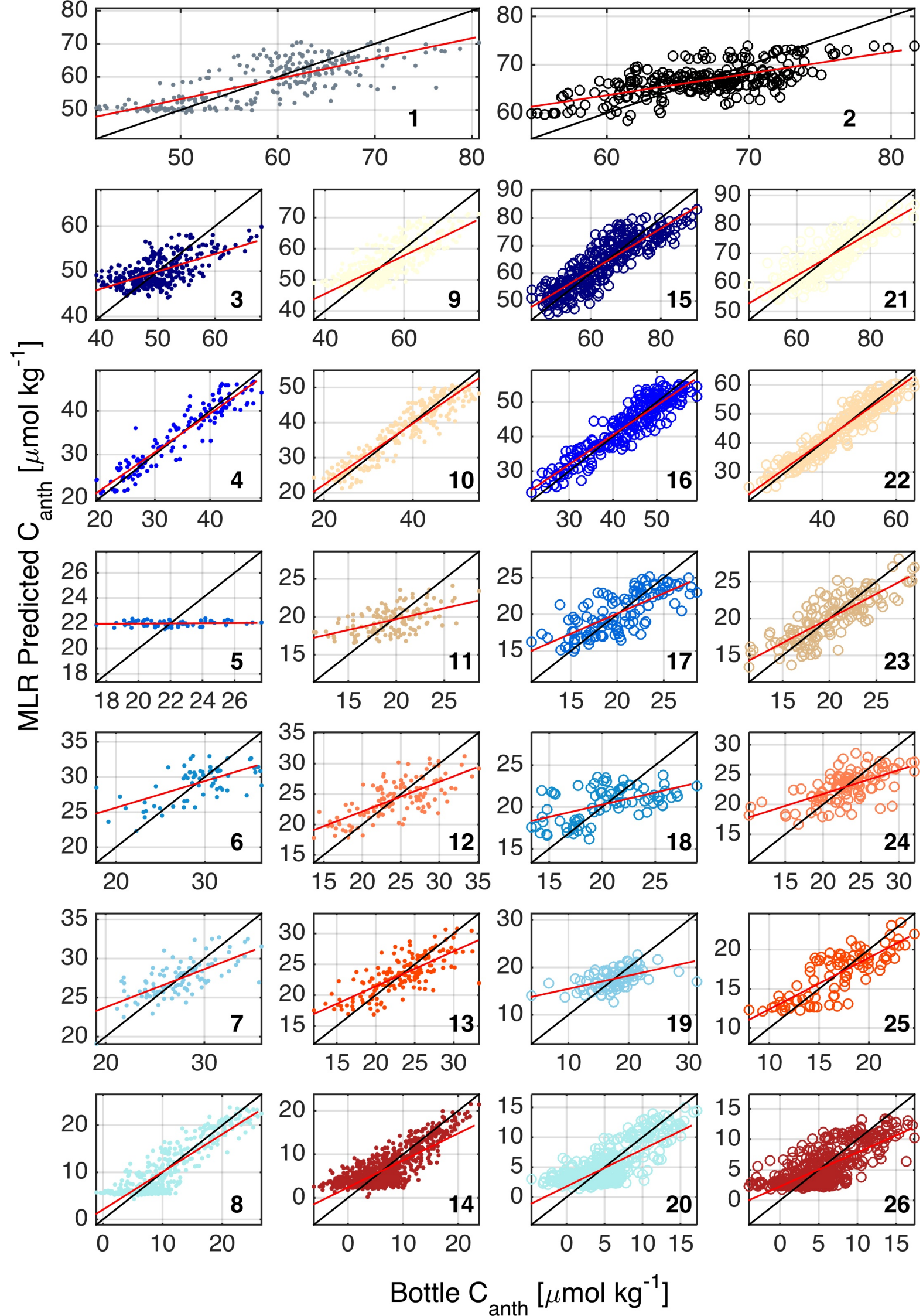


764 **Extended Data Figure 2. PRE residuals (predicted  $C_{\text{anth}}$  – bottle  $C_{\text{anth}}$ ) plotted against**  
765 **depth. a**, for individual PREs, **b**, for all outputs binned, for  $\Delta C^* C_{\text{anth}}$ . Numbers and colors relate  
766 to regions in Extended Data Figure 1a. Dots relate to Western basin, circles to Eastern basin  
767  
768





769 **Extended Data Figure 3. Bottle  $C_{\text{anth}}$  estimates versus PRE predicted  $C_{\text{anth}}$  for  $\Delta C^* C_{\text{anth}}$ .**  
770 Numbers and colors relate to regions in Extended Data Figure 1a. Black lines indicate unity. Red  
771 lines indicate linear least squares fit of bottle estimates versus predicted. Dots relate to Western  
772 basin, circles to Eastern basin  
773  
774



