Effect of gas-transfer velocity parameterization choice on air-sea CO$_2$ fluxes in the North Atlantic Ocean and the European Arctic

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Abstract

The oceanic sink of carbon dioxide (CO$_2$) is an important part of the global carbon budget. Understanding uncertainties in the calculation of this net flux into the ocean is crucial for climate research. One of the sources of the uncertainty within this calculation is the parameterization chosen for the CO$_2$ gas transfer velocity. We used a recently developed software toolbox, called the FluxEngine (Shutler et al., 2016), to estimate the monthly air-sea CO$_2$ fluxes for the extratropical North Atlantic Ocean, including the European Arctic, and for the global ocean using several published quadratic and cubic wind speed parameterizations of the gas transfer velocity. The aim of the study is to constrain the uncertainty caused by the choice of parameterization in the North Atlantic Ocean. This region is a large oceanic sink of CO$_2$, and it is also a region characterised by strong winds, especially in winter but with good in situ data coverage. We show that the uncertainty in the parameterization is smaller in the North Atlantic Ocean and the Arctic than in the global ocean. It is as little as 5% in the North Atlantic and 4% in the European Arctic, in comparison to 9% for the global ocean when restricted to parameterizations with quadratic wind dependence. This uncertainty becomes 46%, 44% and 65%, respectively, when all parameterizations are considered. We suggest that this smaller uncertainty (5% and 4%) is caused by a combination of higher than global average wind speeds in the North Atlantic (> 7 ms$^{-1}$) and lack of any seasonal changes in the direction of the flux direction within most of the region. We also compare the impact of using two different in situ pCO$_2$ datasets (Takahashi et al. (2009) and SOCAT versions 1.5 and 2.0) for the flux calculation. The annual fluxes using the two data sets differ by 8% in the North Atlantic and 19% in the European Arctic. The seasonal fluxes in the Arctic computed from the two datasets disagree with each other possibly due to insufficient spatial and temporal data coverage, especially in winter.

1. Introduction

The region of extratropical North Atlantic Ocean, including the European Arctic, is a region responsible for the formation of deep ocean waters (see Talley (2013) for a recent review). This process, part of the global overturning circulation, makes the area a large sink of atmospheric CO$_2$ (Takahashi et al., 2002; Takahashi et al., 2009; Landschützer et al., 2014; Le Quéré et al., 2015). Therefore, there is a widespread interest in tracking the changes in the North Atlantic net carbon dioxide fluxes, especially as models appear to predict a decrease in the sink volume later this century (Halloran et al., 2015).

The trend and variations in the North Atlantic CO$_2$ sinks has been intensively studied since observations have shown it appeared to be decreasing (Lefèvre et al., 2004). This decrease on interannual time scales has been confirmed by further studies (Schuster and Watson, 2007) and this trend has continued in recent years North of 40° N (Landschützer et al., 2013). It is not certain how many of these changes are the result of long-term changes, decadal changes in atmospheric forcing—namely the North Atlantic Oscillation (González-Dávila et al., 2007; Thomas et al., 2008; Gruber 2009; Watson et al., 2009) or changes in meridional overturning circulations (Pérez et al., 2013).
Recent assessments of the Atlantic and the Arctic net sea-air CO$_2$ fluxes (Schuster et al., 2013) and the global ocean net carbon uptake (Wanninkhof et al., 2013) show that the cause is still unknown.

