Diagnosing the thickness-weighted averaged eddy-mean flow interaction from an eddying North Atlantic ensemble, Part I: Kinematic framework

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Key Points:

- Eddying ensemble runs of the North Atlantic Ocean are used to diagnose the thickness-weighted averaged eddy-mean flow interaction.
- A dynamically consistent neutral surface is implemented to define the buoyancy coordinate for a realistic equation of state.
- The Eliassen-Palm flux convergence tends to meridionally smooth out the Gulf Stream.

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Abstract

The thickness-weighted average (TWA) framework, which treats the residual-mean flow as the prognostic variable, provides a clear theoretical formulation of the eddy feedback onto the residual-mean flow. The averaging operator involved in the TWA framework, although in theory being an ensemble mean, in practice has often been approximated by a temporal mean. Here, we analyze an ensemble of North Atlantic simulations at mesoscale-permitting resolution (1/12°). We therefore recognize means and eddies in terms of ensemble means and fluctuations about those means. The ensemble dimension being orthogonal to the temporal and spatial dimensions negates the necessity for an arbitrary temporal or spatial scale in defining the eddies. Eddy-mean flow feedbacks are encapsulated in the Eliassen-Palm (E-P) flux tensor and its convergence indicates that eddy momentum fluxes dominate in the separated Gulf Stream. The eddies contribute to the zonal meandering of the Gulf Stream and smoothing of it in the meridional direction by decelerating the subpolar and subtropical gyres.

Plain Language Summary

We have greatly benefited from global climate simulations in gaining insight into what the climate would look like in an ever warming future. Due to computational constraints, however, the oceanic component of such simulations have been poorly constrained; the storm systems in the ocean, often referred to as eddies, have the spatial scales of roughly several tens of kilometers and simulating the currents associated with eddies accurately on a global scale, which is on the order of thousands of kilometers, has remained challenging. Although relatively small in scale compared to the global ocean, eddies have been known to modulate the climate by transporting heat from the equator to the poles. By running a regional simulation of the North Atlantic Ocean and taking advantage of recent theoretical developments, we implement a new framework to evaluate such simulations.

1 Introduction

Eddy-mean flow interaction has been a key framework in understanding jet formation in geophysical flows such as in the atmosphere and ocean (Vallis, 2017). A prominent example of such a jet in the North Atlantic ocean is the Gulf Stream. Previous studies have shown how eddies fluxing buoyancy and momentum back into the mean flow energize the Gulf Stream (Lévy et al., 2010; Waterman & Lilly, 2015; Chassignet & Xu,

2017; Aluie et al., 2018). Basin-scale simulations, however, often lack sufficient spatial resolution to accurately resolve the eddies and hence, result in underestimating the eddy fluxes of momentum and tracers (Capet et al., 2008b; Arbic et al., 2013; Kjellsson & Zanna, 2017; Balwada et al., 2018; Uchida et al., 2019; Schubert et al., 2020). Due to computational constraints, we will continue to rely on models which only partially resolve the mesoscale, a scale roughly on the order of O(20-200 km) at which the ocean currents are most energetic (Stammer, 1997; Xu & Fu, 2011, 2012; Ajayi et al., 2020), for global ocean and climate simulations. As a result, there has been an on-going effort to develop energy-backscattering eddy parametrizations which incorporate the dynamical effects of eddy momentum fluxes due to otherwise unresolved mesoscale turbulence (e.g. Kitsios et al., 2013; Zanna et al., 2017; Berloff, 2018; Bachman et al., 2018; Bachman, 2019; Jansen et al., 2019; Perezhogin, 2019; Zanna & Bolton, 2020; Juricke et al., 2020).

