Using Transformation and Formation Maps to Study the Role of Air–Sea Heat Fluxes in North Atlantic Eighteen Degree Water Formation

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ABSTRACT

The Walin water mass framework quantifies the rate at which water is transformed from one temperature class to another by air–sea heat fluxes (transformation). The divergence of the transformation rate yields the rate at which a given temperature range is created or destroyed by air–sea heat fluxes (formation). Walin’s framework provides a precise integral statement at the expense of losing spatial information. In this study the integrand of Walin’s expression to yield transformation and formation maps is plotted and used to study the role of air–sea heat fluxes in the cycle of formation–destruction of the 18°C layer in the North Atlantic.

Using remotely sensed sea surface temperatures and air–sea heat flux estimates based on both analyzed meteorological fields and ocean data–model syntheses for the 3-yr period from 2004 to 2006, the authors find that Eighteen Degree Water (EDW) is formed by air–sea heat fluxes in the western part of the subtropical gyre, just south of the Gulf Stream. The formation rate peaks in February when the EDW layer is thickened by convection owing to buoyancy loss. EDW is destroyed by air–sea heat fluxes from spring to summer over the entire subtropical gyre. In the annual mean there is net EDW formation in the west to the south of the Gulf Stream, and net destruction over the eastern part of the gyre. Results suggest that annual mean formation rates of EDW associated with air–sea fluxes are in the range from 3 to 5 Sv (Sv = 10⁶ m³ s⁻¹). Finally, error estimates are computed from sea surface temperature and heat flux data using an ensemble perturbation method. The transformation/formation patterns are found to be robust and errors mostly affect integral quantities.

1. Introduction

The main purpose of the present study is to demonstrate how transformation and formation maps, inspired by Walin’s (1982) integral water mass transformation framework, can be used to yield spatial and temporal information about water mass formation–destruction processes associated with air–sea fluxes. Conventional applications of the Walin approach yields integral statements about water mass transformation and formation rates based on air–sea fluxes integrated over outcrops. Here we demonstrate the utility of mapping out an appropriately defined “integrand” over the seasonal cycle to yield quantitative regional and temporal information about where and when water masses are formed. Brambilla et al. (2008) have recently used transformation maps to study North Atlantic Subpolar Mode Water. We use the same technique here but also investigate the utility of mapping formation as well as transformation rates.

To illustrate the method in an interesting and important context, we focus on the contribution of air–sea heat fluxes to the volume of water between 17°C and 19°C, which is called Eighteen Degree Water (EDW).¹ The thickness of the 18°C layer is plotted from a new ocean atlas: the Ocean Comprehensive Atlas (OCCA) as described in section 3a; see also Forget (2009) and Fig. 1a. The layer is particularly thick south of the Gulf Stream.

¹ Here we use the term “Eighteen Degree Water” in its literal sense and define it to be water with a temperature in the range of 18°C ± 1°C. It is not necessarily low potential vorticity water.
Stream: the annual mean depth of the 18°C surface is 
\( \pm 300 \) m and its maximum thickness (centered around 35°N, 55°W) varies from 450 m in late winter to 250 m in late summer. Argo profiles within the 10° × 5° white box centered on 35°N, 55°W, marked in Fig. 1a, are plotted over three annual cycles in Fig. 1b. Data from the OCCA, sampled to mimic the Argo profiles, is shown in Fig. 1c. The Argo profiles and the OCCA both clearly reveal the cycle of thickening and thinning of the EDW layer, which we now study using transformation and formation maps.

The paper is organized as follows: in section 2 we describe how the Walin water mass framework can be used to create transformation and formation maps. In section 3 we show how transformation and formation maps can be used to study EDW. The datasets for which the maps are computed are described in section 3a. In section 3b, the traditional Walin framework is used to describe water mass transformation and formation. Transformation and formation maps for EDW are analyzed in sections 3c and 3d. Section 4 provides an
estimate of the errors in the maps. We conclude in section 5.

2. Formation and transformation maps

Here we review how the Walin (1982) framework is used to quantify the rate at which water is transformed from one temperature class to another via air–sea heat fluxes (the transformation rate). The divergence of the transformation rate yields the rate at which a given temperature class is created or destroyed via air–sea heat fluxes (the formation rate). Because Walin’s framework is an integral statement over temperature outcrops, it can describe the temporal evolution of transformation and formation rates, but at the expense of losing spatial information. In this section, we will discuss how maps of transformation and formation rates are created, allowing one to retain crucial spatial information.

Consider the layer of water designated by \( \Theta \) in a temperature range \( \theta_1 < \theta < \theta_2 \) that outcrops at the sea surface. The volume of the \( \Theta \) layer is bounded by the isothermal surfaces \( \theta_1 \) and \( \theta_2 \) and above by the sea surface; see Fig. 2. Following Walin (1982), the change in volume of the \( \Theta \) layer is

\[
\frac{\partial V_\Theta}{\partial t} = A(\theta_2, t) - A(\theta_1, t) - M(\Theta, t),
\]

(1)

where \( A(\theta_i, t) \) is the diathermal volume flux across the isothermal surface \( \theta_i \) and \( M(\Theta, t) \) is the volume flux out of the control volume into the remainder of the ocean (see Fig. 2). Positive (negative) values of \( A \) are toward cooler temperatures, directed mainly poleward (equatorward), and associated with cooling (warming).

