

ARTICLE

DOI: 10.1038/s41467-017-02738-z

OPEN

# Continental shelves as a variable but increasing global sink for atmospheric carbon dioxide

Goulven G. Laruelle<sup>1</sup>, Wei-Jun Cai<sup>2</sup>, Xinping Hu<sup>3</sup>, Nicolas Gruber<sup>4</sup>, Fred T. Mackenzie<sup>5</sup> & Pierre Regnier<sup>1</sup>

It has been speculated that the partial pressure of carbon dioxide ( $p\text{CO}_2$ ) in shelf waters may lag the rise in atmospheric  $\text{CO}_2$ . Here, we show that this is the case across many shelf regions, implying a tendency for enhanced shelf uptake of atmospheric  $\text{CO}_2$ . This result is based on analysis of long-term trends in the air-sea  $p\text{CO}_2$  gradient ( $\Delta p\text{CO}_2$ ) using a global surface ocean  $p\text{CO}_2$  database spanning a period of up to 35 years. Using wintertime data only, we find that  $\Delta p\text{CO}_2$  increased in 653 of the 825  $0.5^\circ$  cells for which a trend could be calculated, with 325 of these cells showing a significant increase in excess of  $+0.5 \mu\text{atm yr}^{-1}$  ( $p < 0.05$ ). Although noisier, the deseasonalized annual data suggest similar results. If this were a global trend, it would support the idea that shelves might have switched from a source to a sink of  $\text{CO}_2$  during the last century.

<sup>1</sup>Department of Geoscience, Environment & Society, Université Libre de Bruxelles, Brussels, 1050, Belgium. <sup>2</sup>School of Marine Science and Policy, University of Delaware, Newark, DE 19716, USA. <sup>3</sup>Department of Physical and Environmental Sciences, Texas A&M University—Corpus Christi, Corpus Christi, TX 78412, USA. <sup>4</sup>Institute of Biogeochemistry and Pollutant Dynamics, ETH Zurich, 8092 Zurich, Switzerland. <sup>5</sup>Department of Oceanography, School of Ocean and Earth Science and Technology, University of Hawaii at Manoa, Honolulu, HI 96822, USA. Correspondence and requests for materials should be addressed to G.G.L. (email: [goulven.gildas.laruelle@ulb.ac.be](mailto:goulven.gildas.laruelle@ulb.ac.be))

The atmospheric partial pressure of CO<sub>2</sub> ( $p\text{CO}_{2,\text{air}}$ ) has been increasing at a rate of about 1.8 parts per million by volume (ppmv) per year in recent decades as a result of human activities such as burning of fossil fuel, deforestation, and cement production<sup>1,2</sup>. Although substantial regional and decadal variability has been observed<sup>3,4</sup>, surface water  $p\text{CO}_2$  levels tended to have followed more or less those of the atmosphere, particularly in the open ocean<sup>5</sup>. This tracking trend is best shown by the data collected at regular intervals at a few ocean time series stations, which by now cover more than 30 years<sup>6</sup>. The close atmospheric tracking of surface water  $p\text{CO}_2$  is a consequence of the relatively long water residence time of the global surface ocean, with a time scale of more than a year<sup>7</sup>, which is longer than an air–sea CO<sub>2</sub> exchange time scale of about 10 months<sup>7</sup>. However, it is not clear whether surface water  $p\text{CO}_2$  on continental shelves, defined here as shallow regions with depths between 20 and 200 m that exclude the very nearshore areas (see “Methods” section for details), also track the atmospheric  $p\text{CO}_2$  increase.

Our current understanding of the long-term trend in shelf  $p\text{CO}_2$  is very limited because it largely relies on observations from a few time series only with records much shorter than those in the open ocean. Furthermore,  $p\text{CO}_2$  in shelf regions is characterized by high temporal and spatial variability, making trend analyses more demanding<sup>8–12</sup>. The recent development of the community-driven global ocean  $p\text{CO}_2$  data product SOCAT (for Surface Ocean CO<sub>2</sub> Atlas<sup>13</sup>) now offers a complementary approach to assess whether continental shelves show a change in the air–sea  $p\text{CO}_2$  gradient ( $\Delta p\text{CO}_2 = p\text{CO}_{2,\text{air}} - p\text{CO}_2$ ) over time. Although the data coverage remains sparse within SOCAT, it allows reconstructing the evolution in  $\Delta p\text{CO}_2$  for 15 regions across the global shelves with a time span of at least a decade. We first aim to identify if the observed recent trends in  $\Delta p\text{CO}_2$  support a strengthening or a weakening of the global CO<sub>2</sub> uptake by shelf regions. Then, we investigate whether important regional differences emerge from the analysis, and if any global pattern can be discerned when combining all observational evidence. In what follows, we briefly review the current state of knowledge regarding shelf CO<sub>2</sub> dynamics and then propose novel observational evidence of rates of change in the air–sea  $p\text{CO}_2$  gradient from the analysis of the SOCAT database.

Syntheses in the recent decade suggest that, globally, continental shelves currently absorb atmospheric CO<sub>2</sub> at a rate of about 0.2 Pg C annually<sup>11,12,14–18</sup>. Despite great local variability, the data also suggest that mid- to high-latitude shelves are generally a sink of CO<sub>2</sub>, while warm tropical shelves are a moderate source of CO<sub>2</sub><sup>14,16,17</sup>. A broad consensus regarding the current strength of the global shelf CO<sub>2</sub> sink and its large-scale spatial variability has thus recently emerged. In particular, continuous high-resolution  $p\text{CO}_2$  maps for continental shelf seas derived

from the interpolation of experimental data<sup>19</sup> clearly support this spatial trend in all oceanic basins. However, much less is known regarding decadal trends and associated variability in shelf CO<sub>2</sub> sources and sinks across the globe.

The limited  $p\text{CO}_2$  time series obtained from coastal sites provide mixed evidence for the size of the decadal trends. Bates and co-authors<sup>6</sup> reported for the coastal stations Mundia and Iceland Sea small long-term rates of increase in  $p\text{CO}_2$  (+1.3  $\mu\text{atm yr}^{-1}$ ), i.e., rate that are lower than that of the atmosphere, while they show that the stations Irminger and CARIACO have rates as high as +2.4 and +2.9  $\mu\text{atm yr}^{-1}$ , respectively (Table 1). A shorter time series at the SEATS station in the South China Sea over the 1999–2003 period reveals an even faster increase in  $p\text{CO}_2$  with a rate of +4.2  $\mu\text{atm yr}^{-1}$ . While illustrative, such trends from a handful of locations do not allow drawing any conclusion regarding the overall change in the shelf air–sea  $p\text{CO}_2$  gradient over time.

Some data-driven regional analyses have also attempted to decipher the rate of  $p\text{CO}_2$  increase in continental shelf settings. Data from two large semi-enclosed shelf seas (North Sea and Baltic Sea) and from the Bering Sea suggest that continental shelves may exhibit a rapid increase in  $p\text{CO}_2$ <sup>20,21</sup> toward atmospheric values, thus lowering the air–sea  $p\text{CO}_2$  gradient over time (Table 2). In contrast, another study in the North Sea<sup>22</sup> and reports from the warm Caribbean Sea<sup>23</sup> (mostly from areas deeper than the shelf depths as defined here), the coast of Japan<sup>24</sup>, West Antarctic Peninsula<sup>25</sup>, and the Scotia shelf<sup>26</sup>, showed that the sea surface  $p\text{CO}_2$  increase lags well behind that of the atmosphere, making the areas either an increased sink (Pacific coast of Japan, Coast West Antarctic Peninsula, and Puerto Rico) or a decreased source (Scotian shelf) for atmospheric CO<sub>2</sub>. However, a recent study<sup>27</sup> suggests that the Japanese margin as a whole roughly tracks the atmospheric CO<sub>2</sub> increase. Overall, these regional analyses highlight that trends in CO<sub>2</sub> sources and sinks appear highly variable both within the same shelf and across different shelf systems.

Researchers have also attempted to use models to investigate the change in shelf air–water CO<sub>2</sub> exchange. Using a box model, Mackenzie and co-workers were the first to suggest that shelves may have turned from a CO<sub>2</sub> source in the preindustrial time to a sink at present and that the CO<sub>2</sub> uptake rate would increase with time<sup>28</sup>. Consistent with these predictions, Bauer et al.<sup>8</sup> and Cai<sup>14</sup> also provided a conceptual model and suggested an increasing global shelf CO<sub>2</sub> sink with time as a result of the atmospheric  $p\text{CO}_2$  increase. Recently, an eddy-resolving global model was used to simulate the flux of anthropogenic CO<sub>2</sub> into the coastal ocean<sup>29</sup>. This latter model can be viewed as an open ocean model extended to the coast that lacks a few, but important processes in the nearshore environments. In particular, the global model lacks detailed sediment interactions, the handling of river fluxes, and

**Table 1 Rates of change in  $p\text{CO}_2$  and corresponding rate of change in  $\Delta p\text{CO}_2$  reported in the literature for coastal time series stations**