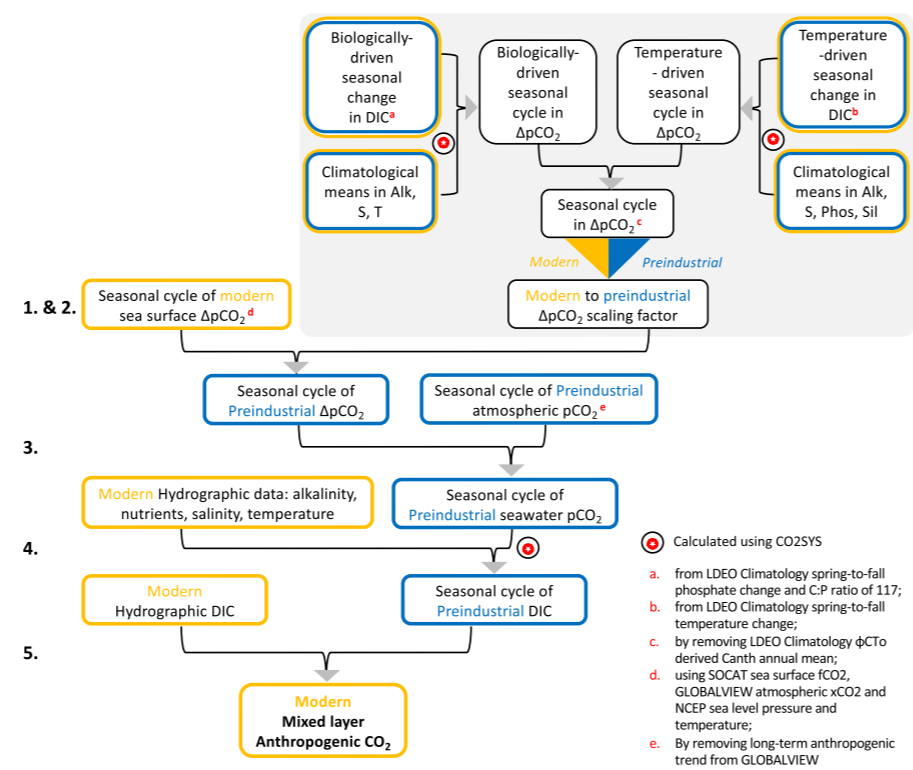
775 **Extended Data Figure 4. Schematic of Pre-industrial DisEquilibrium (SPIDeR) mixed layer**

776 **C<sub>anth</sub> calculation.** Blue colour implies pre-industrial era, yellow colour implies modern era.

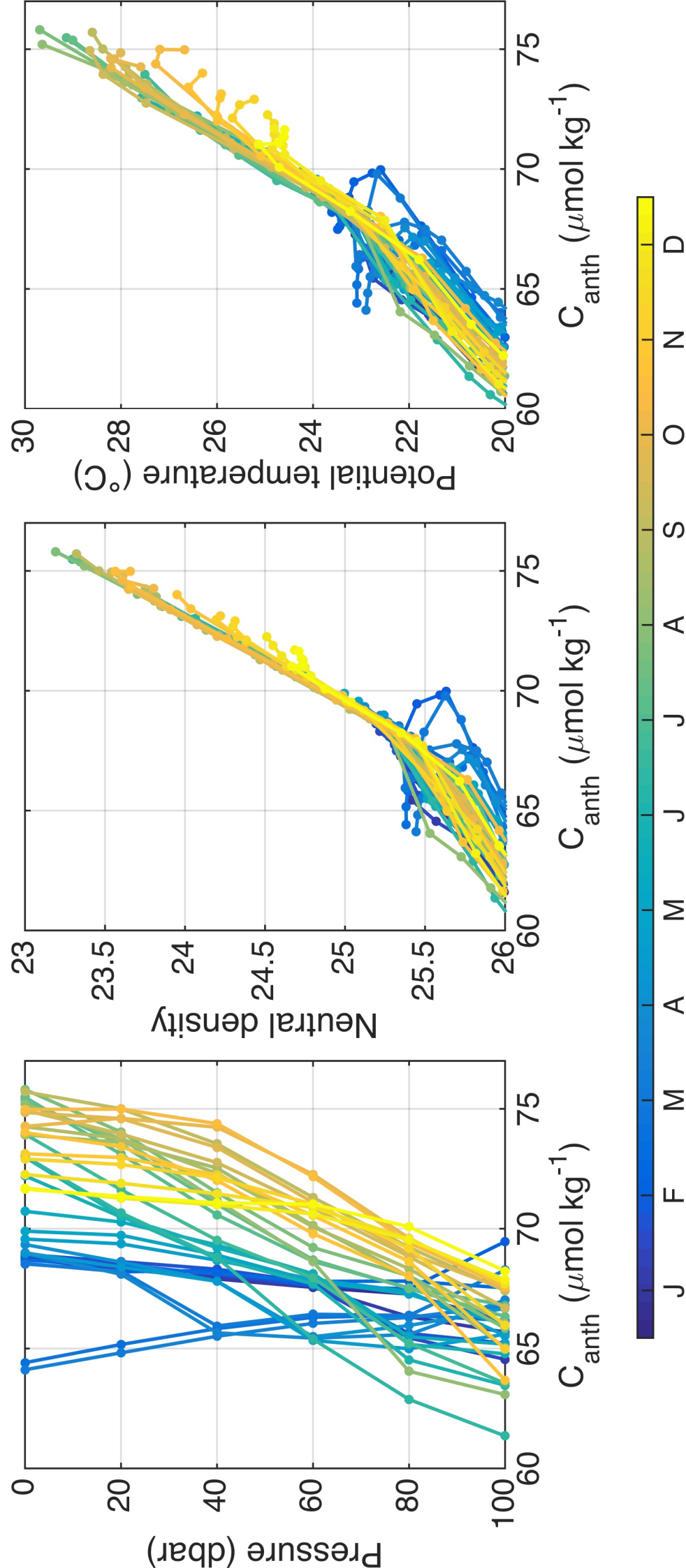
777 Numbers on left refer to explanations in Methods text.