Since advection can only deform a material surface in an incompressible, inviscid fluid, leaving the volume enclosed by it unchanged, \( A \) depends only on non-advective (interior diffusive and air–sea) fluxes. Separating the nonadvective supply of heat to the volume into contributions associated with air–sea heat fluxes and interior diffusive processes, we write Walin’s formula [following the notation introduced by Garrett et al. (1995) and Marshall et al. (1999)]

\[
A(\theta, t) = F(\theta, t) - \frac{\partial D(\theta, t)}{\partial \theta},
\]

(2)

where \( D(\theta, t) \) is the diffusive flux of temperature across interior surfaces of the volume and

\[
F(\theta, t) = \frac{\partial}{\partial \theta} \int_{\theta_0}^{\theta} \frac{Q_{net}}{\rho C_p} ds
\]

(3)

is the contribution by air–sea heat fluxes. Temperature \( \theta_0 \) labels a reference surface (see Fig. 2), \( Q_{net} \) is the air–sea heat flux (positive upward) in watts per square meter, \( \rho_c = 1035 \text{ kg m}^{-3} \) is the reference sea surface density, \( C_p = 4000 \text{ J K}^{-1} \text{ kg}^{-1} \) is the specific heat capacity of water, and \( ds \) is an area element at the sea surface. The term \( F(\theta, t) \) is known as the transformation rate due to air–sea heat fluxes. It has units of cubic meters per second (and so can be expressed in Sverdups (\( \text{Sv} = 10^6 \text{ m}^3 \text{s}^{-1} \)) and is a function of time and temperature \( \theta \). Like \( A \), a positive transformation rate \( F \) indicates a transfer of water across \( \theta \) from warm to cold temperatures and is thus associated with an increase of the volume between \( \theta_0 \) and \( \theta \) (see Fig. 2a).

A discretized expression for \( F \) is

\[
F(\theta, t) = \frac{1}{\Delta \theta} \int_{\theta_0}^{\theta+\Delta\theta/2} \frac{Q_{net}}{\rho C_p} ds - \int_{\theta_0}^{\theta-\Delta\theta/2} \frac{Q_{net}}{\rho C_p} ds
\]

(4)

and is an integral over a discrete isotherm outcrop, which is defined as the sea surface within the temperature class \( \theta \pm \frac{1}{2} \Delta \theta \).

We now rewrite \( F(\theta, t) \) as

\[
F(\theta, t) = \int_{x,y} \mathcal{F}(t, x, y, \pi) ds,
\]

(5)

where

\[
\mathcal{F}(t, x, y, \pi) = -\frac{Q_{net}(t, x, y)}{\rho C_p} \pi
\]

(6)

is a two-dimensional map of the transformation rate \( F \), in the sense that the surface integral of \( \mathcal{F} \) will yield \( F \). The boxcar sampling function of temperature is defined as

\[
\pi(\theta, \Delta \theta) = \begin{cases} 
\frac{1}{\Delta \theta}, & \text{if } \theta_i - \frac{\Delta \theta}{2} < \theta < \theta_i + \frac{\Delta \theta}{2} \\
0, & \text{otherwise.}
\end{cases}
\]

(7)

The instantaneous 2D map of \( \mathcal{F} \) is zero everywhere except over the outcrop window of the temperature class defined by \( \pi(\theta, \Delta \theta) \). However, when averaged in time (e.g., over a month or a year), the seasonal migration of the surface outcrops sweeps out a larger region, and patterns emerge in the map of \( \mathcal{F} \), as will be described in section 3c. Such an approach was recently proposed by Brambilla et al. (2008) and used in potential density coordinates to map transformation rates of North Atlantic Subpolar Mode Water.
FIG. 2. (a) Schematic of the control volume bounded by isotherms \( \theta_1 \) and \( \theta_2 \), which is the subject of Walin’s (1982) theoretical framework: \( V_\Theta \) is the volume of the layer \( \Theta \), \( F \) and \( \partial \Sigma D \) are the surface and internal diathermal volume flux components, \( M(\Theta) \) is the flow out of the control volume, and the vertical gray arrows represent air–sea fluxes. Temperature \( \theta_0 \) labels a reference surface. (b)–(c) Horizontal and vertical views of the two isotherms bounding the \( \Theta \) layer with a nonuniform meridional profile of heat flux cooling ("c"). Black arrows represent the diathermal volume flux across isotherms. (d) Maps (from the left to the right) of transformation rates across \( \theta_1, \theta_2 \), and formation rate of the \( \Theta \) layer, time-integrated between \( t \) and \( t + dt \). The thick contours correspond to consecutive isotherm positions (thin contours demarcate associated temperature classes) and positive (negative) signs denote areas of positive (negative) rates.
The contribution of air–sea heat fluxes to the change in volume of water of the $\Theta$ layer is called the formation rate $\Delta F$ given by

$$\Delta F(\Theta, t) = F(\Theta_2, t) - F(\Theta_1, t)$$

and is obtained by taking the difference in the transformation rates across the bounding isothermal surfaces.

We can visualize the contribution of air–sea heat fluxes spatially by computing the difference between the transformation rate maps corresponding to the temperature classes $\pi_{\Theta_1,\Delta \Theta}$ and $\pi_{\Theta_2,\Delta \Theta}$:

$$\Delta F = \mathcal{F}(t, x, y, \pi_{\Theta_1,\Delta \Theta}) - \mathcal{F}(t, x, y, \pi_{\Theta_2,\Delta \Theta}).$$

Here $\Delta F$ is called the formation rate map and has the property

$$\Delta F = \iint_{x,y} \Delta \mathcal{F} \, ds.$$

Averaging $\Delta \mathcal{F}$ in time yields spatial maps that show where water of temperature range $\Theta$ is formed over a given period. Thus, the aforementioned mapping technique can be used in conjunction with the Walin integral statements to reveal information about where and when a water mass is formed by air–sea interaction.