To study the rate of the ocean CO$_2$ sink and especially its long-term trend, one needs to first constrain the uncertainty in the flux calculation. The global interannual variability in air-sea CO$_2$ fluxes can be about 60% due to differences in $p$CO$_2$ and 35% by gas transfer velocity $k$ parameterization (Couldrey et al., 2016). Sources of uncertainty include sampling coverage, the method of data interpolation, data quality of the fugacity of CO$_2$ ($f$CO$_2$), the method used for normalization of fugacity data to a reference year in a world of ever increasing atmospheric CO$_2$ the measurement uncertainty in all the parameters used to calculate the fluxes (including partial pressure in water and air, bulk and skin water temperatures, air temperatures, wind speed etc.) and some which are not usually included in the calculations but most probably influence the flux values (sea state parameters, air bubble void fraction, surfactant effects etc.) as well as the choice of gas transfer velocity $k$ parameterization formula (Landschützer et al., 2014; Woolf et al., 2015a, 2015b). It has also been identified that the choice of the wind data product provides an additional source of uncertainty in gas transfer velocity, even by 10% - 40%, and the choice of the wind speed parameterization may cause variability in $k$ as much as about 50% (Gregg et al., 2014; Couldrey et al., 2016). In this work we have analyzed solely the effects of the choice between various published empirical winds driven gas transfer parameterizations. The North Atlantic is one of the regions of the world ocean best covered by CO$_2$ fugacity measurements (Watson et al., 2011), the Arctic seas coverage is much poorer, especially in winter (Schuster et al., 2013).

In the literature there are many different parameterizations to choose from and most depend on a cubic or quadratic wind speed relationship. The choice of the appropriate parameterization is not trivial as indicated by the name of an international meeting which focused on this topic (“$k$ conundrum” workshop, COST-735 Action organized meeting in Norwich, February 2008). The conclusions from this meeting have been incorporated into a recent review book chapter (Garbe et al., 2014). This paper concentrates on quantifying the uncertainty caused by the choice of the gas transfer velocity parameterization in the North Atlantic and the European Arctic. These regions were chosen as they are the areas for which many of the parameterizations were originally derived. They are also regions with wind fields skewed towards higher winds (in comparison to the global average) enabling the effect of stronger winds on the net flux calculations to be investigated by using published gas transfer velocity formulas.

2. Methods

2.1 Datasets

We calculated net air-sea CO$_2$ fluxes using a set of software processing tools called the ‘FluxEngine’ (Shutler et al., 2016), which was created as part of European Space Agency funded OceanFlux Greenhouse Gases project (http://www.oceanflux-ghg.org). The tools were developed to provide the community with a verified and consistent toolbox and to encourage the use of satellite Earth Observation (EO) data for studying air-sea fluxes. The toolbox source code can be downloaded or alternatively there is a version that can be run through a web interface. Within the online web interface, a suite of reanalysis data products, in situ and model data are available as input to the toolbox. The FluxEngine allows the users to select several different air-sea flux parameterizations producing monthly global gridded net air-sea fluxes products with 1º x 1º spatial resolution. The output consists of twelve NetCDF files (one file per month). One monthly composite file includes the mean (first order moment), median, standard deviation and the second, third and fourth order moments. There is also information (meta data) about origin of data inputs. For example, the monthly EO input data include: rain intensity, wind speed and direction, % of sea ice cover from monthly model data, ECMWF air pressure, whitecapping (Goddijn-Murphy et al.,
2011), two options for monthly datasets of $pCO_2$, Sea Surface Temperature (SST), salinity. The user then needs to choose the different components and structure of the net air-sea gas flux calculation and choose the transfer velocity parameterization.

For the calculations, we used $pCO_2$ and salinity values from Takahashi et al. (2009) climatology which was based on more than 3 million measurements of surface water $pCO_2$ in open-ocean environments during non El Nino conditions. For some calculations we used, as an alternative, Surface Ocean CO$_2$ Atlas (SOCAT) version 1.5 and 2.0 (Sabine et al., 2013; Pfeil et al., 2013; Bakker et al., 2014) $pCO_2$ and associated SST data. SOCAT is a community driven dataset containing 6.3 and 10.1 million surface water CO$_2$ fugacity values for version 1.5 and 2.0, respectively, with a global coverage. The SOCAT databases have been re-analysed and then converted to climatologies using the methodology described in Goddijn-Murphy et al. (2015). All the climatologies were calculated for year 2010 with the FluxEngine toolset. The SSTskin (defined within Group for High Resolution SST (GHRSSST) as temperature of the surface measured by an infrared radiometer operating at the depth of ~10-20 µm) values were taken from the Advance Along Track Scanning Radiometer (ESA/ARC/(A)ATSR) Global Monthly Sea Surface dataset (Merchant et al., 2012) in the case of both datasets, and have been preprocessed in the same way for use with the FluxEngine (Shutler et al., 2016).