778

779



780 **Extended Data Figure 5. Variability in predicted surface layer  $C_{\text{anth}}$ .** For 2009 at 62.375°W  
781 with  $C_{\text{anth}}$  plotted against **a**, pressure, **b**, neutral density and **c**, potential temperature. Color refers  
782 to time of year.  
783

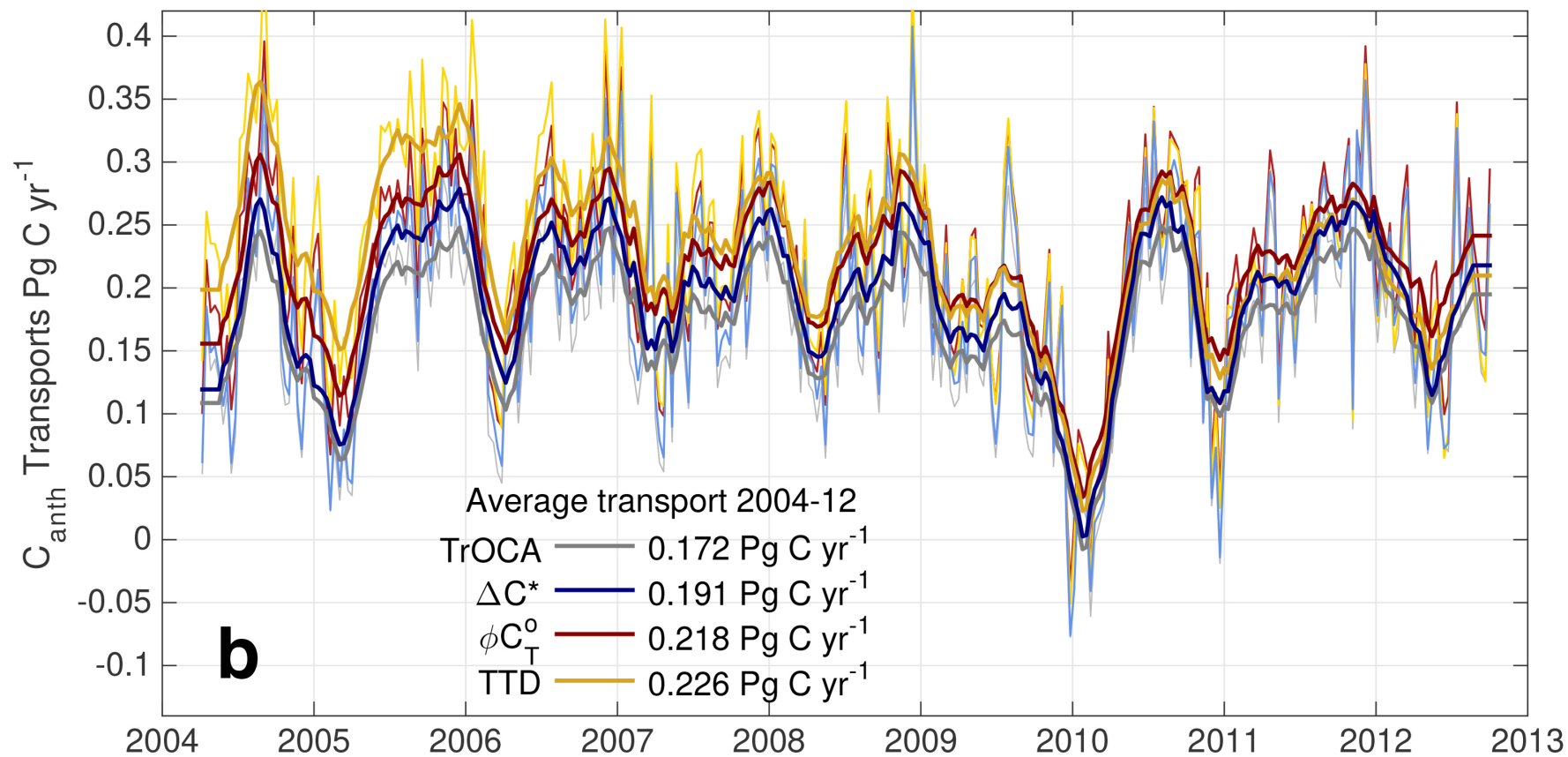
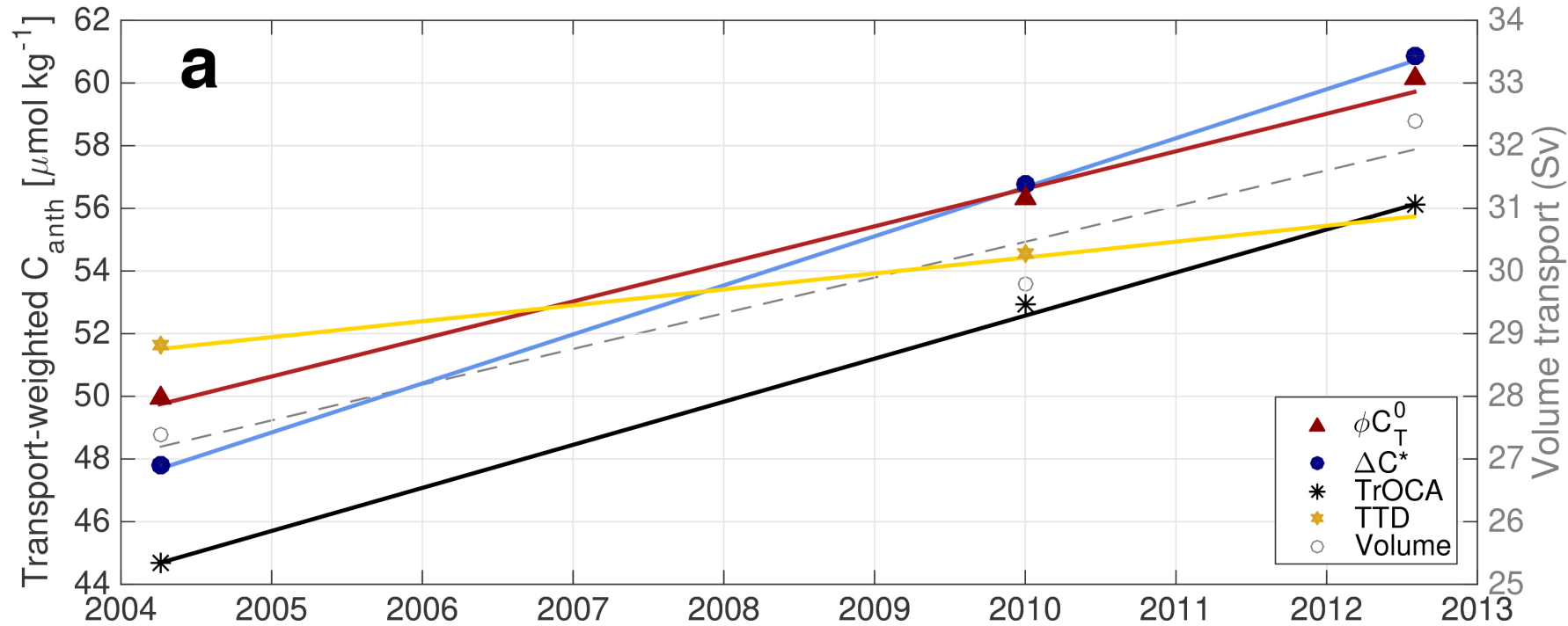


786 **Extended Data Figure 6.  $C_{\text{anth}}$  transports across Florida Straits and 26.5°N.** **a**, transport-  
787 weighted  $C_{\text{anth}}$  transports and volume transports for Florida Straits in 2004, 2010 and 2012. Lines  
788 are linear predictive fits. TTD has no data for 2012. **b**,  $C_{\text{anth}}$  transports across 26.5°N on ten-day  
789 (thin lines) and 3-month filtered (thick lines) timescales for 2004.3-2012.8 for four  $C_{\text{anth}}$   
790 calculation methods with 2004-2012 averages and standard deviation.