To understand how the transformation and formation rate maps relate to the Walin statements, let us consider the two isotherms $\Theta_1$ and $\Theta_2$, the northern and southern boundary of the layer $\Theta$, shown schematically in Fig. 3b in the horizontal and in Fig. 2c in the vertical. We assume here that $D$ and $M$ are zero in Eqs. (1)–(2) so that there is a simple balance between the rate of volume change and formation/destruction by air–sea heat fluxes. Now suppose that there is more intense cooling occurring over the $\pi_{\Theta_1,\Delta \Theta}$ class than over $\pi_{\Theta_2,\Delta \Theta}$. Cooling induces the isotherms to migrate southward, which corresponds to a positive (poleward) diathermal volume flux $F$. Since the diathermal volume flux across $\Theta_2$ is greater than across $\Theta_1$, the volume of the $\Theta$ layer increases (see black arrows in Figs. 2b and 2c). The two left panels shown in Fig. 3d represent the mapping of these transformation rates according to Eq. (6). The formation rate map $\Delta \mathcal{F}$, sketched in Fig. 2d, shows the local rate of change in volume of the $\Theta$ layer.

3. Studying Eighteen Degree Water using transformation and formation maps

In this section we will use transformation and formation rate maps, in conjunction with the Walin formula, to study Eighteen Degree Water (EDW). We will define EDW to be the volume of fluid bounded by the isothermal surfaces $\Theta_1 = 17^\circ C$ and $\Theta_2 = 19^\circ C$. Thus, all water with temperature $\Theta = 18 \pm 1^\circ C$ is included in our budget, not just weakly stratified waters. Two different datasets will be used, as described in the next section.

a. Description of the datasets

We choose here to work in temperature classes and so require estimates of sea surface temperatures (SST) and net air–sea heat fluxes ($Q_{net}$). There are many such datasets, whose relative merits and consistency are difficult to determine. Here we choose to focus on two SST and $Q_{net}$ datasets, which have complementary qualities.

The first dataset is OCCA, which was produced at the Massachusetts Institute of Technology by the Estimating the Circulation and Climate of the Ocean (ECCO) group and is available (http://www.ecco-group.org/) for the data-rich Argo period from 2004 to 2006. It is a global state estimate of the evolving state of the ocean on a $1^\circ \times 1^\circ$ horizontal grid with 50 vertical levels extending from the surface of the ocean to the bottom. It was produced using the MIT general circulation model (MITgcm) (Marshall et al. 1997a,b) data assimilation technology (ECCO), which fits the model trajectory as closely as is possible to all modern datasets, including Argo profiles, surface altimetry, and satellite SSTs. The fitting of the model to the data is done by sweeping backward and forward over 16-month periods using air–sea fluxes and winds as control variables. OCCA surface heat fluxes are computed via the Large and Pond (1981) “bulk formulæ” using the model SST and National Centers for Environmental Prediction–National Center for Atmospheric Research (NCEP–NCAR) Global Reanalysis 1 (NCEP-1)-analyzed fields of winds and atmospheric temperature and humidity, employing a surface boundary layer model. Three consecutive years are available, “joined together” using linear interpolation over four months of overlap. This method has the notable advantage of confining spurious drifts of the model away from observations, yielding a state estimate that is very close to observations. A precise description of the resulting dataset can be found in Forget (2008).

In Figs. 1b and 1c OCCA is compared with raw Argo temperature profiles. Figure 1b is produced by plotting as a function of time every Argo temperature profile within a $10^\circ \times 5^\circ$ box centered on the EDW bowl at
The EDW layer shows a seasonal cycle with a short period of wintertime ventilation when the 19°C isotherm reaches the surface and a longer period of restratification throughout the remainder of the year. Although the OCCA time series is smoother than that from Argo (largely due to the absence of eddies), the depth, thickness, and temporal characteristics of the EDW layer are very similar in OCCA and Argo float data. Using OCCA, Forget et al. (2008, manuscript submitted to J. Phys. Oceanogr., hereafter FRG) have computed a volume budget of EDW using Eqs. (1)–(2). Here we use the OCCA air–sea heat flux and SST to illustrate our diagnostic technique.

The second dataset (hereafter MIXED) consists of SST maps and atmospheric state estimates produced by Remote Sensing System and the European Centre for Medium-Range Weather Forecasts, respectively. SST maps are a blend of radiometer and microwave observations [Tropical Rainfall Measuring Mission (TRMM) Microwave Imager (TMI)–Advanced Microwave Scanning Radiometer for Earth Observing System (EOS; AMSRE)] with a native resolution of ¼° and one day (see http://www.remss.com for more details). Atmospheric state variables required are taken from the ECMWF operational system, which provides daily global gridded data from 1994 to the present. Atmospheric variables are linearly interpolated on to the satellite SST grid, and surface turbulent and radiative heat fluxes are then computed using the most recent Coupled Ocean–Atmosphere Response Experiment (COARE) bulk algorithm (version 3.0; Fairall et al. 2003), which has been shown to be “the least problematic” flux scheme relative to other algorithms (Brunke
et al. 2003). The net surface heat flux is computed by summing turbulent and radiative fluxes from the COARE 3.0 algorithm. Such a method could lead to spurious local values, but a careful inspection of the MIXED data (see appendix A) suggests that it yields reasonable estimates for the purpose of this study.

Daily data (2004–06) from OCCA (1° spatial resolution) and MIXED (¼° spatial resolution) data are linearly interpolated onto a 1/8° grid in order to avoid any bias in the temperature class sampling that would undermine the comparison between them.

b. The Walin calculation

The Walin integral statements of the EDW water mass transformation rate and formation rate are computed using both the OCCA and MIXED datasets. Temperature classes are defined with a bin interval of Δθ = ½°C; for example, the 19°C temperature class consists of all points having a temperature θ such that 19 − 0.25 ≤ θ ≤ 19 + 0.25 (boxcar function π19,12). Sensitivity of the results to this bin choice is discussed in appendix B.