We used Earth Observation (EO) wind speed and sea roughness ($\sigma_0$ – altimeter backscatter signal in Ku band from GlobWave L2P products) data obtained from the European Space Agency (ESA). The GlobWave satellite products give a “uniform” set of along track satellite wave data from all available Altimeters (spanning multiple space agencies) and from ESA Synthetic Aperture Radar (SAR) data and are publicity available at the Ifremer/CERSAT cloud (http://globwave.ifremer.fr/products/data-access). Wave data are collected from six altimeter missions (Topex/POSEIDON, Jason-1/2, CryoSAT, GEOSAT and GEOSAT Follow On) and from ESA Synthetic Aperture Radar (SAR) missions, namely ERS-1/2 and ENVISAT. All data come in netCDF-3 format.

All analyses were performed using global data contained in the FluxEngine software. From the gridded product ($1^\circ \times 1^\circ$) we extracted data from the extratropical North Atlantic Ocean (north of 30º N), and its subset, the European Arctic (north of 64º N). For comparison, we also calculated fluxes in the Southern Ocean (south of 40º S). Hereafter we follow the convention of that sources of CO$_2$ (upward ocean-to-atmosphere gas fluxes) are positive and sinks (downward atmosphere-to-ocean gas fluxes) are negative. We give all results of net CO$_2$ fluxes in the SI unit of Pg (Pg is $10^{15}$ g which is numerically identical to Gt).

2.2. $k$ parameterizations

The flux of CO$_2$ at the interface of air and the sea is controlled by wind speed, sea state, sea surface temperature (SST) and other factors. We estimate the net air-sea flux of CO$_2$ ($F$, mg C m$^{-2}$ day$^{-1}$) as the product of gas transfer velocity ($k$, m s$^{-1}$) and the difference in CO$_2$ concentration (gm$^{-3}$) in the sea water and its interface with the air (Land et al., 2013). The concentration of CO$_2$ in sea water is the product of its solubility ($\alpha$, gm$^{-3}$ µatm$^{-1}$) and its fugacity ($fCO_2$, µatm). Solubility is in turn, a function of salinity and temperature. Hence F is defined as:

$$F = k (\alpha_w fCO_2W - \alpha_s fCO_2A)$$  \hspace{1cm} (1)

where the subscripts denote values in water (W) and the air-sea interface (S) and in the air (A). We can exchange fugacity with the partial pressure (their values differ by <0.5 % over the temperature range considered) (McGillis et al., 2001). So equation (1) now becomes:

$$F = k (\alpha_w pCO_2W - \alpha_s pCO_2A)$$  \hspace{1cm} (2)
One can also ignore the differences between the two solubilities, and just use the waterside solubility $\alpha_W$. Equation (2) will then become:

$$F = k \alpha_W (p\text{CO}_2W - p\text{CO}_2A)$$

(3)

This formulation is often referred to as the ‘bulk parametrization’.

In this study we chose to analyze the air-sea gas fluxes using five different gas transfer parameterizations ($k$). All of them are wind speed parameterizations, but differ in the formula used:

$$k = \sqrt{(660.0/ \text{Sc_{skin}}) \times (0.212 \ U_{10}^2 + 0.318 \ U_{10})}$$

(Nightingale et al., 2000),

(4)

$$k = \sqrt{(660.0/ \text{Sc_{skin}}) \times 0.254 \ U_{10}^2}$$

(Ho et al., 2006),

(5)

$$k = \sqrt{(660.0/ \text{Sc_{skin}}) \times 0.0283 \ U_{10}^3}$$

(Wanninkhof and McGillis, 1999),

(6)

$$k = \sqrt{(660.0/ \text{Sc_{skin}}) \times 0.251 \ U_{10}^2}$$

(Wanninkhof, 2014),

(7)

$$k = \sqrt{(660.0/ \text{Sc_{skin}}) \times (3.3 + 0.026 \ U_{10}^3)}$$

(McGillis et al., 2001),

(8)

where $\text{Sc_{skin}}$ stands for the Schmidt numbers at the skin surface, a function of SST ($[= \text{(kinematic viscosity of water)/(diffusion coefficient of CO}_2\text{ in water)}]$), 660.0 is the Schmidt number corresponding to values of carbon dioxide at 20 ºC in seawater, $U_{10}$ is the wind speed 10 m above the sea surface.