Region	$p\text{CO}_2$ trend ( $\mu\text{atm yr}^{-1}$ )	$\Delta p\text{CO}_2$ trend ( $\mu\text{atm yr}^{-1}$ )	Period	Comment	Reference
Mundia	1.28 ± 0.33	Increase	1988–2011		Bates et al. <sup>6</sup>
Hawaii (HOT)	1.72 ± 0.09	Steady	1988–2011	Outside of our shelf definition	Bates et al. <sup>6</sup>
	2.0 ± 0.5	Steady	1983–2013		Wang et al. <sup>27</sup>
BATS	1.69 ± 0.11	Steady	1983–2011	Outside of our shelf definition	Bates et al. <sup>6</sup>
	1.9 ± 0.2	Steady	1991–2011		Wang et al. <sup>27</sup>
ESTOC	1.92 ± 0.24	Steady	1995–2011		Bates et al. <sup>6</sup>
Irminger Sea	2.37 ± 0.49	Decrease	1983–2011		Bates et al. <sup>6</sup>
CARIACO	2.95 ± 0.43	Decrease	1995–2011		Bates et al. <sup>6</sup>
South China Sea (SEATS)	4.2 ± 3.2	Decrease (−2.6)	1999–2003	Outside of our shelf definition	Tseng et al. <sup>21</sup>
Iceland Sea (year)	1.29 ± 0.36	Increase	1995–2008		Bates et al. <sup>6</sup>

**Table 2 Rates of change in  $p\text{CO}_2$  and corresponding rate of change in  $\Delta p\text{CO}_2$  in different regions reported in the literature for continental shelf waters**

Region	$p\text{CO}_2$ trend ( $\mu\text{atm yr}^{-1}$ )	$\Delta p\text{CO}_2$ trend ( $\mu\text{atm yr}^{-1}$ )	Period	Comment	Reference
North Sea					
Summer	7.9	Fast decrease	2001–2005	Both studies only compare summertime $p\text{CO}_{2,w}$ normalized to 16 °C for different summers	Thomas et al. <sup>20</sup> ; Salt et al. <sup>22</sup>
Summer	6.5	Fast decrease	2001–2005		
Summer	1.33	Slow increase	2005–2008		
Baltic Sea		Decrease	1994–2008	Interannual variations in $p\text{CO}_{2,w}$ minima are controlled by maximum concentration of phosphate in winter	Wesslander et al. <sup>32</sup>
Puerto Rico					
All year	$1.11 \pm 0.35$	Increase (+0.74)	2002–2009		Park and Wanninkhof <sup>23</sup>
Summer	$1.57 \pm 0.86$	Increase (+0.47)	2002–2009		Park and Wanninkhof <sup>23</sup>
Winter	$0.17 \pm 1.23$	Increase (+1.88)	2002–2009		Park and Wanninkhof <sup>23</sup>
Bering Sea					
Basin	$6.5 \pm 1.4$	Decrease (−6.0)	1995–2001	Increase in $p\text{CO}_2$ attributed to abnormally high primary production	Fransson et al. <sup>51</sup>
Shelf slope	$11 \pm 1.9$	Decrease (−10.0)	1995–2001		
Coast of Japan					
	$1.54 \pm 0.33$	Increase (+0.45)	1994–2008	Increase in $p\text{CO}_2$ is explained by sea surface temperature increase	Ishii et al. <sup>24</sup> Wang et al. <sup>27</sup> Borges et al. <sup>48</sup>
	$2.1 \pm 0.6$	Steady	1992–2013		
	Increase	Not reported	1982–2005		
Tasmanian Coast					
European Margins	$1.9 \pm 0.7$	Steady	1989–2014		Wang et al. <sup>27</sup>
Antarctic Peninsula					
Summer	$1.45 \pm 2.97$	Increase (+0.45)	1999–2013	The increase in $\Delta p\text{CO}_2$ is attributed to an increase of 1.3 °C in sea surface temperature	Hauri et al. <sup>25</sup> Hauri et al. <sup>25</sup> Hauri et al. <sup>25</sup> Hauri et al. <sup>25</sup> Shadwick et al. <sup>26</sup>
Fall	$1.90 \pm 0.95$	Steady	1999–2013		
Winter	$0.43 \pm 0.77$	Increase (+1.47)	1999–2013		
Spring	$1.22 \pm 2.72$	Increase (+0.68)	1999–2013		
Scotia Shelf	Not reported	Increase (+2.3)	1999–2008		

shallow calcification processes, which were captured in the spatially and temporally crude box model, however<sup>28,30</sup>. Nonetheless, both approaches consistently show that the shelf water  $\text{CO}_2$  uptake increases with increasing atmospheric  $\text{CO}_2$  levels. However, no consensus emerges as to whether past and future decadal changes in shelf  $\Delta p\text{CO}_2$  and, thus,  $\text{CO}_2$  absorption per unit area, will increase at a faster or slower rate compared with the global open ocean.

Two main mechanisms have been proposed to explain the evolution of the continental shelf  $\text{CO}_2$  sink. The first mechanism relies on the efficiency of the physical pump and more specifically on the different timescales for the air–water and shelf–open ocean exchanges of  $\text{CO}_2$ <sup>8,14</sup>. In the situations where the  $\text{CO}_2$  exchange rate across the shelf is faster than that with the atmosphere, the  $p\text{CO}_2$  increase in waters on the shelves may be slower than the atmospheric  $p\text{CO}_2$  increase, even if we assume that no change in biology and physics occurs over time<sup>8,14</sup>. In these margins, the accumulation of anthropogenic  $\text{CO}_2$  in shallow waters would be limited and would help maintain a significant air–water  $p\text{CO}_2$  gradient favouring an efficient uptake of anthropogenic  $\text{CO}_2$ . In contrast, if the cross-shelf export is unable to keep up with the increasing air–sea flux of anthropogenic  $\text{CO}_2$ ,  $\text{CO}_2$  in shelf waters may accumulate and the  $p\text{CO}_2$  increase would follow the atmosphere due to this bottleneck in offshore transport<sup>29</sup>.

The second mechanism relies on the stimulation of the biological pump. Many continental shelves are seriously influenced by anthropogenic nutrient inputs and have higher biological production today than what they had in preindustrial time<sup>30,31</sup>. Thus, net ecosystem metabolism (NEM) on the shelves could have progressively shifted from net heterotrophy to net

autotrophy and the change could have been sufficiently large to reverse the air–sea  $\text{CO}_2$  flux from a source during preindustrial times to a sink under present-day conditions. Net ecosystem calcification (NEC) also plays a significant role in the air–water  $\text{CO}_2$  exchange on the shelves, but the contribution of the carbonate pump to changes in air–water exchange fluxes over the historical period are likely not as large as the biological pump<sup>28</sup>.

Our aim here is to present the first observation-based analysis of decadal trends in global shelf  $p\text{CO}_2$ . The results presented in our regional and global analysis are primarily derived from wintertime data when photosynthetic activity is generally the weakest, and when coastal ocean waters have the most intensive exchange with the open ocean, and consequently the strongest impact on the global ocean  $\text{CO}_2$  accumulation<sup>17,31</sup>. This results in trends that tend to be clearer. We check on these wintertime analyses also with results from an analysis using deseasonalized data for all seasons, confirming that our choice for wintertime only does not result in artefacts. However, this does not suggest that winter contributes more than other seasons to the overall annual trend.

## Results

**Regional trends in  $\Delta p\text{CO}_2$ .** Our analysis employing a narrow definition of the continental shelf corresponding to the 200 m isobaths and winter-only data provides decadal trends in  $\Delta p\text{CO}_2$ , i.e.,  $d\Delta p\text{CO}_2/dt$  values, for 825 cells with an average length of our time series of 18 years. Six hundred five of these 825 cells belong to 6 large regions each comprising at least 50 cells (Table 2). Another 190 cells belong to 9 smaller regions each comprising 10 cells or more. Together, these 15 regions account for 96 and 80%

**Table 3 Rates of change in  $\Delta p\text{CO}_2$  in different regions calculated as the average of the rates derived for each cell of the region**

Region	Narrow shelf			Wide shelf		
	$d(\Delta p\text{CO}_2)/dt$	$\sigma$	$n$	$d(\Delta p\text{CO}_2)/dt$	$\sigma$	$n$
Large regions (>50 cells according to narrow shelf definition)						
North Sea	1.86	1.55	169	1.81	1.37	186
Baltic Sea	2.93	2.38	114	2.93	2.38	114
Labrador Sea	0.68	0.61	104	0.71	0.67	115
English Channel	0.0	0.43	86	-0.03	0.39	89
Mid-Atlantic Bight	1.93	3.11	76	1.92	3.19	78
Coast of Japan	0.77	0.69	56	0.22	0.7	175
Small regions (>20 cells according to narrow shelf definition)						
Cascadian shelf	0.83	1.72	27	0.97	1.23	49
Patagonia	-0.21	0.38	27	-0.11	0.35	33
Irminger Sea	0.56	0.23	26	0.47	0.35	35
Bering Sea	-1.11	0.74	24	-1.44	0.94	42
Antarctic Peninsula	2.28	1.24	22	1.57	0.95	50
South Greenland	1.95	1.22	20	1.73	0.8	29
South Atlantic Bight	0.51	0.74	18	0.7	0.7	26
Tasmania	0.11	0.12	16	0.15	0.17	25
Barents Sea	0.38	0.52	10	0.31	0.41	42