791

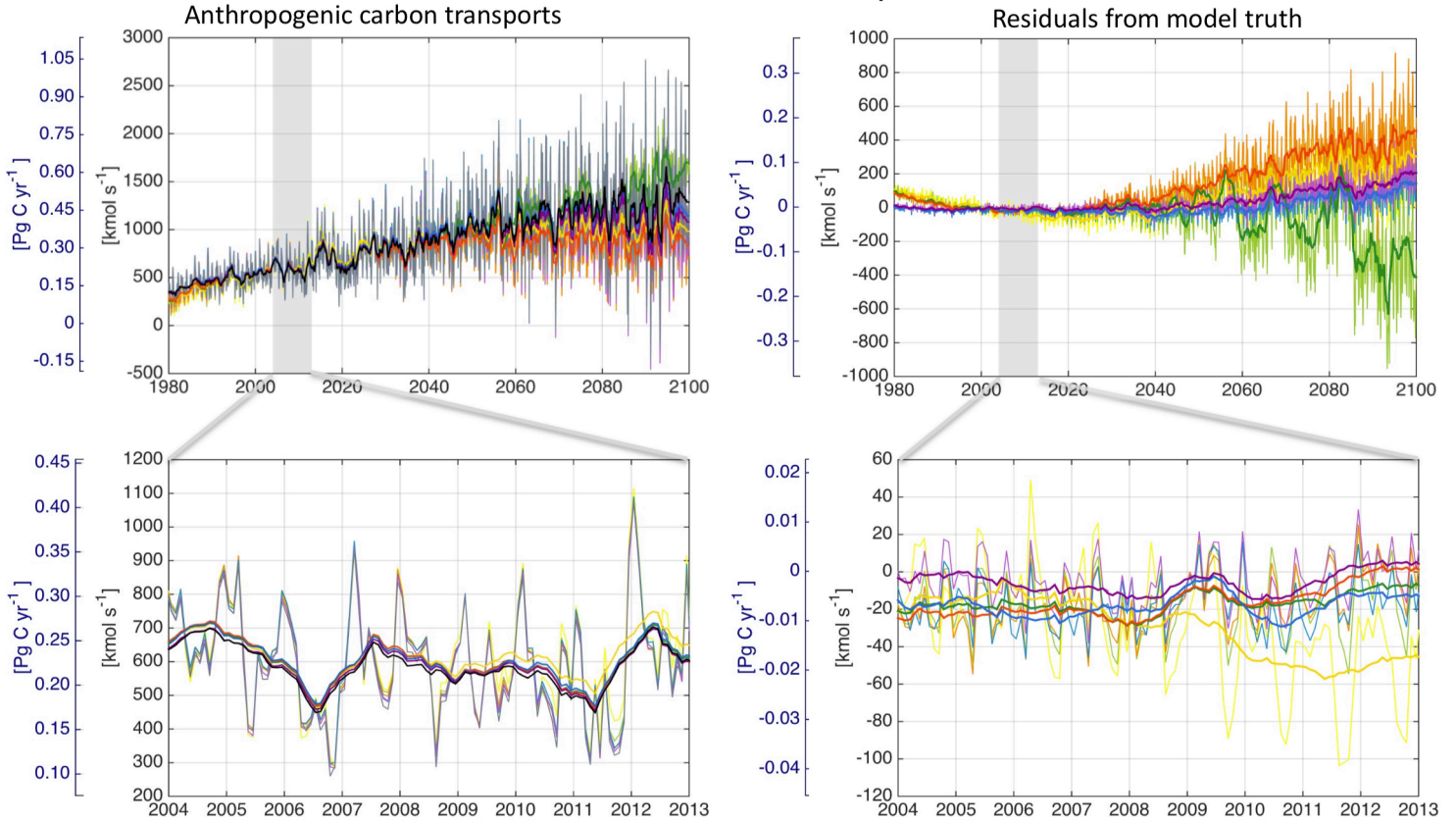
792





793 **Extended Data Figure 7. Application of  $C_{\text{anth}}$  transport calculation methodology to model**  
794 **outputs.** Anthropogenic carbon transports (a,c) and their residual from the model truth (b,d) for  
795 1980-2100 (a,b) and 2004-2013 (c,d) for five unique applications of the PRE methodology  
796 applied to 1° NEMO-MEDUSA model outputs. Legend lists colour schemes of model truth, and  
797 different modifications of PRE methodology applied. For conversion of carbon transports, 660  
798  $\text{kmol s}^{-1} = 0.25 \text{ PgC yr}^{-1}$ .  
799  
800