In addition to the purely wind driven parameterizations, we have used the combined Goddijn-Murphy et al. (2012) and Fangohr and Woolf (2007) parameterization, which was developed as a test algorithm within of OceanFlux GHG Evolution project. This parameterization separates contributions from direct- and bubble-mediated gas transfer as suggested by Woolf (2005). Its purpose is to enable a separate evaluation of the effect of the two processes on air-sea gas fluxes and it is an algorithm that has yet to be calibrated. We used two versions of this parameterization: wind driven direct transfer (using the U10 wind fields) and radar backscatter driven direct transfer (using mean wave square slope) as described in Goddijn-Murphy et al. (2012).

3. Results

Using the FluxEngine software, we have produced global gridded monthly net CO$_2$ air-sea fluxes and from these we have extracted the values for the two study regions, the extratropical North Atlantic Ocean and separately for its subset - the European Arctic seas. Figure 1 shows maps of the monthly mean air-sea CO$_2$ fluxes for the North Atlantic, calculated with Nightingale et al. (2000) (hereafter called N2000) $k$ parameterization and the Takahashi et al. (2009) climatology for the whole year and for each season. The area, as a whole, is a sink of CO$_2$ but some regions close to North Atlantic Drift and East Greenland Current (Figure 2) are net sources. At the seasonal maps one can see more variability affects by physical process (with temperature changes causing maximum in-water pCO$_2$ in summer) or biological activity (with phytoplankton blooms causing
summer values to be lowest in the annual cycle). For example, the areas close to the North Atlantic
Drift And East Greenland current are sinks of CO₂ in the summer (likely due to the growth of
phytoplankton) while the southern most areas of the region become CO₂ sources in summer and
autumn (which is likely to be due to the effect of sea-water temperature changes). Much of this
variability is caused by changes of the surface water pCO₂ values, shown in Figure 3 for the whole
year and for each season (and variability in atmospheric CO₂ partial pressure, not shown). However,
the flux is proportional to the product of ΔpCO₂ and k. In most parameterizations k is a function of
wind speed (eqs. 4-8). The mean wind speed U₀ for the whole year and each season are shown in
Figure 4. The wind speeds in the North Atlantic are higher than the mean value in the world ocean
(which is 7 m s⁻¹; Couldrey et al., 2016), with mean values higher than 10 m s⁻¹ in many regions of
the study area in all seasons except for the summer (with highest values in winter). This is important
because the air-sea flux depends not only on average wind speed but also on its distribution (see
Discussion below). This effect is especially visible between formulas with different powers of U₀.
Figure 5 shows the difference in the air-sea CO₂ fluxes calculated using two example
parameterizations: one proportional to U₀⁻³ (eq. 6) and one to U₀⁻² (eq. 7), namely Wanninkhof and
can be seen that the “cubic” function results in higher absolute air-sea flux values when compared
to the “quadratic” function in the regions of high winds, and lower absolute air-sea flux values in
weaker winds.