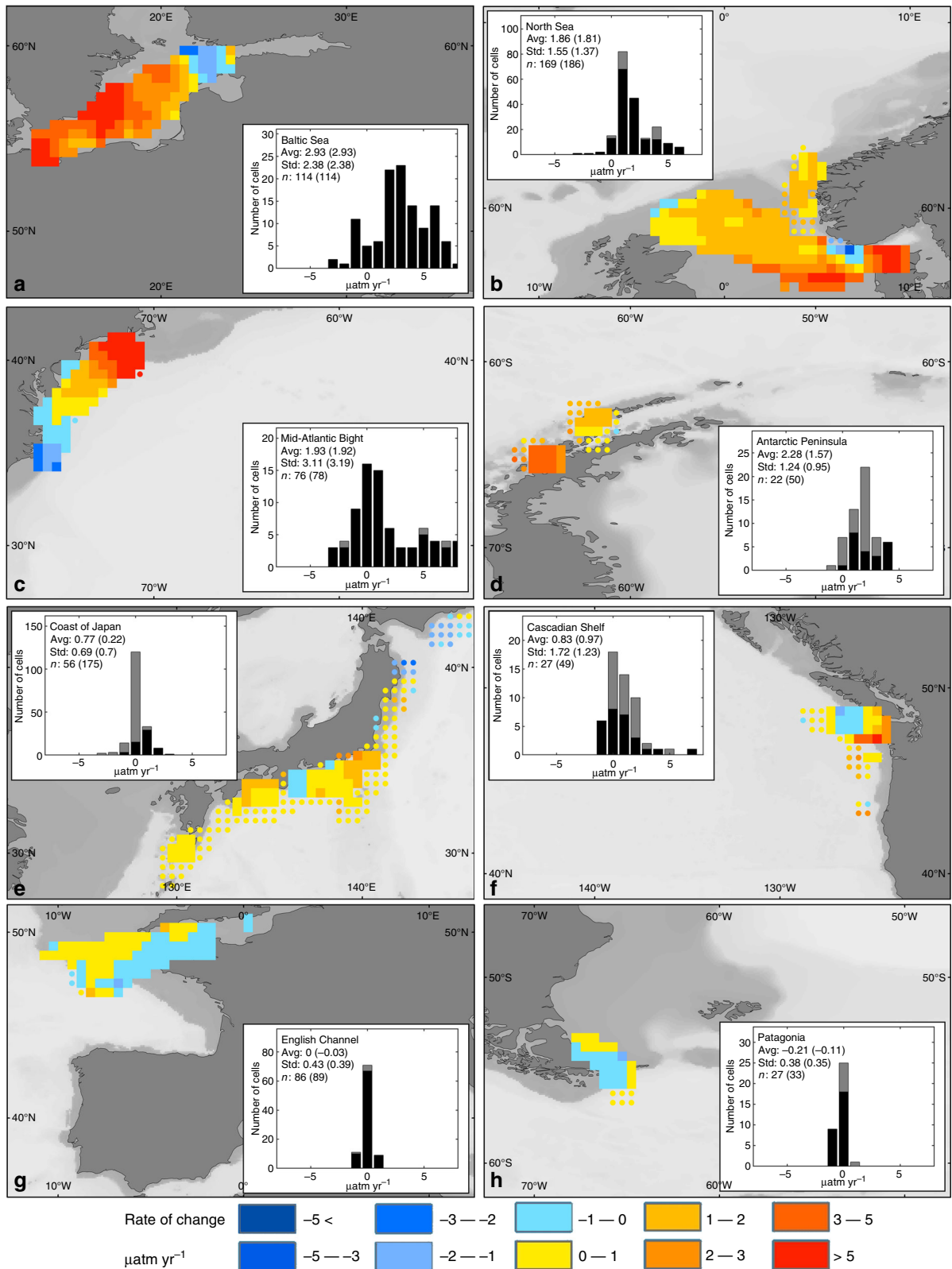
The standard deviation ( $\sigma$ ) and the number of cells available ( $n$ ) using our narrow and wide definitions of the continental shelf are also reported

of the cells contained in our narrow and wide definitions of the shelf, respectively (see “Methods” section for details). Most regions display variable, but relatively consistent values of  $d\Delta p\text{CO}_2/dt$ . Only the Baltic Sea and the Mid-Atlantic Bight show a significant but continuous spatial gradient in the trend within their respective domains. With the exception of the Labrador Sea, regional analyses of the air–sea  $\text{CO}_2$  exchange have been published for each of the areas presented here, but estimates of  $d\Delta p\text{CO}_2/dt$  have only been reported for 9 out of the 15 regions (Table 3).

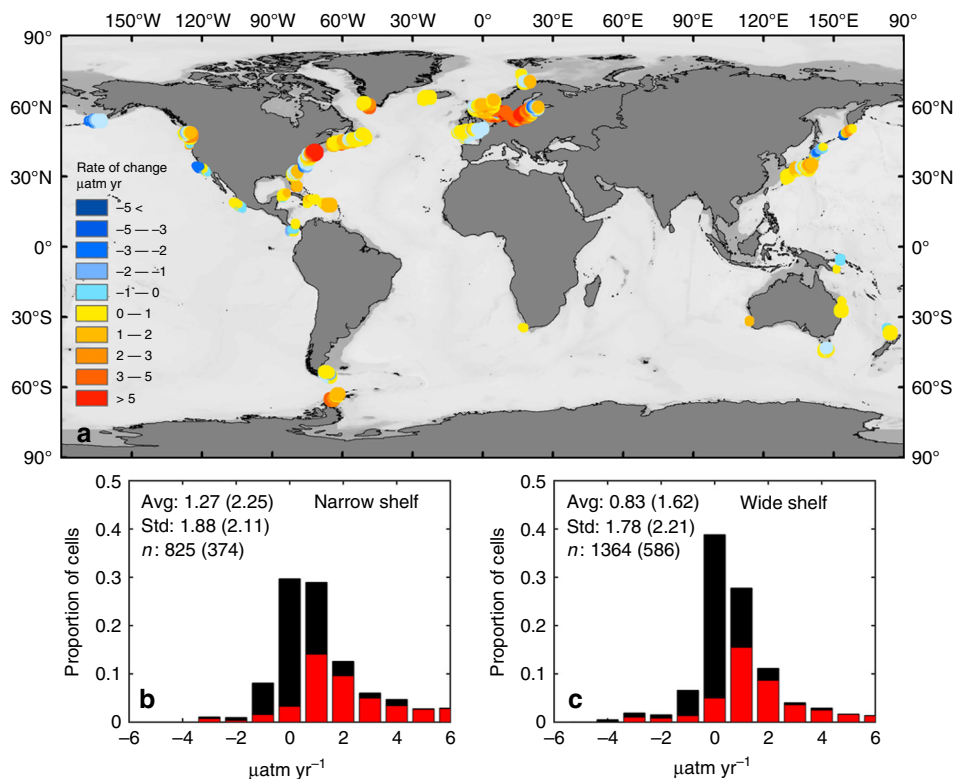
The highest positive  $d\Delta p\text{CO}_2/dt$ , with an average rate of change of  $+2.9 \pm 2.4 \mu\text{atm yr}^{-1}$ , occurs in the Baltic Sea (Fig. 1a). This rate of increase in  $\Delta p\text{CO}_2$  is higher than the atmospheric  $p\text{CO}_2$  increase rate and, therefore, surface water  $p\text{CO}_2$  actually decreases over time, most likely as a result of increased anthropogenic nutrient inputs and resultant increases in coastal productivity in this semi-isolated inland sea, which affect the biogeochemistry of the Baltic Sea all year long<sup>32</sup>. Our results are consistent with a recent study that the Baltic Sea is a decreasing source of  $\text{CO}_2$  to the atmosphere<sup>32</sup>. The North Sea (Fig. 1b), the Mid-Atlantic Bight (Fig. 1c), Southern Greenland, and Antarctic Peninsula (Fig. 1d) have  $d\Delta p\text{CO}_2/dt$  values averaging close to  $+2 \mu\text{atm yr}^{-1}$  with  $\sigma$  of  $1.2\text{--}1.5 \mu\text{atm yr}^{-1}$ , except for the Mid-Atlantic Bight, which has more spatial heterogeneity ( $\sigma = 3.1 \mu\text{atm yr}^{-1}$ ). Therefore, their water  $p\text{CO}_2$  values do not increase with time or increase at a rate substantially lower than that of  $p\text{CO}_{2,\text{air}}$  (Table 3). The results for the North Sea contrast sharply with an earlier report based on two sets of summertime data (2005 vs. 2001), which suggested that the North Sea  $p\text{CO}_2$  increased at a rate five times faster than the atmosphere<sup>20</sup>. A more recent study, however, also comparing summertime  $p\text{CO}_2$  between the years 2001, 2005, and 2008 revealed a large increase of  $26 \mu\text{atm}$  between 2001 and 2005, but only a moderate increase of  $4 \mu\text{atm}$  between 2005 and 2008<sup>22</sup>. These disparate results support the idea that summertime  $p\text{CO}_2$  is more affected by the short-term imbalance of biological production and respiration, whereas wintertime reflects better the long-term trend in air–sea exchange due to reduced biological activities. The increase in the  $\text{CO}_2$  uptake by Greenland coastal waters reported here is in agreement with Yasunaka et al.<sup>33</sup>. Along the East coast of the United States, the Mid-Atlantic Bight is a typical western boundary current margin with intense exchange of water between the shelf and the deep

ocean at a frequency of about once every 3 months and is also influenced by anthropogenic nutrient inputs and eutrophication<sup>31,34</sup>. A previous study suggested that the annual thermal cycle combined with high winds during wintertime dominates annual  $\text{CO}_2$  uptake in this region<sup>35</sup>.  $d\Delta p\text{CO}_2/dt$  ranging from values  $>+5 \mu\text{atm yr}^{-1}$  in the north of the region to  $<-2 \mu\text{atm yr}^{-1}$  in the south could be a consequence of very different hydrodynamic characteristics along this coastal setting. The southern part of the region is under the influence of coastal currents and large estuaries (e.g., Chesapeake Bay) that effectively filter terrestrial organic carbon inputs<sup>36,37</sup> while the northern part is characterized by significantly colder water from the Labrador Sea all year long<sup>38</sup>. The Antarctic margins, such as those along the Antarctic Peninsula, are dominated by an intense exchange with deep water masses and it appears that the rate of  $\text{CO}_2$  uptake is driven mainly by the strength of the upwelling and low-surface temperature<sup>39</sup>. The high  $d\Delta p\text{CO}_2/dt$  along the West Antarctic Peninsula is consistent with another study<sup>25</sup>, which also suggested that winter is the season for which the rate of increase in  $\Delta p\text{CO}_2$  is the fastest. Additionally, a general strengthening of the Southern Ocean  $\text{CO}_2$  sink has been recognized over the past decade<sup>39</sup>.