There has been less emphasis, however, on quantifying the spatial and temporal characteristics of the eddy buoyancy and momentum fluxes themselves, which the parametrizations are deemed to represent. The focus of this study is, therefore, to examine the dynamical effects of mesoscale turbulence on the mean flow in realistic, partially air-sea coupled, eddying ensemble runs of the North Atlantic. The thickness-weighted average (TWA) framework, which treats the residual-mean velocity as a prognostic variable, allows for a straightforward theoretical expression of the eddy feedback onto the residual-mean flow (e.g. Gallimore & Johnson, 1981; Andrews, 1983; de Szoeke & Bennett, 1993; McDougall & McIntosh, 2001; Young, 2012; Maddison & Marshall, 2013; Aoki, 2014). It is well known in the atmospheric and Southern Ocean literature that it is the residual-mean flow, which is the residual that emerges upon the cancellation between the Eulerian mean flow and eddies, that captures the mean flow for heat and tracer transport (Vallis, 2017). The TWA framework has been fruitful in examining eddy-mean flow interaction in idealized modelling studies (e.g. D. P. Marshall et al., 2012; Cessi & Wolfe, 2013; Ringler et al., 2017; Bire & Wolfe, 2018). Here, we extend these studies to a realistic simulation of the North Atlantic.

To our knowledge, Aiki and Richards (2008), Aoki et al. (2016) and Zhao and Marshall (2020) are the only studies that diagnose the TWA framework in realistic ocean simulations. Aiki and Richards (2008), however, recompute the hydrostatic pressure using potential density for their off-line diagnosis in defining their buoyancy coordinate, which can result in significant discrepancies from the pressure field used in their on-line cal-

culation and consequently errors in the diagnosed geostrophic shear. Although Aoki et al. (2016) negate this complication between the buoyancy coordinate and mean pressure field by analyzing their outputs in geopotential coordinates, they compute the eddy component of the pressure term (F^+ in their paper) using potential density, resulting in errors in the interfacial form stress (viz. this violates equation (10) described below for ϕ' and m'). The usage of geopotential coordinates also results in a truncation of Taylor expansion about the mean position of buoyancy surfaces, limiting the accuracy of the eddy terms. Lastly, all three studies assume ergodicity. The ergodic assumption of treating a temporal mean equivalent to an ensemble mean, although a pragmatic one, prevents examining the temporal evolution of the residual-mean fields and conflates temporal variability with the eddies, which can have leading-order consequences in quantifying the energy cycle. By adjusting the temporal mean from monthly to annual, Aiki and Richards (2008, cf. Table 2 in their paper) show that the amount of kinetic and potential energy stored in the mean and eddy reservoirs can change by up to a factor of four. Eddy-mean flow interaction in the TWA framework, hence, warrants further investigation, and we believe our study is the first to strictly implement an ensemble mean in this context.

When discussing *eddy* versus *mean flow*, one of the ambiguities lies in how the two are decomposed and interpreted (Bachman et al., 2015). As noted above, often, the eddies are defined from a practical standpoint as the deviation from a temporally and/or spatially coarse-grained field regardless of the coordinate system (e.g. Aiki & Richards, 2008; Lévy et al., 2012; Sasaki et al., 2014; Griffies et al., 2015; Aoki et al., 2016; Uchida et al., 2017; Zhao & Marshall, 2020), which leaves open the question of how the filtering affects the decomposition. Due to the ensemble averaging nature of the TWA framework, we are able to uniquely define the two; the *mean flow* (ensemble mean) is the oceanic response to the surface boundary state and lateral bounday conditions, and the *eddy* (fluctuations about the ensemble mean) is the field due to intrinsic variability including mesoscale turbulence (Sérazin et al., 2017; Leroux et al., 2018).

The paper is organized as follows: We describe the model configuration in section 2 and briefly provide an overview of the TWA framework in section 3. The results are given in section 4. In particular, our dataset provides a unique opportunity to examine the validity of the often assumed ergodicity when decomposing the flow into its eddy and mean flow components, which we give in section 4.2. Discussion and conclusions are given in section 5.