Figure 6 shows the monthly values of air-sea CO₂ fluxes for the five parameterizations (eq. 4-8) for
 the North Atlantic and the European Arctic. The regions are sinks of CO₂ in every month, although
August is close to neutral for the North Atlantic. The results using cubic parameterizations (eqs. 6
and 8) are higher in absolute values, by up to 30% for WMcG1999 and 55% for McGillis (2001)
(hereafter called MG2001), in comparison to the “quadratic” of N2000 (eq. 4). The other two
“quadratic” parameterizations W2014 and Ho et al. (2006) (hereafter called H2006) (eqs. 5 and 7)
resulted in fluxes within 5% of N2000. In addition to the five parameterizations Figure 7 presents
results for both of the OceanFlux GHG Evolution formulas (using wind and radar backscatter data).
The mean and standard deviations of the parameterization ensemble are shown as grey vertical
lines. The standard deviation in global fluxes is similar to previous estimates (Sweeney et al., 2007,
Landschützer et al., 2014) but they cannot be directly compared due to different parameterization
choices and methodologies. Annual net fluxes for the North Atlantic, Southern and global ocean as
well as for the European Arctic are shown in Table 1. The results show that the annual North
Atlantic net air-sea CO₂ sink, depending on the formula used, varies from -0.38 Pg C for N2000 to
-0.56 Pg C for MG2001. In the case of global net air-sea CO₂ sink the values are -1.30 Pg C and
-2.15 Pg C, respectively. Table 1 as well as Figure 7 shows the same data “normalized” to the N2000
data (divided by value), which allows us to visualize the relative differences (in Table 1 values in
parentheses). In the case of the North Atlantic using the “quadratic” W2014 and H2006
parameterizations results in a net air-sea flux that are 4% and 5% higher in absolute values,
respectively, than the equivalent N2000 result, while the “cubic” WMcG1999 and MG2000 results
in values that are 28% and 44% higher, respectively, than N2000 results, for this regions. The
respective values for the Arctic are 3% for W2014 and 4% for H2006, as well as 28% for
WMcG1999 and 44% for MG2001 than N2000. In the case of global net air-sea CO₂ fluxes the
equivalent values are 8% (W2014) and 9% (H2006) higher than the N2000 result for the quadratic
functions as well as 33% (WMcG1999) and 65% (MG2001) for cubic ones. The OceanFlux GHG
parameterization for the backscatter and wind-driven versions, results in net air-sea CO₂ fluxes
higher for North Atlantic Ocean than the N2000, that are 38% and 47%, respectively, and in the
global case the values, for those two versions, were 44% and 52% higher, respectively, than N2000
values. The spread of the Arctic values was lower than that of the Atlantic ones (see Table 1). On
the other hand, the values for the Southern Ocean were slightly higher than for the North Atlantic
but lower than the global ones, with the exception of the OceanFlux GHG parameterizations.
All the above results were obtained with the Takahashi et al. (2009) pCO$_2$ climatology and for comparison, we have also calculated the air-sea CO$_2$ fluxes using the re-analysed SOCAT versions 1.5 and 2.0 data (which were converted to climatologies using methodology described in Godijn-Murphy et al., 2015). Figure 8 shows the results using the N2000 $k$ parameterization for all three of the datasets (Takahashi et al. (2009) and both SOCAT versions). In the case of the North Atlantic Ocean study area, although the monthly values show large differences (using both SOCAT datasets results in a larger sink in summer and smaller in winter compared to Takahashi et al. (2009)), the annual values are similar: -0.38 Pg C for both Takahashi et al. (2009) and SOCAT v1.5 and -0.41 Pg C for SOCAT v2.0. In the case of the European Arctic the situation is very different, with Takahashi et al. (2009) and SOCAT dataset derived climatologies resulting in inverse seasonal variability but with annual net air-sea CO$_2$ fluxes results that are similar: -0.102 Pg C for Takahashi et al. (2009), -0.085 Pg C for SOCAT v1.5 and -0.088 Pg C for SOCAT v2.0.