A second group of regions includes the shelves of Irminger Sea and the Labrador Sea, the Coast of Japan (Fig. 1e), the Cascadian shelf (Fig. 1f), and the South Atlantic Bight. These shelf regions have  $d\Delta p\text{CO}_2/dt$  values ranging between  $+0.5 \mu\text{atm yr}^{-1}$  and  $+1.0 \mu\text{atm yr}^{-1}$ . This range implies that their water  $p\text{CO}_2$  is increasing, but at a rate that is moderately slower than that of  $p\text{CO}_{2,\text{air}}$ , implying a strengthening sink, or a weakening source. The South Atlantic Bight is a moderate sink of  $\text{CO}_2$  for the atmosphere<sup>40</sup> because of its water residence time of a few months and rapid cross-shelf exchange with the open ocean in the winter<sup>41</sup>. Our estimate of  $+0.8 \mu\text{atm yr}^{-1}$  for the Pacific coast of Japan is also consistent with a survey<sup>24</sup> that reports a slower increase of water  $p\text{CO}_2$  ( $+1.5 \pm 0.3 \mu\text{atm yr}^{-1}$ , Table 2) than that of  $p\text{CO}_{2,\text{air}}$  ( $+2.0 \pm 0.1 \mu\text{atm yr}^{-1}$ ) over the period of 1994–2008. Perhaps a bit counterintuitive, however, is the low-positive  $d\Delta p\text{CO}_2/dt$  ( $+0.8 \pm 1.7 \mu\text{atm yr}^{-1}$ ) along the Eastern Boundary current margins known for their strong upwelling off the U.S. West Coast (the California and Cascadian shelves). However, here upwelling source waters are not from the deeper Antarctic water as that in the Atlantic Ocean; rather, they are North Pacific surface water



**Fig. 1** Rate of increase in winter air-sea  $p\text{CO}_2$  gradient for selected best surveyed continental shelf regions. **a** Baltic Sea, **b** North Sea, **c** Mid-Atlantic Bight, **d** Antarctic Peninsula, **e** Coast of Japan, **f** Cascadian shelf, **g** English Channel, and **h** Patagonia. Each point represents a  $0.5^\circ \times 0.5^\circ$  cell. Cells belonging to the narrow and wide definition of the shelf are displayed as squares and diamonds, respectively. The inserted histogram provides the distribution of the average  $d(\Delta p\text{CO}_2)/dt$  value, standard deviation, and the number of cells using the narrow (black lines) and wide (gray lines and numbers in brackets) definitions of the shelf



**Fig. 2** Location of  $0.5^\circ$  cells for which the decadal trend in winter  $\Delta p\text{CO}_2$  is calculated (**a**). Large dots correspond to cells shallower than 200 m and small dots correspond to cells located within 100 km from the coast or depth less than 500 m. The distribution of  $d(\Delta p\text{CO}_2)/dt$  for both our narrow (**b**) and wide (**c**) definitions of the continental shelf are displayed as histograms. The black bars report the distribution of all cells while the red bars report the distribution of cells for which the trend was deemed statistically significant using an  $F$ -test with  $p < 0.05$ . Here,  $\Delta p\text{CO}_2 = p\text{CO}_{2,\text{air}} - p\text{CO}_2$ . Thus, positive values in  $d(\Delta p\text{CO}_2)/dt$  indicate slower increase in water  $p\text{CO}_2$  than  $p\text{CO}_{2,\text{air}}$ .

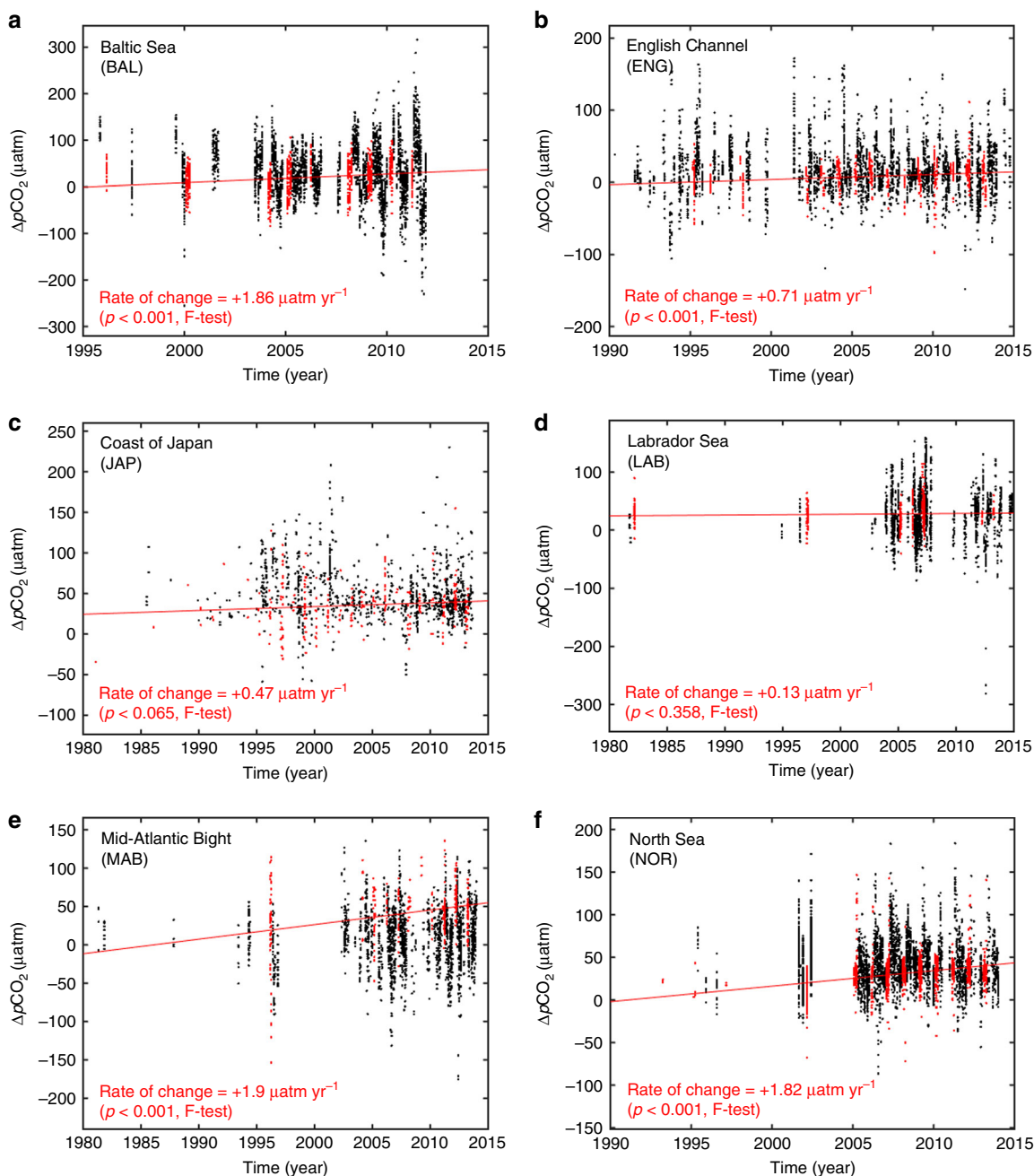
subducted only decades earlier, which thus carries with it the anthropogenic  $\text{CO}_2$  signal<sup>42–44</sup>. The enhanced upwelling strength in recent years may also have contributed to an increase in sea surface  $p\text{CO}_2$ <sup>45</sup>. The western shelves of North America especially the Cascadian shelves, however, are known for their strong spatial heterogeneity, suggesting that multiple processes drive their biogeochemical behavior<sup>46</sup>.