2 Model description

We use the model outputs from the realistic runs described in Jamet et al. (2019b) and Jamet et al. (2020), which are a air-sea partially coupled, 48-member ensemble of the North Atlantic ocean at mesoscale-permitting resolution (1/12°; or sometimes referred to as 'eddy rich') using the hydrostatic configuration of the Massachusetts Institute of Technology general circulation model (MITgcm; J. Marshall et al., 1997). We have 46 vertical levels increasing from 6 m near the surface to 250 m at depth. Harmonic, biharmonic horizontal and vertical viscosity values of $A_{\mathrm{h2}} = 20$ m^2 s^{-1}, $A_{\mathrm{h4}} = -10^{10}$ m^4 s^{-1} and $A_{\mathrm{v}} = 10^{-5}$ m^2 s^{-1} were used respectively. For completeness, we provide a brief summary of the configuration below.

Figure 1 shows the bathymetry of the modelled domain extending from 20°S to 55°N. In order to save computational time and memory allocation, the North Atlantic basin was configured to zonally wrap around periodically. Open boundary conditions are applied at the north and south boundaries of our domain and Strait of Gibraltar, such that oceanic velocities ($\mathbf{u}$) and tracers (θ, s) are restored with a 36 minutes relaxation time scale toward a state derived by an ocean-only global Nucleus for European Modelling of the Ocean (NEMO) simulation (Molines et al., 2014, ORCA12.L46-MJM88 run in their paper, hereon referred to as ORCA12). The open boundary conditions are prescribed every five days from the ORCA12 run and linearly interpolated in between. A sponge layer is further applied to two adjacent grid points from the open boundaries where model variables are restored toward boundary conditions with a one-day relaxation time scale. In total, relaxation is applied along three grid points from the boundaries with it being the strongest at the boundary along with radiation conditions at the northern/southern most boundary. Although relatively short, no adverse effects were apparent upon inspection in response to these relaxation time scales; e.g. changes in the open boundary conditions were seen to induce a physically consistent Atlantic Meridional Overturning Circulation response inside the domain (Jamet et al., 2020).

The 48-member ensemble was constructed as follows: 48 oceanic states separated by 24 hours each were taken during an initial month-long integration beginning December 8, 1962. Simulations initialized with these states were run under yearly *repeating* 1963 atmospheric and boundary conditions. At the surface, the ocean is partially coupled to an atmospheric boundary layer model (CheapAML; Deremble et al., 2013). In CheapAML, atmospheric surface temperature and relative humidity respond to ocean surface

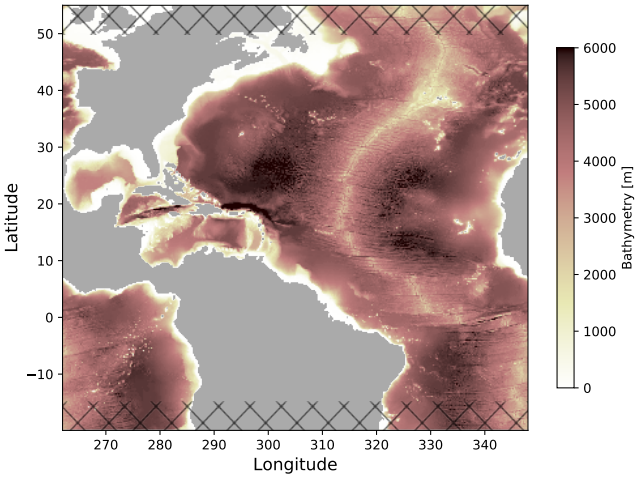

Figure 1. Bathymetry of the modelled domain. The domain was configured to wrap around zonally in order to save computation and memory allocation when generating the ensemble. The hatches indicate the northern and southern regions excluded from our analysis.