4. Discussion

Our results show that using the three “quadratic” parameterizations (Nightingale et al., 2000; Ho et al., 2006 and Wanninkhof, 2014) air-sea fluxes are within 5% of each other in the case of the North Atlantic (Table 1, values in parentheses). This discrepancy is smaller than the 9% difference identified for the global case (Table 1 and Fig. 7). This confirms that at present, these different parameterizations are interchangeable for the North Atlantic as this range is within the experimental uncertainty (Nightingale, 2015). The three parameterizations were derived using different methods and data from different regions, namely passive tracers and dual-trace experiments in the North Sea in the case of Nightingale et al. (2000), dual tracers in the Southern Ocean in the case of Ho et al. (2006), and global ocean $^{14}$C inventories in the case of Wanninkhof (2014). The differences between the quadratic and cubic parameterization are large, and instead of the quadratic functions that are supported by several lines of evidence (see Garbe et al., 2014 for discussion), the cubic function are not completely refuted by the available observation. Therefore, it is important to notice that a choice of one of the available cubic functions may leads to net air-sea CO$_2$ fluxes that are considerably larger in absolute values, by up to 33% in the North Atlantic Ocean and more than 50% in the global ocean.

The above results imply smaller relative differences between the parameterizations in the North Atlantic Ocean than in the global ocean. This is interesting because the North Atlantic is the region of strong winds and over most of its area there are no seasonal changes in the air-sea flux direction (Fig. 1). For example in the South Atlantic, the annual mean wind speed is 8.5 m s$^{-1}$ which is lower values of wind speed than in the North Atlantic (9 m s$^{-1}$) and the range of seasonal changes in the air-sea CO$_2$ fluxes are from -0.05 to +0.05 Pg C yr$^{-1}$ with difference between parameterizations lower than in the North Atlantic (Le Quéré et al., 2007; Takahashi et al., 2009). Takahashi et al. (2009) also indicate that the air-sea CO$_2$ fluxes difference in the Southern Ocean is strongly dependent on the choice of the gas transfer parameterizations and wind speed. Smaller differences in the North Atlantic Ocean than in the global ocean are surprising, given that at least some of the older parameterizations (e.g. W2009 or WMcG1999) were developed using a smaller range of winds than what occurs in the North Atlantic. There may be two reasons for this. First, when comparing quadratic and cubic parameterizations (Fig. 9), the cubic parameterization implies higher air-sea fluxes for high winds, whereas the quadratic ones lead to higher fluxes for weaker winds. This difference can be presented in arithmetic terms. Let us assume two functions of wind speed $U$, $F_1(U)$ quadratic and $F_2(U)$ cubic:

$$F_1(U) = a U^2,$$
$$F_2(U) = b U^3.$$
The difference between the two functions $\Delta F$ is equal to:

$$\Delta F = F_2 - F_1 = b \ U^3 - a \ U^2 = b \ U^2 (U - a)^1 = b \ U^2 (U - U_s)$$  \hspace{1cm} (11)$$

where $U_s = a \ b^{1.5}$. The difference is positive for wind speeds greater than $U_s$ and negative for winds less than $U_s$. $U_s$ is the value of wind speed for which the two functions intersect. In the case of equations (6) and (7), where $a = 0.251$ and $b = 0.0283$, they imply that $U_s = 8.87 \text{ m s}^{-1}$. In fact all of the functions presented in Fig. 9 produce very similar values for $U_s$, all of which are close to $9 \text{ m s}^{-1}$. This value is very close to average wind speed in the North Atlantic (Fig. 4). This is one of the reasons of the small relative difference in net air-sea fluxes. The spread of flux values for the Southern Ocean seems to support this conclusion, being larger than that in the North Atlantic. The Southern Ocean has on average stronger winds than the North Atlantic (including also the Arctic Seas) which seems to have the smallest spread of flux values for different parameterizations. The other reason of smaller relative differences between the parameterizations in the North Atlantic than in the global ocean is the lack of seasonal variation in the sign of the air-sea flux. In the case of seasonal changes in the air-sea flux direction (caused by seasonal changes in water temperature or primary productivity), with winds stronger than $U_s$ in some seasons and weaker in others (usually strong winds in winter and weak in summer), the fluxes partly cancel each other. The difference between cubic and quadratic parameterizations adds to each other due to simultaneous changes in the sign of both fluxes itself and the $U - U_s$ term. This effect of seasonal variation has been suggested to us based on available observations (A. Watson, University of Exeter – personal communication) but we are unaware of any paper investigating it or even describing it explicitly.