The third group of regions, which includes the English Channel (Fig. 1g), the Barents Sea, and the Tasmanian shelf, show a minimal or no increase in  $d\Delta p\text{CO}_2/dt$ , meaning that their water  $p\text{CO}_2$  more or less tracks the  $p\text{CO}_{2,\text{air}}$  increase (Table 3). The interannual dynamics of  $p\text{CO}_2$  in the English Channel is largely influenced by North Atlantic waters and thus partly constrained by the North Atlantic Oscillation<sup>47</sup>. While no long-term  $d\Delta p\text{CO}_2/dt$  has been estimated for the English Channel itself, the increase of  $+1.7 \mu\text{atm yr}^{-1}$  for  $p\text{CO}_2$  calculated for adjacent Atlantic water<sup>1</sup> is consistent with an increase following that of the atmosphere. In both the Barents Sea<sup>33</sup> and Tasmanian shelf<sup>48</sup>, signs of a strengthening of the coastal  $\text{CO}_2$  sink have been reported and were partly attributed to decreases in sea surface temperature. While marginal ( $+0.1 \mu\text{atm yr}^{-1}$ ), the  $d\Delta p\text{CO}_2/dt$  revealed by our calculations suggests an increase in the strength of  $\text{CO}_2$  sink in the Tasmanian shelf. Finally, the Patagonian continental shelf ( $-0.2 \pm 0.4 \mu\text{atm yr}^{-1}$ ; Fig. 1h) and Bering Sea ( $-1.1 \pm 0.7 \mu\text{atm yr}^{-1}$ ) are the only regions displaying a negative  $d\Delta p\text{CO}_2/dt$  (meaning faster increase in water  $p\text{CO}_2$  than air  $p\text{CO}_2$ ). Thus, although they are still intense  $\text{CO}_2$  sinks<sup>17,49,50</sup>, these shelf systems have recently experienced a weakening in their capacity to absorb atmospheric  $\text{CO}_2$ . While no long-term trend was reported for Patagonian shelf, it has been suggested that the  $\text{CO}_2$  uptake in the Bering Sea could be decreasing at a fast pace

although these observations were based on a relatively short time series (1995–2001)<sup>51</sup>.

Overall, 13 of the 15 regions have positive  $d\Delta p\text{CO}_2/dt$  values and 10 reveal values equal or greater than  $+0.5 \mu\text{atm yr}^{-1}$  (Table 3). Although these areas only account for a small fraction of the global coastal ocean, they show a consistent trend suggesting that winter sea surface  $p\text{CO}_2$  increases significantly slower than  $p\text{CO}_{2,\text{air}}$ . Furthermore, in most regions, the variability around this trend is relatively limited. For instance, in 9 out of 15 regions, the standard deviation is less than  $1 \mu\text{atm yr}^{-1}$ . However, it remains difficult to identify the mechanisms responsible for these observed patterns in  $d\Delta p\text{CO}_2/dt$  considering the diversity of morphological and hydrodynamical settings of the shelf regions covered by our analysis.

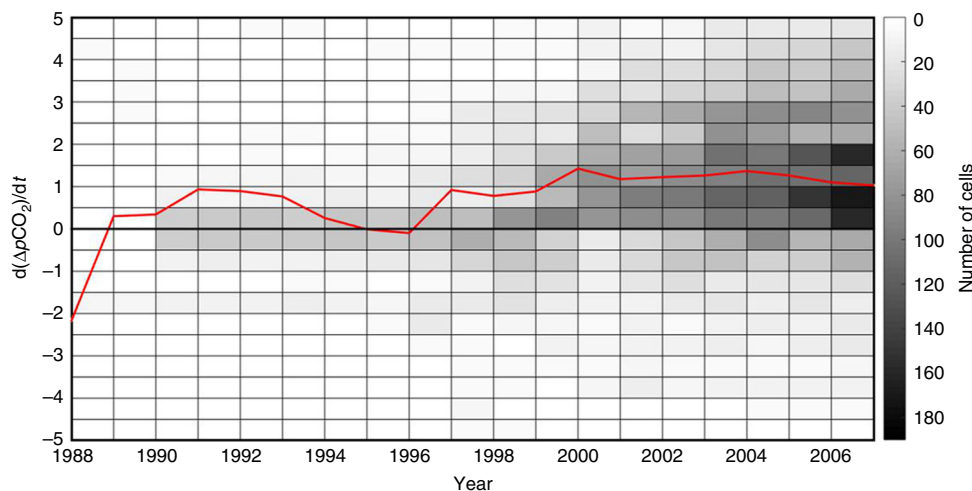
**Global shelf  $\text{CO}_2$  sink.** Globally, our analysis of the 825 temporal trends in  $\Delta p\text{CO}_2$  using winter-only data covers a shelf surface area of  $1.4 \times 10^6 \text{ km}^2$ , which represents  $\sim 6\%$  of the global continental shelves. This includes data from the more isolated cells that were not considered in the previous section. While the coverage is relatively small, heterogeneous and somewhat skewed toward temperate latitudes in the northern hemisphere, it nevertheless covers most of the range of  $p\text{CO}_2$  and SST encountered in continental shelf waters (Supplementary Figures 1 and 2). Exceptions are the low latitudes, which are poorly represented in our data set. While we need to recognize this limitation, the broad coverage in terms of environmental conditions permits us to assemble all estimated trends and assume that they represent a sufficiently unbiased sample of the shelf trends across the globe.



**Fig. 3**  $\Delta p\text{CO}_2$  as a function of time for all cells comprised in the six regions with best data coverage. **a** Baltic Sea, **b** English Channel, **c** Coast of Japan, **d** Labrador Sea, **e** Mid-Atlantic Bight, and **f** North Sea. Red dots correspond to winter data only, black dots to data for all seasons

The bulk of our winter data consistently show trends that are dominantly in accordance with an increase in  $\Delta p\text{CO}_2$  over time. Our narrow definition of the shelf yields a global average  $d\Delta p\text{CO}_2/dt$  of  $+1.3 \pm 1.9 \mu\text{atm yr}^{-1}$ , while the wide definition for geographical extent leads to a smaller average value of  $+0.8 \pm 1.8 \mu\text{atm yr}^{-1}$  (Fig. 2). Thus, our global-scale analysis of winter  $p\text{CO}_2$  data reveals that trends are more likely positive than not and support the idea that air-sea  $p\text{CO}_2$  gradients may have been increasing with time making continental shelves overall an increasing  $\text{CO}_2$  sink for the atmosphere. Nevertheless, as shown by the substantial standard deviations, large differences in  $d\Delta p\text{CO}_2/dt$  can be observed across continental shelves. Within the 200 m water depth boundary, 653 cells (out of 825) display a positive  $d\Delta p\text{CO}_2/dt$ , 76% of which are greater than  $+0.5 \mu\text{atm yr}^{-1}$  (i.e., 495 out of 653; Supplementary Table 1). For 66% of the

latter cells (325 out of 495), the slope of the regression is considered statistically significant using an  $F$ -test with  $p < 0.05$  and 71% with  $p < 0.1$  (Fig. 2). On the other hand, for the 172 cells (out of 825) that display negative  $d\Delta p\text{CO}_2/dt$  values, only 49% are more negative than  $-0.5 \mu\text{atm yr}^{-1}$  (84 out of 172). The trend is still observed when the boundary is relaxed to 500 m or 100 km from the coast. One thousand and sixty-six cells (out of 1364) display a positive  $d\Delta p\text{CO}_2/dt$ , 64% of which is greater than  $+0.5 \mu\text{atm yr}^{-1}$  (i.e., 682 out of 1066) and only 149 out of the 298 non-positive cells having a negative  $d\Delta p\text{CO}_2/dt$  are then characterized by rates more negative than  $-0.5 \mu\text{atm yr}^{-1}$  (Fig. 2). The use of the broader definition of the continental shelves not only decreases the average  $d\Delta p\text{CO}_2/dt$ , but also increases the proportion of cells with  $d\Delta p\text{CO}_2/dt$  between  $-0.5$  and  $+0.5 \mu\text{atm yr}^{-1}$  (39% vs. 30%). Note that applying our method to all



**Fig. 4** Evolution of winter air–sea  $p\text{CO}_2$  gradient for the global shelves over the 1988–2007 period. The gray scale shows, every year, the number of cells for different ranges of  $d(\Delta p\text{CO}_2)/dt$ . The red line provides the evolution of the average  $d(\Delta p\text{CO}_2)/dt$  for all cells with data over time

open ocean waters deeper than 500 m or further than 100 km from the coast yields a much smaller average  $d\Delta p\text{CO}_2/dt$  of  $+0.2 \pm 1.1 \mu\text{atm yr}^{-1}$ , which is close to the open ocean observation<sup>1–6,52</sup>, further supporting the validity of our method.

The results from the analysis using data across the entire year generally confirm the results from the wintertime-only data as exemplified by the change in  $\Delta p\text{CO}_2$  with time for all cells pertaining to the six largest regions used in the regional analysis (Fig. 3). For all regions, the range of  $\Delta p\text{CO}_2$  values observed in winter (red) is largely less than that based on the entire year (black). Globally, calculations performed using deseasonalized data from the entire year allow deriving trends for 3721 cells (Supplementary Table 1). Although much noisier, the overall  $d\Delta p\text{CO}_2/dt$  values using all seasonal data reveal qualitatively similar trends to those observed with data from the winter months only (Supplementary Table 1). The overall proportion of cells displaying statistically significant trends is much lower when all seasonal data are used (22%) than when winter data are retained (45%). Nevertheless, nearly three times more cells display significant trends for which  $d(\Delta p\text{CO}_2)/dt > +0.5 \mu\text{atm yr}^{-1}$  (574) than for which  $d(\Delta p\text{CO}_2)/dt < -0.5 \mu\text{atm yr}^{-1}$  (201), a result in broad agreement with our analysis based on winter data only. Therefore, the analysis of deseasonalized data for all seasons also point toward a tendency for an enhanced shelf uptake of atmospheric  $\text{CO}_2$ .