### NEMO-MEDUSA model outputs

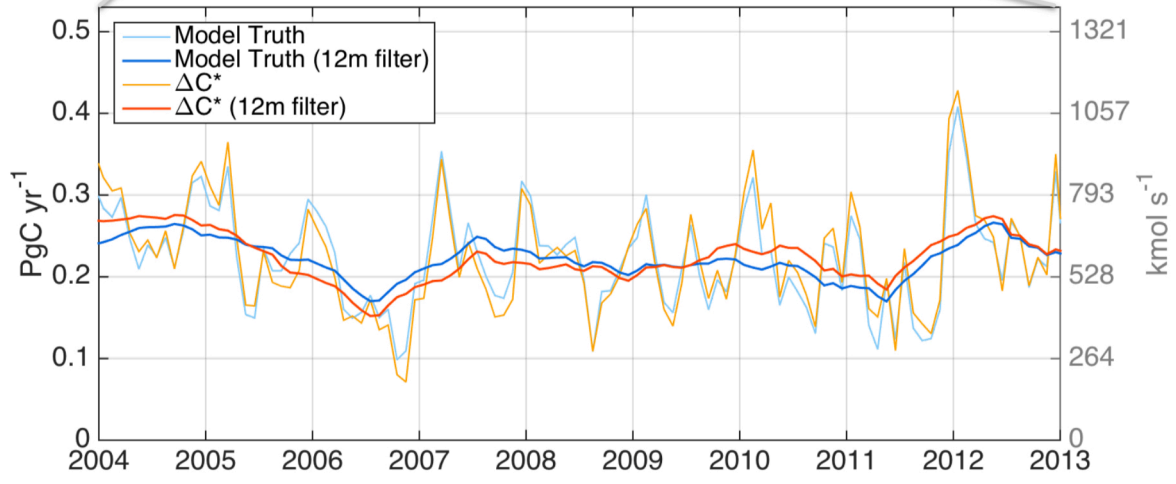
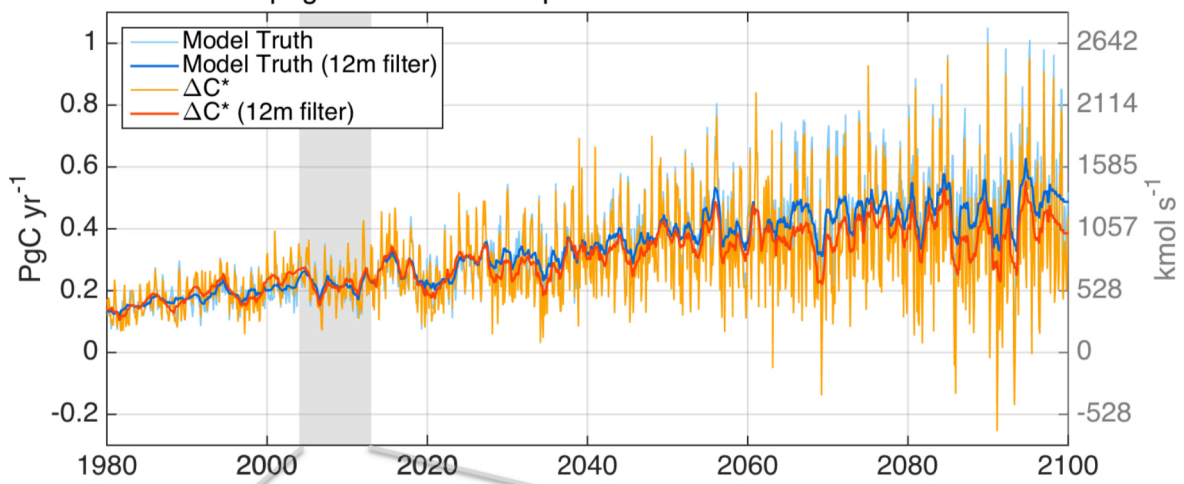


	Number of PRE regions	PRE boundaries optimised to hydrography of:	Months of data for each input year (1992, 1998, 2004, 2010, 2011) for PRE training	Trend in $\Delta C_{\text{anth}}$	Vertical data resolution
<span style="color: yellow;">■</span>	30	Observations	1	Linear	20 data points
<span style="color: green;">■</span>	55	Model	1	Linear	20 data points
<span style="color: orange;">■</span>	55	Model	12	Linear	20 data points
<span style="color: blue;">■</span>	55	Model	12	Non-linear	20 data points
<span style="color: purple;">■</span>	55	Model	12	Non-linear	64 data points
<span style="color: black;">■</span>	Model Truth				

801 **Extended Data Figure 8. Application of back-calculation  $C_{\text{anth}}$  methodology to model**  
802 **outputs.** Top: Anthropogenic carbon transports for 1980-2100 for 1. application of  $\Delta C^* C_{\text{anth}}$   
803 calculation method to 1° NEMO-MEDUSA model outputs combined with model velocity fields,  
804 and 2. model truth. Bottom, as for top but for 2004-2013. Monthly values and 12-month running  
805 mean shown for both. For conversion of carbon transports,  $660 \text{ kmol s}^{-1} = 0.25 \text{ PgC yr}^{-1}$ .