In addition to the five parameterizations described above, we calculated the air-sea fluxes using the OceanFlux GHG Evolution combined formula, which is based on knowledge that air-sea exchange is enhanced by air-entraining wave breaking and bubble-mediated transfer, especially for the less soluble gases than CO$_2$. Goddijn-Murphy et al. (2016) assume a linear wind relationship for dimethyl sulphide (DMS) and an additional bubble-mediated term for less soluble gases, parameterized with whitecap coverage. The resulting air-sea fluxes are higher in absolute terms, than all of the quadratic functions considered in this study, and are closer in value to cubic parameterization. This may mean that the bubble mediated term of Fangohr and Woolf (2007) is overestimating the bubble component, implying the need for a dedicated calibration effort. This question will be the subject of further studies in the OceanFlux GHG Evolution project.

Using both Takahashi et al. (2009) climatology and SOCAT datasets (Fig. 8) results in similar annual net air-sea CO$_2$ fluxes in the North Atlantic; however it should be noted that they show different seasonal variations. This may have been caused by slightly different time periods of the datasets as the SOCAT-based dataset contains more recent data. It should be noted that a significant part of the data from Takahashi et al. (2009) are included in SOCAT so the differences in the European Arctic may be due to the sparse data coverage and possible interpolation artifacts (Goddijn-Murphy et al., 2015) or to processing of the data through the FluxEngine. A recent paper (Coulbrey et al., 2016) using even more high latitude data than were available in the SOCAT versions 1.5 and 2.0, which we used, shows similar seasonal pattern as SOCAT. Still, this discrepancy makes us treat the net air-sea CO$_2$ fluxes results from the Arctic with much less confidence than the values for the whole North Atlantic. It is impossible to decide in this study which dataset is more accurate as only new data can settle this. However, new data, not included in the SOCAT versions we used, have been available to the recent analysis by Yasunaka et al. (2016). The observed $p$CO$_2$ data (Fig. 4 in Yasunaka et al., 2016), especially since 2005, show clearly an annual cycle compatible with the SOCAT seasonal flux variability.

5. Conclusions
In this paper we have studied the effect of the choice of gas transfer velocity parameterization on the net CO$_2$ air-sea gas fluxes in the North Atlantic and the European Arctic using the recently developed FluxEngine software. The results show that the uncertainty caused by the choice of the $k$ formula is smaller in the North Atlantic and in the Arctic than it is globally. The difference in the annual net air-sea CO$_2$ fluxes caused by the choice of the parameterization is 5% in the North Atlantic and 4% in the European Arctic, comparing to 9% globally for the studied functions with quadratic wind dependence. It is up to 46% different for the North Atlantic, 36% for the Arctic and 65% globally when comparing cubic and quadratic functions. In both cases the uncertainty in the North Atlantic and the Arctic regions are smaller than the global case. We explain the smaller North Atlantic variability to be a combination of, firstly, higher than global average wind speeds in the North Atlantic, close to 9 m s$^{-1}$, which is the wind speed at which most $k$ parameterization have similar values, and secondly the all-season CO$_2$ sink conditions in most North Atlantic areas. We repeated the analysis using Takahashi et al. (2009) and SOCAT $p$CO$_2$ derived climatology and find that although the seasonal variability in the North Atlantic is different the annual net air-sea CO$_2$ fluxes are within 8% in the North Atlantic and 19% in the European Arctic. The seasonal flux calculated from the two $p$CO$_2$ datasets in the Arctic have inverse seasonal variations, indicating possible under sampling (aliasing) of the $p$CO$_2$ in this polar region and therefore highlighting the need to collect more polar $p$CO$_2$ observations in all months and seasons.

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Figure 3. Seasonal and annual pCO$_2$ values ($\mu$atm) in surface waters of the North Atlantic, estimated using the Takahashi et al. (2009) climatology a) annual, b) DJF (winter), c) MAM (spring), d) JJA (summer), e) SON (autumn). The gaps (white areas) are due to missing data, land and ice masks.