The 3-yr time mean of F(θ) is shown in Fig. 3a for the temperature range 10°C–25°C. The gray-shaded area emphasizes the EDW temperature range. Both datasets show a larger mean transformation rate at 19°C than at 17°C, implying production of EDW: ΔF(18°C) = F(19°C) − F(17°C) = 5.6 Sv in OCCA and 3 Sv in MIXED. These values are somewhat smaller than previous estimates based on Walin’s, found in the literature, which range from about 10 Sv to 20 Sv (see Speer and Tziperman 1992; Speer et al. 1995; Nurser et al. 1999, e.g.). Computational details can account for a part of this wide range of values, but the main uncertainty is likely to be in the estimates of the net air–sea fluxes themselves. Resolution may also affect results, especially in calculations done at low spatial and temporal resolution (note that in our study, interpolation onto a 1/8° grid reduced mean transformation rates by an amplitude of about 1 Sv).

Time series of ΔF(18°C) (net EDW formation rate) are shown in Fig. 3b. Formation rates calculated using both datasets exhibit a marked seasonal variability with daily formation rates reaching as high as 200 Sv in winter (especially February) and −50 Sv (destruction) in summer. Both datasets produce a very similar seasonal cycle, but a larger wintertime formation rate is obtained using OCCA than using MIXED. The primary formation period is January–March and the primary destruction period is April–June. This is clearly seen in Fig. 3c, which shows the mean monthly formation rate over the 3-yr period. The formation rate reaches a peak in February: 63 and 43 Sv for the OCCA and MIXED datasets, respectively. The formation rates calculated from the two datasets differ most during the formation period and are rather similar during the rest of the year.

Figure 3b also shows the interannual variability in ΔF(18°C), quantified in Fig. 3c as the standard deviation (STD) of monthly values over 3 yr. The largest STD is found during the formation period, peaking at 19 Sv for OCCA in February and 9 Sv for MIXED in March.

The 3-yr average formation rate owing to air–sea heat fluxes is positive, indicating that more EDW is formed by air–sea heat fluxes than is destroyed. FRG found the volume of the EDW layer to be close to a steady state over the 2004–06 period. This suggests that other processes (such as ocean mixing) act to destroy EDW. We will not consider these processes here, but the interested reader is referred to FRG and G. Forget et al. (2008, unpublished manuscript) for a discussion of the annual cycle of EDW volumes in OCCA and the contributing formation and dissipation processes.

c. Mapping EDW transformation rates

Using Eq. (6), we mapped the mean transformation rate over the 3-yr period for the temperature classes 19° ± 0.25° and 17° ± 0.25°C. The mean transformation rate maps are shown in Fig. 4. By construction, the surface integral of the maps F(19°C) and F(17°C) yield the Walin transformation rates F(19°C) and F(17°C), shown in Fig. 3a.

Maps of transformation rates computed from both datasets and for each temperature class have the same general form: a meridional dipole with positive values in the south and negative values in the north of the domain swept out by the SST outcrops over the seasonal cycle. (Note that in Fig. 4 the position of the outcrop in March and August is marked.) Positive (negative) values imply poleward (equatorward) transfer of water and are associated with cooling (warming).

The cause of the meridional dipole can be understood by calculating maps of seasonal average transformation rates. Figure 5 shows the average transformation map over wintertime (October–March with monthly outcrops marked) and summertime (April–September with monthly outcrops marked) for both datasets. Wintertime transformation maps are positive almost everywhere in OCCA (MIXED), yielding a wintertime transformation rate of 40 and 23 Sv (33 and 19 Sv) for 19° ± 0.25°C and 17° ± 0.25°C. Summertime transformation maps are negative almost everywhere, and OCCA (MIXED) yield a summer transformation rate of −22 and −16 Sv (−22 and −14 Sv) for 19° ± 0.25°C and 17° ± 0.25°C.

In areas where a temperature class outcrops in both wintertime and summertime, the wintertime cooling and summertime warming cancel out over the seasonal cycle, yielding near-zero annual mean transformation.
rates for the temperature class. This cancellation explains the near-zero transformation rates observed in the center of the region swept out by the outcrops over the seasonal cycle. However, in the southernmost and northernmost locations where a temperature class outcrops, no such cancellation occurs. Since an outcrop reaches its southernmost location during wintertime, the transformation rate in this region is dominated by wintertime cooling. Similarly, the transformation rate in the northernmost location of the outcrop is dominated by summertime warming. Thus, in maps of the annual mean transformation rate (Fig. 4), a meridional dipole is observed. Note, however, the marked east-west asymmetry associated with both the fanning out of the outcrops on moving eastward across the basin and the presence of intense air–sea fluxes in the region of the separated Gulf Stream.

Although the transformation rates for both the 19° and 17°C temperature classes exhibit a meridional dipole, they also have important differences. Over a wide area west of 45°W between the Gulf Stream and 30°N, $\mathcal{F}(19^\circ)$ exhibits a maximum. In contrast, $\mathcal{F}(17^\circ)$ exhibits a maximum confined to the Gulf Stream in wintertime. Thus, the 19°C transformation rate over this entire region is dominated by wintertime cooling and is, therefore, large and positive. In contrast, in the western part of the basin the 17°C isotherm remains constrained to the Gulf Stream in wintertime, and the area of positive transformation rates is constrained to a small area along the southern flank of the Gulf Stream. The greater area of positive transformation rates for the 19°C temperature class compared to the 17°C temperature class is the reason for the large drop in the Walin transformation curves between 19° and 17°C (see Fig. 3a).