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Anthropogenic carbon transports - model truth &  $\Delta C^*$  estimate



Region	Water mass	Bin	a (x 10 <sup>-6</sup> )	b (x 10 <sup>-6</sup> )	c (x 10 <sup>-9</sup> )	d (x 10 <sup>-8</sup> )	y <sup>0</sup> (x 10 <sup>-3</sup> )
Surface to bottom of mixed layer	78°W to 46°W	1	1.009	-2.724	-12.080	62.337	0.175
	46°W to 10°W	2	2.304	5.147	12.787	24.827	-0.171
Bottom of mixed layer to $\gamma_n < 26.7$	78°W to 70°W	3	2.624	11.795	39.434	11.059	-0.436
	70°W to 46°W	9	2.251	11.477	36.820	25.075	-0.406
	46°W to 30°W	15	4.245	-0.265	8.463	78.169	0.017
	30°W to 10°W	21	3.342	-3.342	-64.403	4.573	0.137
$26.7 < \gamma_n < 27.4$	78°W to 70°W	4	8.198	-36.086	-5.613	1.910	1.226
	70°W to 46°W	10	9.094	-40.930	-5.046	11.123	1.394
	46°W to 30°W	16	9.854	-48.630	-13.785	20.383	1.670
	30°W to 10°W	22	7.961	-25.158	-4.511	19.469	0.848
$27.4 < \gamma_n < 27.65$	78°W to 70°W	5	-0.527	9.269	0.427	-6.383	-0.305
	70°W to 46°W	11	-1.623	32.461	-6.910	-11.214	-1.107
	46°W to 30°W	17	2.193	14.796	6.004	7.694	-0.520
	30°W to 10°W	23	-2.222	44.411	-16.506	3.723	-1.511
$27.65 < \gamma_n < 27.85$	78°W to 70°W	6	-9.157	104.091	-10.603	-49.165	-3.594
	70°W to 46°W	12	-7.517	38.737	-11.749	-23.973	-1.292
	46°W to 30°W	18	-6.154	27.031	-5.122	11.632	-0.882
	30°W to 10°W	24	-9.678	84.053	-27.709	-0.336	-2.843
$27.85 < \gamma_n$ & Pressure < 1775 dbar	78°W to 70°W	7	21.866	-176.227	11.292	3.156	6.090
	70°W to 46°W	13	5.391	-57.011	-9.694	-22.221	2.000
	46°W to 30°W	19	19.227	-56.380	29.443	-14.079	1.853
	30°W to 10°W	25	0.344	22.632	-16.530	4.167	-0.754
Pressure > 1775 dbar	78°W to 70°W	8	15.312	-96.938	0.899	-8.254	3.349
	70°W to 46°W	14	18.645	-122.293	2.022	-10.631	4.220
	46°W to 30°W	20	6.856	4.438	1.541	-1.594	-0.174
	30°W to 10°W	26	8.509	-34.556	0.875	4.583	1.189