Figure 4. Wind speed distribution $U_{10}$ (ms$^{-1}$) in the North Atlantic used to determine the relationship between gas transfer velocity and air-sea CO$_2$ fluxes a) annual, b) DJF (winter), c) MAM (spring), d) JJA (summer), e) SON (autumn). The gaps (white areas) are due to missing data, land and ice masks.

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Figure 6. Monthly values of CO$_2$ air-sea fluxes (Pg month$^{-1}$) for the five parameterizations (eq. 4-8) a) the North Atlantic, b) the European Arctic.

Figure 7. Annual air-sea fluxes of CO$_2$ for the five (eq. 4-8) parameterizations as well as for backscatter (default) and wind driven OceanFlux GHG parameterizations normalized to flux values of Nightingale et al. (2000) $k$ parameterization (see text) a) globally, b) the North Atlantic c) the European Arctic, d) the Southern Ocean. Average values for all parameterization and standard deviations are marked as vertical gray lines.

Figure 8. Comparison of monthly air-sea CO$_2$ fluxes calculated with different pCO$_2$ datasets (Takahashi et al., 2009, SOCAT v. 1.5 and 2.0) using the same $k$ parameterization (Nightingale et al., 2000) a) the North Atlantic, b) the European Arctic.

Figure 9. Different $k$ parameterizations as a function of wind speed.
Table 1. Annual air-sea CO₂ fluxes (in Pg) using different k parameterizations. The values in parentheses are fluxes normalized to Nightingale et al., 2000 (as in Fig. 7)

<table>
<thead>
<tr>
<th></th>
<th>Global</th>
<th>Arctic</th>
<th>North Atlantic</th>
<th>Southern Ocean</th>
</tr>
</thead>
<tbody>
<tr>
<td>Nightingale et al., 2000</td>
<td>-1.30(1.00)</td>
<td>-0.102(1.00)</td>
<td>-0.382(1.00)</td>
<td>-0.72(1.00)</td>
</tr>
<tr>
<td>Ho et al., 2006</td>
<td>-1.42(1.09)</td>
<td>-0.106(1.04)</td>
<td>-0.402(1.05)</td>
<td>-0.76(1.06)</td>
</tr>
<tr>
<td>Wanninkhof and McGillis, 1999</td>
<td>-1.73(1.33)</td>
<td>-0.130(1.28)</td>
<td>-0.490(1.29)</td>
<td>-0.93(1.30)</td>
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<td>Wanninkhof, 2014</td>
<td>-1.40(1.08)</td>
<td>-0.105(1.03)</td>
<td>-0.398(1.04)</td>
<td>-0.76(1.05)</td>
</tr>
<tr>
<td>McGillis et al., 2001</td>
<td>-2.15(1.65)</td>
<td>-0.147(1.44)</td>
<td>-0.557(1.46)</td>
<td>-1.08(1.49)</td>
</tr>
<tr>
<td>OceanFlux GHG wind driven</td>
<td>-1.98(1.52)</td>
<td>-0.138(1.36)</td>
<td>-0.560(1.47)</td>
<td>-1.14(1.58)</td>
</tr>
<tr>
<td>OceanFluxGHG backscatter</td>
<td>-1.88(1.44)</td>
<td>-0.130(1.27)</td>
<td>-0.526(1.38)</td>
<td>-1.09(1.51)</td>
</tr>
</tbody>
</table>
(mg C m\(^{-2}\) day\(^{-1}\))
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a) $\text{(mg C m}^{-2} \text{ day}^{-1})$

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Annual net global CO2 flux normalized to N2000

- k_OceanFluxGHG
- k_OceanFluxGHG_kd_wind
- k_McGillis2001
- k_Wanninkhof2014
- k_Wanninkhof1999
- k_Ho2006
- k_Nightingale2000

Annual net North Atlantic CO2 flux normalized to N2000

- k_OceanFluxGHG
- k_OceanFluxGHG_kd_wind
- k_McGillis2001
- k_Wanninkhof2014
- k_Wanninkhof1999
- k_Ho2006
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