d. EDW formation rate maps

A map of the net formation rate of EDW over the 3-yr period, $\overline{\mathcal{F}}(18^\circ)$, is obtained by subtracting the transformation rate maps for the 17°C temperature class from the transformation rate maps for the 19°C temperature class, as expressed in Eq. (9) and shown in Fig. 6 for both datasets. By construction, surface integrals of $\overline{\mathcal{F}}(18^\circ)$ yield the formation rate $\overline{\mathcal{F}}(18^\circ) = \mathcal{F}(19^\circ) - \mathcal{F}(17^\circ)$ [see $F(\theta)$ in Fig. 3a]. Positive (negative) areas correspond to net formation (destruction) of EDW. We see that EDW is formed over a wide region south of the Gulf Stream.
FIG. 5. Transformation maps (Sv m$^{-2}$) for (a)–(d) for mean October–March (fall–winter) and (e)–(h) mean April–September (summer–spring) for the 3-yr period 2004–06 (Sv m$^{-2}$): (left) F(19°C) and (right) F(17°C); (top) OCCA dataset and (bottom) MIXED dataset. Blue (red) contours in maps A–D (E–H) are the monthly mean positions for October–March (April–September) of the 19°C and 17°C isotherms; green contours are the mean −0.2- and −0.6-m SSH from OCCA. Integral quantities (Sv) of the fields are shown in the upper-left corner of each map over the total domain (T), for the positive areas only (P), for the negative areas only (N), and over the dashed black box (B). A nonlinear color scale has been used to reveal patterns.
Insight into the formation rate maps can be obtained by looking again at the transformation rate maps for the 19°C and 17°C temperature classes (see Fig. 4). We see that $F(19\degree C)$ and $F(17\degree C)$ are broadly similar, except to the south of the Gulf Stream in the western part of the basin where the 19°C transformation map exhibits a large positive maximum. Thus, we see that EDW formation south of the Gulf Stream is primarily driven by positive transformation rates (cooling) across the warm flank (the 19°C isotherm).

The EDW formation region is marked by the large dashed black box extending westward from 45° to 75°W and northward from 30°N to the mean March position of the 17°C isotherm. Inside this box, surface integrals of $\Delta F(18°C)$ are 7.7 and 6.3 Sv for the OCCA and MIXED datasets, respectively. Integrating over the entire domain yield mean formation rates $\Delta F(18°C) = 5.6$ Sv and $\Delta F(18°C) = 3$ Sv for OCCA and MIXED, respectively. Although differences in integrated values over the entire domain are larger than over the formation box, they may...
not be significant when note is taken of the (random) error bar of ±1 Sv (see section 4).

EDW formation in the box has an interesting spatial structure. Figure 7 shows the annual mean $\Delta F(18^\circ C)$ zonally integrated over the formation box, plotted as a function of distance south of the northern boundary (defined as the March position of the 17°C isotherm). The formation rate rapidly increases moving southward from the northern boundary, reaches a maximum at distances between 50 and 300 km, and then slowly decreases to small values at distances greater than 600 km. The bump at 100 km found in the OCCA dataset, but absent in MIXED, is due to high formation rates observed in the OCCA dataset in the western part of the formation box where the Gulf Stream separates from the coast. The Gulf Stream may be separating from the coast too abruptly in the OCCA dataset, which suggests that the bump may be spurious. Refined regional observations that the Climate Variability and Predictability (CLIVAR) Mode Water Dynamic Experiment (CLIMODE) project aims to provide will aid in resolving these questions.

The maps of the 3-yr mean EDW formation rate show that EDW is formed by air–sea heat fluxes in a broad region south of the Gulf Stream in the western part of the basin, with maximum formation rates 50–300 km south of the position of the March 17°C isotherm. The main formation region of EDW is mostly coincident with the thickest layer of EDW seen in Fig. 1a. The formation region found in this study is broadly similar to the region with large subduction rates across the mixed layer base seen by Valdivieso Da Costa et al. (2005) in an eddy-permitting numerical simulation (see their Fig. 5b). Peng et al. (2006) proposed another definition of the formation area of EDW as “the region where the March mixed layer temperature ranges between 17°C and 19°C.” This definition is less rigorous but also broadly matches the formation area seen in this study (see Fig. 6).

Destruction of EDW by air–sea fluxes, on the other hand, occurs over a wide area in the eastern half of the basin. Comparing the surface integral of $\Delta F(18^\circ C)$ over all regions where $\Delta F$ is positive to the surface integral of $\Delta F$ over all regions where $\Delta F$ is negative, we find the integral of the negative regions to be about $-\frac{1}{3}$ that of the positive regions. Therefore, in calculating $\Delta F(18^\circ C)$ in the Walin integral framework, EDW destruction in the eastern part of the basin partially cancels EDW formation south of the Gulf Stream in the western part of the basin. Thus, a basin integral Walin analysis does not convey underlying mechanisms because it blends together distant regions of formation and destruction rates. The mapping technique, instead, exposes this crucial spatial inheterogeneity.

Monthly mean formation rate maps were calculated in order to determine when EDW is formed and to help us understand how the yearly mean pattern is established. Figure 8 shows monthly mean maps of formation rates for January–April. In January EDW formation is restricted to the Gulf Stream region since the EDW outcrop has not yet opened up to the south. In February the 19°C isotherm sweeps southward toward the core of the subtropical gyre, inducing a large flux of water into the 17°–19°C temperature range (positive transformation rate across the warmer flank). February is thus the period of maximum formation over the year (see Fig. 3c). The February surface integral over the entire domain of $\Delta F(18^\circ C)$ is 63 Sv for the OCCA dataset and 43 Sv for the MIXED dataset. Formation rates integrated only over the formation box are 75 Sv for OCCA and 52 Sv for MIXED. In March the 19°C isotherm reaches westward to its greatest extent. Due to the different behavior of the 19°C isotherm in the two datasets, there is a large discrepancy between formation rates calculated from the two datasets in March. In April air–sea heat fluxes change sign and EDW is eroded over the same region in which it was formed in February. EDW continues to be destroyed in May but largely in regions outside the formation box.