The rate of change in the air–sea  $\text{CO}_2$  gradient also has varied over time. Figure 4 presents the evolution from 1988 to 2007 of winter  $d\Delta p\text{CO}_2/dt$  calculated for each year over a 15-year time period. Because the bulk of the data available in SOCAT are relatively recent, it is difficult to reconstruct trends earlier than the 1990s. The distribution of rates around the mean value is shown by the gray scale in Fig. 4 and the widening of the distribution can be observed as the number of data points increase but, for any given year, the bulk of the  $d\Delta p\text{CO}_2/dt$  distribution remains constrained within the  $-0.5$  to  $+2.0 \mu\text{atm yr}^{-1}$  range. While uncertainties are high in such an analysis, in particular because the trends from the investigated regions (about 6% of the total shelf area) might not hold for all the others, our results suggest that in addition to the dominance of positive  $d\Delta p\text{CO}_2/dt$ , there is a good probability that the rate of change of the air–sea  $\text{CO}_2$  gradient has also increased over the past 15 years. Indeed, the average  $d\Delta p\text{CO}_2/dt$  appears to remain below  $1 \mu\text{atm yr}^{-1}$  before 1997 but above it since then.

**Implications for the global carbon budget.** Applying the mean rate of change in the winter air–sea  $\text{CO}_2$  gradient identified in Fig. 4 to a globally averaged winter  $\Delta p\text{CO}_2$  of  $+28 \mu\text{atm}$  for the continental shelf seas in the reference year 2000<sup>17</sup>, leads to an increase in water  $p\text{CO}_2$  that has consistently lagged behind the increase in atmospheric  $\text{CO}_2$ . As noted in the previous section,  $d\Delta p\text{CO}_2/dt$  also has increased in recent years ( $+1.2 \mu\text{atm yr}^{-1}$ ). The first records of shelf  $p\text{CO}_2$  date back from the early 1980s and it is thus impossible to reconstruct the earlier evolution of the air–sea exchange from direct observations. Although highly speculative, it is nevertheless interesting to extend the rate of change in the 1980s and early 1990s ( $+0.6 \mu\text{atm yr}^{-1}$ ) estimated here to the earlier decades. This approach allows comparing trends derived from observations alone with earlier modeling work and will stimulate further exploration of coastal  $\text{CO}_2$  trend<sup>28,30</sup>. Our calculations suggest that the magnitude of the average winter  $\Delta p\text{CO}_2$  increased by 69% over the 1988–2007 period. By extrapolating this trend to earlier times, it can be speculated that the continental shelves might indeed have turned from a purported preindustrial source of  $\text{CO}_2$  into a sink for atmospheric  $\text{CO}_2$  as early as in the 1950s, at least during wintertime (Supplementary Figure 3). The occurrence of such a switch from source to sink in the mid-twentieth century would be consistent with previous model results<sup>28</sup>, although our data-based estimate may indicate that the switchover time could have occurred earlier than previously thought. Note that our assessment excludes the high  $p\text{CO}_2$  estuarine and very nearshore (proximal) zone that is believed to be a significant source of  $\text{CO}_2$  for the atmosphere at present<sup>12,16,53,54</sup>. A recent model hindcasts that the uptake rate of anthropogenic  $\text{CO}_2$  by continental shelves has increased rapidly since the 1950s<sup>29</sup>. Although this flux is much less than that modeled for the open ocean uptake<sup>29</sup>, it would imply an increase in the total  $\text{CO}_2$  uptake flux (natural plus anthropogenic) and an increase in the air–sea  $p\text{CO}_2$  gradient in the coastal ocean, assuming that the natural  $\text{CO}_2$  flux in their model does not change. Thus, the conjecture derived from our first global observation-based work is consistent with their model prediction. Nevertheless, this work also highlights the fact that the rate of increase of the air–sea  $p\text{CO}_2$  gradient in continental shelf waters and its importance in global ocean  $\text{CO}_2$  uptake is still poorly understood and deserve further study. In addition, if both observational evidence and model results support the idea that shelves are an increasing sink for the atmospheric  $\text{CO}_2$ , we are far from quantitatively understanding the roles of the physical pump



and biological pumps (NEM and NEC) in explaining this enhanced CO<sub>2</sub> absorption and associated high variability globally. We suggest, however, that a faster exchange of shelf CO<sub>2</sub> with the ocean interior and increased biological production due to anthropogenic nutrient inputs may have slowed down the rate of increase of surface ocean *p*CO<sub>2</sub> in many shelf regions.

In principle, the slower *p*CO<sub>2</sub> increase in shelf waters could increase the gradient and thus the uptake of atmospheric CO<sub>2</sub> in the decades to come, although high spatial variability in air–sea fluxes is to be expected across shelf regions. The shift of shelf waters from releasing to absorbing CO<sub>2</sub> between preindustrial time and the present day, as well as the possibility of shelves becoming a more important sink in the future, is a significant temporally changing term in the global carbon cycle and pathway of exchange for atmospheric CO<sub>2</sub>. It should thus be closely evaluated by further data collection and analysis and be considered in future global carbon cycle models and flux assessments<sup>6,31,35,39,52</sup>.

## Methods

**Definition of the study area.** For this work, we defined the continental shelf as all marine waters shallower than the 200 m isobath. This depth is commonly used in the literature as the depth at which the shelf breaks<sup>12,16,17,31,52</sup>. However, we also report results for a less restrictive definition, where the shelf limit is set at 500 m water depth or within 100 km from the shore (Supplementary Figure 4). This allows inclusion of the wide and deep shelves at high latitudes and of coastal processes that take place in deeper waters in regions where the shelf break is very close to the shore. With both definitions, coastal waters shallower than 20 m as well as internal waters, such as estuaries, fjords, lagoons, or tidal marshes, are excluded from this analysis. The *p*CO<sub>2</sub> data selection was performed using water depths extracted from ETOPO2 and the distance to the coast was provided by SOCAT3. Our narrow and wide definitions of the continental shelf correspond to global surface areas of 22 × 10<sup>6</sup> km<sup>2</sup> and 45 × 10<sup>6</sup> km<sup>2</sup>, respectively. These two values can be considered as lower and upper bounds as they comprise all reported surface areas obtained with other definitions of the continental shelf<sup>52</sup>.

**Data processing.** Recently, numerous continental shelf *p*CO<sub>2</sub> observational data have been quality controlled and included into the SOCAT database<sup>13</sup>. Version 3 released in 2015 comprises more than 14 × 10<sup>6</sup> measurements for the entire ocean, of which 3.4 × 10<sup>6</sup> and 5.2 × 10<sup>6</sup> are located within our narrow and wide shelf definitions, respectively. This unprecedented data coverage offers the opportunity to assess whether global shelf waters show a change in the direction and magnitude of the air–sea *p*CO<sub>2</sub> gradient ( $\Delta p\text{CO}_2 = p\text{CO}_{2,\text{air}} - p\text{CO}_2$ ) over time ( $d(\Delta p\text{CO}_2)/dt$ ).

The coastal zone was divided into regular 0.5 × 0.5 degree cells and all the SOCAT measurements were allocated to a given cell according to their latitudes and longitudes. SOCAT fugacity data (*f*CO<sub>2</sub>) were converted into CO<sub>2</sub> partial pressure (*p*CO<sub>2</sub>) in water using the following equation<sup>53</sup>.

$$(p\text{CO}_2) = f\text{CO}_2(1.00436 - 4.66910^{-5} \text{SST}), \quad (1)$$

where SST is the sea surface temperature in degrees Celsius. For each month, an average  $\Delta p\text{CO}_2$  was calculated within each cell. The winter data (defined as January, February, and March in the Northern Hemisphere and July, August, and September in the Southern Hemisphere) are not modified prior to calculating the linear regressions. The data from all seasons, however, are deseasonalized using monthly *p*CO<sub>2</sub> climatological maps for continental shelves generated by artificial neuronal network interpolations<sup>9</sup>. This monthly *p*CO<sub>2</sub> climatology allowed establishing an average seasonal *p*CO<sub>2</sub> cycle for each grid cell. This signal was then removed from the raw data to perform a deseasonalization prior to calculate the linear regressions.

We found no significant trend in SST in the majority of the cells (i.e., the absolute rate of change in temperature only exceeds 0.1 °C yr<sup>-1</sup> in less than 15% of the cells) and the average temperature change among all 825 cells used for the winter analysis using the narrow definition of the shelf is -0.0021 °C yr<sup>-1</sup>. In addition, warming should lead to a higher water *p*CO<sub>2</sub> and, thus, should reduce  $d(\Delta p\text{CO}_2)/dt$ .

For each data point, an atmospheric *p*CO<sub>2</sub> was also calculated using:

$$(p\text{CO}_2)_{\text{air}} = X\text{CO}_2(P_{\text{baro}} - P_{\text{sw}}), \quad (2)$$

where *P*<sub>baro</sub> is the barometric pressure at sea surface and *P*<sub>sw</sub> is the water pressure at the temperature and salinity of the water within the mixed layer. XCO<sub>2</sub> is the weekly mean CO<sub>2</sub> concentration for dry air extracted from the GLOBALVIEW-CO<sub>2</sub> database<sup>56</sup>. *P*<sub>sw</sub> was calculated assuming 100% humidity using sea surface temperature and salinity and *P*<sub>baro</sub> is the monthly mean barometric pressure at the

sea surface from the NCEP/NCAR Reanalysis database<sup>57</sup>. All the data used were taken from the SOCAT files.