809 **Extended Data Table 1. Predictive coefficients a-d and constant  $y^0$  from PREs for**  
810 **individual bins**, according to  $\text{norm}C_{\text{anth}} = a*\theta + b*\text{Sal} + c*\text{pres} + d*\text{lon} + y^0$ , where ‘ $\theta$ ’ is  
811 potential temperature (°C), ‘Sal’ is salinity, ‘pres’ is pressure (dbar), and ‘lon’ is longitude (°E).  
812 Results here are from  $\Delta C^* C_{\text{anth}}$  outputs.  
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Region	Water mass	$\sigma T_{\text{reg}}$ (Sv)	$(C_{\text{reg}} - C_{\text{sect}})$ ( $\mu\text{mol kg}^{-1}$ )	$\sigma CT_T$ (TgC yr <sup>-1</sup> )	$\sigma C_{\text{reg}}$ ( $\mu\text{mol kg}^{-1}$ )	$T_{\text{reg}}$ (Sv)	$\sigma CT_C$ (TgC yr <sup>-1</sup> )	$\sigma CT$ (TgC yr <sup>-1</sup> )	
Surface to bottom of mixed layer	78°W to 46°W	1	0.63	19.7	5	29.3	-0.97	11	
	46°W to 10°W	2	0.87	31.7	10	29.2	-5.4	59	
Bottom of mixed layer to $\gamma_n < 26.7$	78°W to 70°W	3	5.04	27.3	51	9.5	4.2	15	
	70°W to 46°W	9	4.53	33.9	57	2.9	-5.2	57	
	46°W to 30°W	15	1.08	38.3	15	5.1	-2.5	16	
	30°W to 10°W	21	0.39	43.6	6	3.1	-1.3	7	
$26.7 < \gamma_n < 27.4$	78°W to 70°W	4	2.59	12.7	12	13.2	2.3	11	
	70°W to 46°W	10	2.91	20.1	22	8.3	-2.2	23	
	46°W to 30°W	16	1.46	23.3	13	8.7	-2.3	15	
	30°W to 10°W	22	1.77	24.6	16	9.7	-3.6	21	
$27.4 < \gamma_n < 27.65$	78°W to 70°W	5	0.61	3.8	1	0.5	0.53	0	
	70°W to 46°W	11	0.75	2.4	1	1.2	-0.13	0	
	46°W to 30°W	17	0.56	2.9	1	2.7	-0.13	0	
	30°W to 10°W	23	0.57	3.4	1	2.1	-0.26	0	
$27.65 < \gamma_n < 27.85$	78°W to 70°W	6	0.48	9.8	2	2.7	0.17	0	
	70°W to 46°W	12	0.60	5.1	1	2.8	-0.37	0	
	46°W to 30°W	18	0.50	0.9	0	1.8	-0.21	0	
	30°W to 10°W	24	0.42	4.6	1	2.0	-0.48	0	
$27.85 < \gamma_n$ & Pressure < 1775 dbar	78°W to 70°W	7	0.55	0.0	2	0.0	-0.62	0	
	70°W to 46°W	13	0.38	4.5	1	3.2	-1.35	-2	
	46°W to 30°W	19	0.23	0.6	0	2.5	-0.68	-1	
	30°W to 10°W	25	0.18	-0.7	0	3.0	-0.71	-1	
Pressure > 1775 dbar	78°W to 70°W	8	0.92	0	-3	0.0	-1.7	-3	
	70°W to 46°W	14	1.89	-11.5	-8	4.5	-5.2	-9	
	46°W to 30°W	20	1.09	-14.8	-6	3.2	-3.6	-4	
	30°W to 10°W	26	0.86	-14.2	-4	3.2	-3.1	-4	
Bering Strait			0.20	27.0	2	6.2	0.80	2	
Ekman			0.20	47.7	4	6.3	3.50	6	
Florida Strait			0.99	25.9	10	6.2	31.58	72	
$C_{\text{anth}}$ estimate & $\Delta C_{\text{anth}}$								37	
Total uncertainty in individual 10-day $C_{\text{anth}}$ transport estimates							0.135 Pg C yr <sup>-1</sup>		
Total uncertainty in annual average $C_{\text{anth}}$ transport							0.039 Pg C yr <sup>-1</sup>		
Total uncertainty in average $C_{\text{anth}}$ transport for full time-series							0.013 Pg C yr <sup>-1</sup>		



815 **Extended Data Table 2. C<sub>anth</sub> transport uncertainty estimates.** Key to column headings:  
816  $\sigma_{T_{reg}}$ , uncertainty in regional transport;  $C_{reg}$ , regional C<sub>anth</sub> average;  $C_{sect}$ , section C<sub>anth</sub> average;  
817  $(C_{reg} - C_{sect})$ , regional C<sub>anth</sub> anomaly;  $\sigma_{CT_T}$ , C<sub>anth</sub> transport transport-related uncertainty;  $\sigma_{C_{reg}}$ ,  
818 uncertainty in regional C<sub>anth</sub> average;  $T_{reg}$ , regional transport;  $\sigma_{CT_C}$ , uncertainty in C<sub>anth</sub> transport  
819 due to uncertainty in C<sub>anth</sub>;  $\sigma_{CT}$ , total uncertainty. Section-averaged C<sub>anth</sub> ( $C_{sect}$ ) is estimated as  
820  $18.8 \times 10^{-6} \text{ kmol m}^{-3}$  ( $\sim 18 \mu\text{mol kg}^{-1}$ ). Combining in quadrature, each ten-day estimate of C<sub>anth</sub>  
821 transport has an uncertainty of  $0.135 \text{ PgC yr}^{-1}$ . Assuming that there are 12 independent estimates  
822 in the year then the uncertainty on the annual average C<sub>anth</sub> transport is  $0.135 \text{ PgC yr}^{-1}/(12)^{1/2} =$   
823  $0.039 \text{ PgC yr}^{-1}$ . Assuming there are 102 independent estimates across the full 8.5-year time series  
824 then the uncertainty on the full time series average C<sub>anth</sub> transport is  $0.135 \text{ PgC yr}^{-1}/(102)^{1/2} =$   
825  $0.013 \text{ PgC yr}^{-1}$ .

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