4. Sensitivity of transformation and formation to random errors in input fields

A notable result from the previous section is the good overall agreement between maps of transformation and formation rates obtained from our two datasets. There
are detailed differences, however, which result in sizable differences in integrated values. There are many possible sources of error in such estimates. Here we focus on the contribution of random errors in SST and $Q_{\text{net}}$, assuming that errors in the input fields have zero time mean and prescribed covariances. We compute the probability distribution functions (PDF) that result from perturbing SST, $Q_{\text{net}}$, or both in a large ensemble of $N$ perturbations. Each perturbation is generated by applying a time/space diffusive filter to a random field with a normal distribution (Weaver and Courtier 2001) and scaled by a map of expected error standard deviation. This method allows one to generate evolving surface perturbations with chosen distributions of error variance and zonal, meridional, and temporal decorrelation scales. We compute three ensembles of $N = 500$ perturbations in which only $Q_{\text{net}}$ is perturbed, only SST is perturbed, and both $Q_{\text{net}}$ and SST are perturbed. We

FIG. 8. January–April monthly mean formation maps $\Delta F(18^\circ C) = F(19^\circ C) - F(17^\circ C)$ for the 3-yr period 2004–06 (Sv m$^{-2}$): (left) OCCA and (right) MIXED. Blue contours are the $19^\circ$ and $17^\circ$ outcrops for each month; green contours are the mean $-0.2$ and $-0.6$-m SSH from OCCA. The box marked by the black dashed line encloses the main formation area of EDW. Integral quantities of the fields are shown in the upper-left corner of each map (Sv) over the total domain (T), for the positive areas only (P), for the negative areas only (N), and over the dashed black box (B). A nonlinear color scale has been used to reveal patterns.
add the perturbations to OCCA fields and compute the EDW transformation/formation rates, as described in section 2, on the 1° × 1° grid with Δt = 0.5°C. For each ensemble we then compute the PDF of integral and mapped transformation/formation rates.

For Qnet perturbations we choose decorrelation scales of 7 days, 8°C, and 4°C in the temporal, zonal, and meridional directions, respectively; and 7 days, 2°C, 2°C for SST perturbations. Anomaly patterns in Qnet are more coherent in the zonal than in the meridional direction (Romanou et al. 2006), while this is not the case for SST anomalies (Hosoda and Kawamura 2004; Dong et al. 2006). We scale Qnet perturbations by the rms difference between NCEP-1 and ECMWF analysis heat fluxes. This map has an amplitude of 100–120 W m⁻² along the Gulf Stream core and 40–60 W m⁻² in the subtropical gyre, and has a similar pattern to the rms difference between the MIXED and ECMWF heat fluxes shown in Fig. A1b. We scale SST perturbations by the rms difference between the Reynolds optimum interpolation (OI) version 2 (V2) (Reynolds and Smith 1994) and TMI–AMSR-E SST products that are about 1°C along the Gulf Stream (peaking locally at 2°C), and 0.5°C in the subtropical gyre. The spatial pattern is similar to the rms difference between the TMI–AMSR-E and NCEP-1 real-time global (RTG) SST shown in Fig. 10a.

The PDFs of annual mean basin-integrated rates are shown for the first ensemble (only Qnet perturbed) in Fig. 9. PDFs of F(17°C) and F(19°C) (Fig. 9a) have a standard deviation of 0.5 and 1 Sv, respectively. We obtain 0.4/0.9 Sv in the second ensemble (only SST perturbed) and 0.6/1.4 Sv for the third (both Qnet and SST perturbed). These values differ from one another (as they are calculated by perturbing different quantities) but not to a great extent. Typical error estimates are 0.5 Sv for F(17°C) and 1 Sv for F(19°C). The variance of F(19°C) is larger than that of F(17°C) because the 19°C isotherm sweeps out a larger area than for the 17°C isotherm, and thus the volume flux across it is more sensitive to errors in Qnet and/or SST. Figure 9b shows the PDFs of ΔF(18°C) for the first ensemble. It has a standard deviation of 1 Sv. The other two ensembles yield similar values.

Monthly values of ensemble mean and ensemble standard deviation are given for ΔF(18°C) in Fig. 9b for the first ensemble. Ensemble mean values are close to the ones shown in Fig. 3c despite differences in grid resolution. The standard deviation ranges from 7 Sv in February at the peak of formation to 0.5 Sv at the end of summer when the ensemble mean formation rate is zero. It is noteworthy that the ensemble mean formation rate only exceeds two standard deviations in December–February and April–June.

The spatial distribution in formation rate errors is shown in Fig. 9c for the first ensemble and Fig. 9d for the second (the third, not shown, has a pattern very similar to that of the second ensemble). Both ensembles show the error to be maximum along the Gulf Stream, albeit somewhat more homogeneously distributed in space in the first ensemble than in the second. These maps are error estimates associated with formation rate maps given by Fig. 6. We conclude that the patterns in Fig. 6 are robust to random errors in Qnet and SST. This is especially clear for the box in the western basin showing large EDW formation south of the Gulf Stream, while the largest errors are confined to the path of the Gulf Stream.

Finally, it should be said that, given the random errors estimated here as O(1 Sv), the larger differences in formation and transformation rates obtained using MIXED as opposed to OCCA must be due to systematic errors (such as bulk layer formulations), which are more difficult to quantify. An attempt is given in FRG.