structures by exchanges of heat and humidity computed according to the Coupled Ocean–Atmosphere Response Experiment (COARE3; Fairall et al., 2003) flux formula, but are strongly restored toward prescribed values over land; there are no zonally propagating signals of climate teleconnection. The prescribed atmospheric state is taken from the Drakkar forcing set and boundary forcing from the ORCA12 run (details are given in Jamet et al., 2019a). After a year of integration from the 48 states, the last time step from each simulation was taken as the initial condition for the ensuing ensemble members; each spun-up initial oceanic state is physically consistent with the atmospheric and boundary conditions of January 1, 1963 (details are given in Jamet et al., 2020). The ensemble members are then integrated forward in time for 5 years (1963-1967), and exposed to the same prescribed atmospheric state above the boundary layer and relaxation at the north/south boundaries across all ensemble members. (Note that the forcing and relaxation are no longer cyclic after the one-year spin-up phase.) During this interval, the oceanic state and the atmospheric boundary layer temperature and humidity evolve in time. In the following, we interpret the ensemble mean as the ocean response to the atmospheric state prescribed above the atmospheric boundary layer as well as the oceanic conditions imposed at the open boundaries of the regional domain, while the ensemble spread is attributed to intrinsic ocean dynamics that develop at mesoscale-permitting resolution (Sérazin et al., 2017; Leroux et al., 2018; Jamet et al., 2019b).

The model outputs were saved as five-day averages. In the context of mesoscale dynamics, which is the focus of this study, some temporal averaging is appropriate in order to filter out temporal scales shorter than the mesoscale eddies themselves. From a probabilistic perspective, the five-day averaging results in more Gaussian-like eddy statistics (based on the central-limit theorem). From a dynamical point of view, this does not allow us to close the residual-mean and eddy budgets (cf. G. Stanley, 2018, Section 4.4). Nevertheless, the ensemble dimension of our dataset provides an unique opportunity to examine the TWA eddy-mean flow interaction. In the following analysis, we exclude the northern and southern extent of 5° from our analysis to avoid effects from the open boundary conditions and sponge layer (Figure 1) and to maximize the signal of intrinsic variability amongst the ensemble members. We also use the last year of output (1967) for the same reasons.

3 Theory and implementation of thickness-weighted averaging

The ocean is a stratified fluid, and the circulation and advection of tracers tend to align themselves along the stratified density surfaces. Hence, a natural way to understand the circulation is to consider the variables in a buoyancy framework and the residual-mean flow rather than the Eulerian mean flow. We leave the detailed derivation of the TWA framework to Young (2012, and references therein) and here, only provide a brief summary; the primitive equations in geopotential coordinates are first transformed to buoyancy coordinates upon which a thickness weighting and ensemble averaging along constant buoyancy surfaces are applied to obtain the TWA governing equations. Following the notation by Young (2012) and Ringler et al. (2017), the TWA horizontal momentum equations in the buoyancy coordinate system $(\tilde{t}, \tilde{x}, \tilde{y}, \tilde{b})$ are:

$$\hat{u}_{\tilde{t}} + \hat{u}\hat{u}_{\tilde{x}} + \hat{v}\hat{u}_{\tilde{y}} + \hat{\varpi}\hat{u}_{\tilde{b}} - f\hat{v} + \overline{m}_{\tilde{x}} = -\overline{\mathbf{e}}_1 \cdot (\tilde{\nabla} \cdot \mathbf{E}) + \hat{\mathcal{X}} \tag{1}$$

$$\hat{v}_{\tilde{t}} + \hat{u}\hat{v}_{\tilde{x}} + \hat{v}\hat{v}_{\tilde{y}} + \hat{\varpi}\hat{v}_{\tilde{b}} + f\hat{u} + \overline{m}_{\tilde{y}} = -\overline{\mathbf{e}}_2 \cdot (\tilde{\nabla} \cdot \mathbf{E}) + \hat{\mathcal{Y}} \tag{2}$$