A moving spatial window of 1.5 degrees of width (i.e., three cells) was used to increase the data pool and minimize the effect of anomalous single measurements on our calculations. Effectively, this means that, for a given grid cell, all data located in the surrounding eight cells are also taken into account in the regression calculation<sup>58</sup>. Then, within each 0.5 degree cell, the slope of the linear regression of  $\Delta p\text{CO}_2$  vs. time using the bi-square method was calculated to evaluate  $d(\Delta p\text{CO}_2)/dt$ . Additionally, to reduce the influence of interannual variations in  $\Delta p\text{CO}_2$ , we limited the analysis to cells for which we could extract at least ten data points from five or more different years spanning a period of at least 10 years between the first and last measurement. These operations are performed in similar fashion for winter-only and all-year deseasonalized data. Although the minimum period is short compared to any decadal variability that might be present in the trend, it was chosen to keep a sufficiently large pool of cells in the statistical analysis. Linear regressions were then calculated using the bi-square method. The slope of the linear regression provides the rate of change in  $\Delta p\text{CO}_2$ , which is defined as

$$d(\Delta p\text{CO}_2)/dt = (\Delta p\text{CO}_2(t_2) - \Delta p\text{CO}_2(t_1))/(t_2 - t_1) \quad (3)$$

where *t*<sub>2</sub>–*t*<sub>1</sub> defines the period for which winter data are available for a given cell.

Finally, the cells for which  $d(\Delta p\text{CO}_2)/dt$  could be calculated are clustered into relatively broad regions consisting of groups larger than 50 connected cells and smaller regions consisting of groups larger than 10 connected cells following our narrow definition of the shelf (Supplementary Figure 5). These groups are used as a basis for the regional analysis and allows, for the first time, to analyze consistently temporal trends in winter  $\Delta p\text{CO}_2$  over the global continental shelves in a similar fashion.

**Statistics.** Prior to calculating the linear regressions, several statistical tests were performed for each cell. First, the normality of the distribution of the residuals was evaluated using a Kolmogorov and Smirnov test and >95% of the time series do not exhibit significant deviations from a normal distribution (Supplementary Figure 6a). Then, the existence of autocorrelation within the time series has been diagnosed using a Durbin–Watson’s test. Results yield values clustered around 2, revealing no significant autocorrelation (Supplementary Figure 6b). The consistency of the variance of the residuals over time was assessed using White’s test and significant heteroscedasticity was detected in about half of the times series. As a consequence, the linear regressions were calculated using the bi-square method rather than the simple least square method, which is less robust when the residual is not consistent throughout the entire data set.

These statistical tests were also used to determine the minimum required length of the time series (i.e., data spanning at least 10 years, more than 10 individual data, at least 5 different years with data). Using this set of criteria, the average length of our time series is 18 years. Finally, to assess the statistical significance of the regressions, an *F*-test was performed in each cell (Supplementary Table 1).

**Temporal evolution of  $\Delta p\text{CO}_2$ .** To investigate how the rate of change in air–sea CO<sub>2</sub> gradient,  $d(\Delta p\text{CO}_2)/dt$ , has varied globally over time, the entire SOCAT data set was used to produce 20 subsets, each covering a period of 15 years (from 1980 to 1994, then 1981 to 1995 and so on until 2001 to 2015) and used to calculate the rate of change for the central year of each period. For instance,  $d(\Delta p\text{CO}_2)/dt$  for year 1988 is calculated using data ranging from 1981 to 1995. This method provides estimates for years 1988 to 2006. For each period,  $d(\Delta p\text{CO}_2)/dt$  were calculated for each cell following the procedure described above. The average rate of change in  $\Delta p\text{CO}_2$  for a given period was then calculated as the average of all the rates calculated for each cell for which observations were available (Fig. 4).

A global estimate for the coastal ocean carbon sink for winter of 0.26 Pg C yr<sup>-1,17</sup> was used over a surface area of 30 × 10<sup>6</sup> km<sup>2</sup> in conjunction with the gas transfer velocity of 9.0 cm h<sup>-1</sup> to estimate an average global  $\Delta p\text{CO}_2$  of 28 μatm for the continental shelf seas in the reference year 2000. Year 2000 was selected as the estimate of Laruelle et al.<sup>17</sup> represents an average over the 1990–2011 period. From this reference value, the  $\Delta p\text{CO}_2$  in previous and following years (period 1988–2006) was calculated by adding or subtracting the average  $d(\Delta p\text{CO}_2)/dt$  calculated using the 20 data subsets described above. Earlier than 1988,  $d(\Delta p\text{CO}_2)/dt$  was assumed to be the average over the 1988–1993 period. Using annually averaged atmospheric *p*CO<sub>2</sub> values from Mauna Loa and these  $d(\Delta p\text{CO}_2)/dt$ , estimates of the water *p*CO<sub>2</sub> are then calculated for each year (Supplementary Figure 3). Results show that shelf water *p*CO<sub>2</sub> could have been lower than atmospheric *p*CO<sub>2</sub> as early as 1950.

**Data availability.** The data that support the findings of this study are available from the corresponding author on reasonable request.

Received: 22 February 2017 Accepted: 21 December 2017  
Published online: 31 January 2018