5. Conclusions

Maps of transformation and formation rates due to air–sea heat fluxes have been developed, which complement, and can be used alongside, the integral statement of water mass transformation introduced by Walin (1982). Spatial maps of formation rate allow us to observe where and when water masses are formed or destroyed owing to air–sea heat fluxes. The mapping approach has been applied to study the cycle of North Atlantic EDW formation and destruction using two different datasets, OCCA and MIXED, which yield broadly similar results.

Transformation rate maps show the spatial distribution of the rate at which water of one temperature class is transformed into another. For 19°C and 17°C temperature classes, transformation rate maps exhibit a meridional dipole with positive values to the south (associated with winter heat flux cooling), negative values to the north (summer warming), and thus near-zero values to the center of the region swept out by SST outcrops over a seasonal cycle. Moreover, it is natural to view formation/destruction of EDW as the difference between diathermal volume fluxes into and out of the layer. Thus, formation rate maps were computed as differences between maps of transformation rates. They reveal that EDW forms primarily between the Gulf Stream and 30°N to the west of 45°W. Finally, an ensemble perturbation method was used to determine the amplitude and distribution of random errors due to SST and Qnet uncertainties. The transformation/formation patterns revealed by the maps appear to be robust to random errors.
Although transformation rate maps of both temperature classes exhibit a meridional dipole, there is a key difference between them that intimately drives the EDW formation rate (both its pattern and integrated value). The transformation rate map across the $19^\circ$C isotherm exhibits a maximum over a wide area between the Gulf Stream and 30°N to the west of 45°W. In contrast, the transformation rate map across $17^\circ$C exhibits a maximum confined to a small area along the southern flank of the Gulf Stream. This difference implies a net

Fig. 9. From the OCCA dataset: PDFs of (a) transformation $F(17^\circ$C), $F(19^\circ$C) and (b) formation $\Delta F(18^\circ$C) rates for the first ensemble experiment where only the air–sea heat flux is perturbed (see text). In (b), monthly mean and standard deviation of $\Delta F(18^\circ$C) are tabulated. (bottom) Maps of local standard deviation of $\Delta F(18^\circ$C) for the (c) first and (d) second ensemble with perturbations on $Q_{net}$ and SST only, respectively. Dashed black line is the formation box area and two thick black contours are mean $-0.2$- and $-0.6$-m SSH from OCCA.
positive volume flux of water into the EDW layer (a positive formation rate) that is not balanced by negative volume flux in other areas or seasons. Note that the formation of EDW occurs in February when the 19°C isotherm migrates southwestward, while the 17°C remains confined to the Gulf Stream. This implies that the EDW formation is primarily driven by positive transformation rates across the warm flank of the EDW layer. A small fraction of the EDW formed in late winter is destroyed in April, as a result of negative transformation rates (warming) across the still-open 19°C outcrop.

The largest destruction of EDW by air–sea fluxes occurs over an extensive region in the central-eastern part of the basin, driven by positive transformation rates across the 17°C isotherm. Formation maps thus emphasize the limitation of the Walin framework if one is interested in the budget of weakly stratified EDW, that is, the North Atlantic Subtropical Mode Water (NASTMW), typically defined as the least stratified fraction of the EDW layer. As NASTMW is located south of the Gulf Stream, in the core of the subtropical gyre, we surmise that the formation site of EDW is that of NASTMW. Destruction of EDW, however, is in the central-eastern basin where no sizable volume of NASTMW is found. Thus, formation maps suggest that a Walin analysis performed over the entire basin, as required by the theory, is perhaps a lower bound of the NASTMW formation rate induced by air–sea heat fluxes. A more accurate estimate of NASTMW formation rate may be the integral over the dashed black box in the western basin defined in section 3d.

On very long time scales we expect EDW volume to be in steady state. Kwon and Riser (2004) found a clear balance between formation and destruction of NASTMW over 40 years of data (at a rate of ±3.5 Sv with an error of ±0.5 Sv). However, they also observed large interannual variability (see also Marsh et al. 2005; Old and Haines 2006), so we might not expect to find the EDW layer in balance over the short period from 2004 to 2006. Nevertheless, a volumetric census of the EDW layer in OCCA indicates that, perhaps surprisingly, it is almost in balance (about 1 Sv of volume storage over a seasonal cycle and on average for the 3 yr, FRG). Thus, the 5.6 Sv of EDW formed by air–sea fluxes (or 7.7 Sv for the NASTMW box integral) must be balanced by other destructive processes. Since only nonadvective processes can lead to water mass transformation, interior diffusive processes must be responsible for destruction of EDW. Vertical and horizontal mixing and/or horizontal diabatic eddy fluxes owing to unresolved eddies (see Radko and Marshall 2004) may be important in destroying EDW. These processes will be discussed in forthcoming papers (FRG; G. Forget et al. 2008, unpublished manuscript) in which subsurface estimates from the OCCA are used to calculate volumes and dissipation rates. There we extend the mapping technique to interior processes.

Finally, it is important to emphasize that we have focused here on the role of air–sea fluxes in changing the volume of water in the particular temperature range of EDW because of its association with subtropical mode water. In the study of subtropical mode water, however, one is perhaps further interested in the cycle of potential vorticity destruction and creation induced by air–sea fluxes. The focus of attention is then the flux of potential vorticity across the EDW isopycnal outcrop and its circulation within the gyre on the interior isopycnic surface. Mapping out the air–sea potential vorticity flux using techniques similar to that discussed here will be the subject of a future study.

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APPENDIX A

The MIXED Heat Flux

The MIXED heat flux dataset was computed using TMI–AMSR-E SST and ECMWF analysis atmospheric state estimates. Atmospheric variables were linearly interpolated on to the satellite SST grid, and surface turbulent and radiative fluxes were then computed. Possibly incompatible SST and atmospheric states can lead to unrealistic results. The SST used in the ECMWF analysis system is the NCEP RTG produced with a two-dimensional variational interpolation analysis of the most recent 24-h buoy and ship data, satellite-retrieved NOAA-17 Advanced Very High Resolution Radiometer (AVHRR) SST data, and SSTs derived from satellite-observed sea ice coverage. Figure A1a shows the daily centered rms difference (RMSD) between the RTG SST used by ECMWF and the TMI–AMSR-E SST used here to produce MIXED. The two products differ most along the Gulf Stream with RMSD values of 1°C, peaking locally at 2°C. The RMSD between $Q_{tot}$ obtained from ECMWF and MIXED is shown in Fig. A1b. Differences are again largest along the Gulf Stream with values reaching 125 W m⁻². Reassuringly, this is of the same order of magnitude and spatial scale as the
RMSD between ECMWF and NCEP-1 original heat fluxes (not shown). This suggests that the MIXED heat flux does not contain spurious values and is as different from ECMWF as is NCEP.

We also compared time mean values of \( Q_{\text{net}} \) from MIXED with other datasets. Results are summarized in Fig. A1c, which plots the zonal mean and time mean of the monthly time series of \( Q_{\text{net}} \) from National Oceanographic Center version 1.1 (NOC1.1) and the 2004–06 daily time series from ECMWF, MIXED, OCCA, and NCEP-1. Relative to NOC1.1, ECMWF and NCEP heat fluxes overestimate the oceanic heat loss in the latitude band of interest in mode water formation (30°–45°N). MIXED is closer to NOC1.1 than, for example, ECMWF and so can be considered acceptable.

Last, we estimated the performance of the MIXED heat flux locally. The CLIMODE project deployed a meteorological buoy in the core of the Gulf Stream path at 38.5°N, 65°W (denoted by a black cross on Figs. A1a,b) from which we compared daily sea surface heat fluxes with estimates from MIXED, OCCA, ECMWF, and NCEP for the overlapping period from November 2005 to November 2006. The results are shown in a Taylor diagram in Fig. A1d (Taylor 2001). Each point represents a local time series (labeled A, B, C, and D for the four global heat flux products; see the legend in Fig. A1c). The distance from the center of the disk is the standard deviation (std dev) and the angle from the x axis is the correlation with the time series at the buoy. Thus, the distance between the buoy point on the x axis and other estimates is the RMSD between the time series. We see that ECMWF and MIXED have a similar STD to the buoy time series, while OCCA underestimates it and NCEP overestimates it.

Global and local variabilities also with time mean of the MIXED heat flux was shown to be realistic,
compared to several state-of-the-art heat flux products. The point of this study is not to provide and present yet another heat flux product (MIXED is not aimed to be distributed), instead it is intended to compare formation maps from the OCCA dataset to maps obtained from another combination of SST and $Q_{\text{net}}$ with a smaller spatial resolution. One important result of this study is the remarkable consistency of the patterns in formation maps despite the differences in basin-integrated values.

APPENDIX B

Sensitivity to Bin Size and Resolution

The numerical discretization of the transformation rate expression, Eq. (4), makes use of a temperature bin $\Delta \theta$ to define temperature classes. If the bin is too small, there will be insufficient outcropping regions to resolve, leading to considerable noise in both maps and integral values. On the other hand, if the bin is too large, we will lose the ability to resolve temperature classes of interest. We found $\Delta \theta = 0.5^\circ\text{C}$ and a resolution of $\frac{1}{8}^\circ$ to be a good compromise leading to smooth maps, which can resolve detail.

To test the sensitivity of the formation rate value to the bin and resolution, we used various bins in the range from $1^\circ$ to $\frac{1}{8}^\circ$ with several spatial resolutions in OCCA for 2005 only (for numerical efficiency reasons) to compute the EDW formation rate. Results are summarized in Table B1. Whatever the spatial resolution, as the bin decreases, positive and negative area integrals tend to increase in amplitude. This reduces the error in resolving the temperature class [see Eq. (B1)] but also leads to average very large positive and negative values, increasing uncertainties. However, when a linear spatial interpolation is used to increase the horizontal resolution, we see that the variability of the formation rate as a function of the bin decreases and that, for a given bin, the formation rate converges as the resolution increases.

From Table B1, the 2005 mean formation rate of EDW ranges from 5.1 to 7.48 Sv. For the range of bin and resolution used here, the mean value is 5.8 Sv and the standard deviation among them is 0.5 Sv, which gives an estimate of the sensitivity of the results to the bin and resolutions of surface fields.

Finally, we address the question of the discretization error of the isotherms, that is, the error in approximating an isotherm by a temperature class. This error is given by the difference between grid cell temperatures and the actual isotherm to be determine

$$F_e = -\frac{Q_{\text{net}}}{\rho C_p} \pi_{\theta \theta} |\theta - \theta_i|.$$

(B1)

Note that compared to Marshall et al. (1999) we chose to apply an absolute value to the difference, $\theta - \theta_i$, in order to avoid spurious cancellation of errors. This gives an upper band on the error estimates. Maps and integral values of transformation and formation rates have been computed for $F_e$ and $\Delta F_e$ (not shown). We found this source of error to be 0.4, 1.1, and 0.8 Sv for $F(17^\circ\text{C})$, $F(19^\circ\text{C})$, and $\Delta F(18^\circ\text{C})$, respectively. The mapping showed that this error has a similar distribution to the mean field and therefore acts to either reinforce or weaken the pattern.

REFERENCES