## References

- Takahashi, T. et al. Climatological mean and decadal change in surface ocean pCO<sub>2</sub>, and net sea-air CO<sub>2</sub> flux over the global oceans. *Deep Sea Res. II* **56**, 554–577 (2009).
- IPCC. *The Physical Science Basis. Contribution of Working Group I to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change* (Cambridge University Press, Cambridge, UK and New York, NY, USA, 2013).
- Fay, A. R. & McKinley, G. A. Global trends in surface ocean pCO<sub>2</sub> from in situ data. *Glob. Biogeochem. Cycles* **27**, 541–557 (2013).
- Feely, R. A. et al. Decadal variability of the air-sea CO<sub>2</sub> fluxes in the equatorial Pacific Ocean. *J. Geophys. Res.* **111**, C08S90 (2006).
- Landschützer, P., Gruber, N. & Bakker, D. C. E. Decadal variations and trends of the global ocean carbon sink. *Glob. Biogeochem. Cycles* **30**, 1396–1417 (2016).
- Bates, N. et al. A time-series view of changing ocean chemistry due to ocean uptake of anthropogenic CO<sub>2</sub> and ocean acidification. *Oceanography* **27**, 126–141 (2014).
- Craig, H. in *Earth Science and Meteoritics (F.G. Houtermans volume)* (eds Geiss, J. & Goldberg, E. D.) 103–114 (North-Holland Publ. Co., Amsterdam, 1963).
- Bauer, J. E. et al. The changing carbon cycle of the coastal ocean. *Nature* **504**, 61–70 (2013).
- Hales, B. et al. Satellite-based prediction of pCO<sub>2</sub> in coastal waters of the eastern North Pacific. *Prog. Oceanogr.* **103**, 1–15 (2012).
- Thomas, H., Bozec, Y., Elkalay, K. & de Baar, H. J. W. Enhanced open ocean storage of CO<sub>2</sub> from shelf sea pumping. *Science* **304**, 1005–1008 (2004).
- Cai, W.-J., Dai, M. & Wang, Y. Air-sea exchange of carbon dioxide in ocean margins: a province-based synthesis. *Geophys. Res. Lett.* **33**, L12603 (2006).
- Borges, A. V., Delille, B. & Frankignoulle, M. Budgeting sinks and sources of CO<sub>2</sub> in the coastal oceans: diversity of ecosystems counts. *Geophys. Res. Lett.* **32**, L14601 (2005).
- Bakker, D. C. E. et al. A multi-decade record of high-quality fCO<sub>2</sub> data in version 3 of the surface ocean CO<sub>2</sub> atlas (SOCAT). *Earth Syst. Sci. Data* **8**, 383–413 (2016).
- Cai, W.-J. Estuarine and coastal ocean carbon paradox: CO<sub>2</sub> sinks or sites of terrestrial carbon incineration? *Annu. Rev. Mar. Sci.* **3**, 123–145 (2011).
- Chen, C.-T. A. et al. Air-sea exchanges of CO<sub>2</sub> in the world's coastal seas. *Biogeosciences* **10**, 6509–6544 (2013).
- Laruelle, G. G., Dürr, H. H., Slomp, C. P. & Borges, A. V. Evaluation of sinks and sources of CO<sub>2</sub> in the global coastal ocean using a spatially-explicit typology of estuaries and continental shelves. *Geophys. Res. Lett.* **37**, L15607 (2010).
- Laruelle, G. G., Lauerwald, R., Pfeil, B. & Regnier, P. Regionalized global budget of the CO<sub>2</sub> exchange at the air-water interface in continental shelf seas. *Glob. Biogeochem. Cycles* **28**, 1199–1214 (2014).
- Wanninkhof, R. et al. Global ocean carbon uptake: magnitude, variability and trends. *Biogeosciences* **10**, 1983–2000 (2013).
- Laruelle, G. G. et al. Global high resolution monthly pCO<sub>2</sub> climatology for the coastal ocean derived from neural network interpolation. *Biogeosciences* **14**, 4545–4561 (2017).
- Thomas, H. et al. Rapid decline of the CO<sub>2</sub> buffering capacity in the North Sea and implications for the North Atlantic Ocean. *Glob. Biogeochem. Cycles* **21**, GB4001 (2007).
- Tseng, C. M. et al. Temporal variations in the carbonate system in the upper layer at the SEATS station. *Deep Sea Res. II* **54**, 1448–1468 (2007).
- Salt, L. A. et al. Variability of North Sea pH and CO<sub>2</sub> in response to North Atlantic Oscillation forcing. *J. Geophys. Res. Biogeosci.* **118**, 1584–1592 (2013).
- Park, G.-H. & Wanninkhof, R. A large increase of the CO<sub>2</sub> sink in the western tropical North Atlantic from 2002 to 2009. *J. Geophys. Res.* **117**, C08029 (2012).
- Ishii, M. N. et al. Ocean acidification off the south coast of Japan: A result from time series observations of CO<sub>2</sub> parameters from 1994 to 2008. *J. Geophys. Res.* **116**, C06022 (2011).
- Hauri, et al. Two decades of inorganic carbon dynamics along the West Antarctic Peninsula. *Biogeosciences* **12**, 6761–6779 (2015).
- Shadwick, E. H. et al. Air-sea CO<sub>2</sub> fluxes on the Scotian Shelf: seasonal to multi-annual variability. *Biogeosciences* **7**, 3851–3867 (2010).
- Wang, H., Hu, X. & Sterba-Boatwright, B. A new statistical approach for interpreting oceanic fCO<sub>2</sub> data. *Mar. Chem.* **183**, 41–49 (2016).
- Andersson, A. J. & Mackenzie, F. T. Shallow-water oceans: a source or sink of atmospheric CO<sub>2</sub>? *Front. Ecol. Environ.* **2**, 348–353 (2004).
- Bourgeois, T. et al. Coastal-ocean uptake of anthropogenic carbon. *Biogeosciences* **13**, 4167–4185 (2016).
- Mackenzie, F. T., Lerman, A., & DeCarlo, E. H. in *Treatise on Ocean and Estuarine Science*, v. 4, (eds Middleburg, J. & Laane, R.) 317–342 (Elsevier, 2011).
- Walsh, J. J. *On the Nature of Continental Shelves* (Academic Press, New York, 1988).
- Wesslander, K., Omstedt, A. & Schneider, B. On the carbon dioxide air-sea flux balance in the Baltic Sea. *Cont. Shelf Res.* **30**, 1511–1521 (2010).
- Yasunaka, S. et al. Mapping of the air-sea CO<sub>2</sub> flux in the Arctic Ocean and its adjacent seas: Basin-wide distribution and seasonal to interannual variability. *Polar Sci.* **10**, 323–334 (2016).
- Signorini, S. R. et al. Surface ocean pCO<sub>2</sub> seasonality and sea-air CO<sub>2</sub> flux estimates for the North American east coast. *J. Geophys. Res.* **118**, 1–22 (2013).
- DeGrandpre, M. D., Olbu, G. J., Beatty, C. M. & Hammar, T. R. Air-sea CO<sub>2</sub> fluxes on the US Middle Atlantic Bight. *Deep Sea Res. II* **49**, 4355–4367 (2002).
- Laruelle, G. G. et al. Seasonal response of air-water CO<sub>2</sub> exchange along the land-ocean aquatic continuum of the northeast North American coast. *Biogeosciences* **12**, 1447–1458 (2015).
- Laruelle, G. G., Goossens, N., Arndt, S., Cai, W.-J. & Regnier, P. Air-water CO<sub>2</sub> evasion from US East Coast estuaries. *Biogeosciences* **14**, 2441–2468 (2017).
- Cai, W.-J. et al. Surface ocean alkalinity distribution in the western North Atlantic Ocean margins. *J. Geophys. Res.* **115**, C08014 (2010).
- Landschützer, P. et al. The reinvigoration of the Southern Ocean carbon sink. *Science* **349**, 1221–1224 (2015).
- Jiang, L.-Q., Cai, W.-J., Wanninkhof, R., Wang, Y. & Lüger, H. Air-sea CO<sub>2</sub> fluxes on the U.S. South Atlantic Bight: Spatial and seasonal variability. *J. Geophys. Res.* **113**, C07019 (2008).
- Lee, T. N., Yoder, J. A. & Atkinson, L. P. Gulf Stream Frontal Eddy Influence on Productivity of the Southeast U.S. Continental Shelf. *J. Geophys. Res.* **96**, 22191–22205 (1991).
- Feely, R. A., Sabine, C. L., Hernandez-Ayon, J. M., Ianson, D. & Hales, B. Evidence for upwelling of corrosive “acidified” water onto the continental shelf. *Science* **320**, 1490–1492 (2008).
- Gruber, N. et al. Rapid progression of ocean acidification in the California current system. *Science* **337**, 220–223 (2012).
- Feely, R. A., et al. Chemical and biological impacts of ocean acidification along the west coast of North America. *Estuarine Coast. Shelf Sci.* **183**, 260–270 (2016).
- Wang, D., Gouhier, T. C., Menge, B. A. & Ganguly, A. R. Intensification and spatial homogenization of coastal upwelling under climate change. *Nature* **518**, 390–394 (2015).
- Evans, W., Hales, B., Stratton, P. G. & Ianson, D. Sea-air CO<sub>2</sub> fluxes in the western Canadian coastal ocean. *Prog. Oceanogr.* **101**, 78–91 (2012).
- Marrec, P. et al. Dynamics of air-sea CO<sub>2</sub> fluxes in the northwestern European shelf based on voluntary observing ship and satellite observations. *Biogeosciences* **12**, 5371–5391 (2015).
- Borges, A. V. et al. Inter-annual variability of the carbon dioxide oceanic sink south of Tasmania. *Biogeosciences* **5**, 141–155 (2008).
- Bianchi, A. A. et al. Annual balance and seasonal variability of sea-air CO<sub>2</sub> fluxes in the Patagonia Sea: Their relationship with fronts and chlorophyll distribution. *J. Geophys. Res.* **114**, C03018 (2009).
- Bates, N. R., Mathis, J. T. & Jeffries, M. A. Air-sea CO<sub>2</sub> fluxes on the Bering Sea shelf. *Biogeosciences* **8**, 1237–1253 (2011).
- Fransson, A., Chierici, M. & Nojiri, Y. Increased net CO<sub>2</sub> outgassing in the upwelling region of the southern Bering Sea in a period of variable marine climate between 1995 and 2001. *J. Geophys. Res.* **111**, C08008 (2006).
- McKinley, G. A. et al. Timescales for detection of trends in the ocean carbon sink. *Nature* **530**, 469–472 (2016).
- Laruelle, G. G. et al. Global multi-scale segmentation of continental and coastal waters from the watersheds to the continental margins. *Hydrol. Earth Syst. Sci.* **17**, 2029–2051 (2013).
- Regnier, P. et al. Anthropogenic perturbation of the carbon fluxes from land to ocean. *Nat. Geosci.* **6**, 597–607 (2013).
- Takahashi, T., Sutherland, S & Kozyr, A. Global ocean surface water partial pressure of CO<sub>2</sub> database: measurements performed during 1957–2011 (version 2011). ORNL/CDIAC-160, NDP-088(V2011) (Carbon Dioxide Information Analysis Center, Oak Ridge Natl. Lab., U.S. Dep. of Energy, Oak Ridge, TN, 2012).
- NOAA. GLOBALVIEW-CO<sub>2</sub> (NOAA ESRL, Boulder, CO, 2012).
- Kalnay, E. et al. The NCEP/NCAR 40-year reanalysis project. *Bull. Am. Meteorol. Soc.* **77**, 437–471 (1996).
- Pardo-Igúzquiza, E., Dowd, P. A. & Grimes, D. I. F. An automatic moving window approach for mapping meteorological data. *Int. J. Climatol.* **25**, 665–678 (2005).

## Acknowledgements

G.G.L. was funded as a postdoctoral researcher of FRS-FNRS throughout the execution of this study. We acknowledge the seminal contribution of the Surface Ocean CO<sub>2</sub> Atlas (SOCAT) effort to our study. SOCAT is an international effort, endorsed by the International Ocean Carbon Coordination Project (IOCCP), the Surface Ocean Lower Atmosphere Study (SOLAS), and the Integrated Marine Biosphere Research (IMBeR) program, to deliver a uniformly quality-controlled surface ocean CO<sub>2</sub> database. The many researchers and funding agencies responsible for the collection of data and quality control are thanked for their contributions to SOCAT. The research leading to these results has received funding from the European Union's Horizon 2020 research and innovation program under the Marie Skłodowska-Curie grant agreement no. 643052 (C-

CASCADES project). Goulven G. Laruelle now works at the UMR 7619 Metis, Sorbonne Universités, UPMC, Univ. Paris 06, CNRS, EPHE, IPSL, Paris, France.

### Author contributions

G.G.L. performed all calculations necessary to this study, following an idea central to the conception of this paper by W.-J.C. P.R. coordinated and participated at all stages of the conception and writing of the paper. G.G.L., W.-J.C., and P.R. wrote the manuscript with input by N.G. All co-authors contributed to specific aspects of the analyses and commented on various versions of the manuscript.

### Additional information

**Supplementary Information** accompanies this paper at <https://doi.org/10.1038/s41467-017-02738-z>.

**Competing interests:** The authors declare no competing financial interests.

**Reprints and permission** information is available online at <http://npg.nature.com/reprintsandpermissions/>

**Publisher's note:** Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.



**Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons license, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons license, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons license and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this license, visit <http://creativecommons.org/licenses/by/4.0/>.

© The Author(s) 2018