where $\overline{(\cdot)}$ and $\widehat{(\cdot)} \overset{\text{def}}{=} \overline{\sigma}^{-1}\overline{\sigma(\cdot)}$ are the ensemble averaged and TWA variables respectively where $\sigma(= \zeta_{\tilde{b}})$ is the thickness and ζ the depth of an iso-surface of buoyancy. The subscripts denote partial derivatives. The Montgomery potential is $m = \underset{\sim}{\phi} - \tilde{b}\zeta$ where $\underset{\sim}{\phi}$ is the dynamically active part of hydrostatic pressure. ϖ is the dia-surface velocity across buoyancy contours, which we detail below for a realistic equation of state (EOS) for density. The vectors $\overline{\mathbf{e}}_1 = \mathbf{i} + \overline{\zeta}_{\tilde{x}}\mathbf{k}$ and $\overline{\mathbf{e}}_2 = \mathbf{j} + \overline{\zeta}_{\tilde{y}}\mathbf{k}$ form the basis vectors spanning the buoyancy horizontal space where $\mathbf{i}$, $\mathbf{j}$ and $\mathbf{k}$ are the Cartesian geopotential unit vectors,

and $\mathbf{E}$ is the E-P flux tensor described in detail in Section 4.1. Although each ensemble member has an individual basis $(\mathbf{e}_1, \mathbf{e}_2)$, the E-P flux divergence yields no cross terms upon averaging as the TWA operator commutes with the divergence of $\mathbf{E}$ (for mathematical details, see Section 3.4 in Maddison & Marshall, 2013); this allows for the tensor expression in equations (1) and (2). $\mathcal{X}$ and $\mathcal{Y}$ are the viscous and forcing terms.

One subtle yet important point involves the buoyancy coordinate $(\tilde{b})$ for a realistic, non-linear EOS (Jackett & McDougall, 1995). The analysis in Young (2012) implicitly assumes a linear EOS. With a realistic EOS, defining the vertical coordinate using potential density introduces errors. However, what constitutes a better buoyancy variable is the subject of some debate (e.g. Montgomery, 1937; Jackett & McDougall, 1997; McDougall & Jackett, 2005; de Szoeke & Springer, 2009; Klocker et al., 2009; Tailleux, 2016; Lang et al., 2020). Although other choices are possible, we argue for the use of in-situ density *anomaly* ($\delta \overset{\text{def}}{=} \rho - \underset{\sim}{\rho}(z)$ where ρ is the in-situ density and $\underset{\sim}{\rho}$ is a function of only depth; Montgomery, 1937; G. J. Stanley, 2019). With density anomaly, buoyancy can be defined as:

$$\underset{\sim}{b} \overset{\text{def}}{=} -\frac{g}{\rho_0}\delta \overset{\text{def}}{=} \tilde{b} \tag{3}$$

where $\tilde{b}$ denotes the vertical coordinate and $\rho_0 = 999.8$ kg m^{-3} the Boussinesq reference density prescribed in MITgcm. The undertilde is kept to remind the reader that buoyancy is defined with density anomaly. The question becomes how to choose $\underset{\sim}{\rho}(z)$ so that monotonicity is maintained ($\underset{\sim}{b}_z > 0$). The vertical derivative of the in-situ density anomaly can be decomposed as:

$$\delta_z = \rho_z - \frac{d}{dz}\underset{\sim}{\rho} = \rho_\Phi \frac{d\Phi}{dz} - \frac{d}{dz}\underset{\sim}{\rho} = \frac{-\rho_0 g}{c_s^2} - \frac{d}{dz}\underset{\sim}{\rho}, \tag{4}$$

where $\Phi = -\rho_0 g z$ is the dynamically non-active part of hydrostatic pressure and c_s is the sound speed. For simplicity, we can write $\frac{d}{dz}\underset{\sim}{\rho} \overset{\text{def}}{=} -\rho_0 g \mathcal{C}_s^{-2}$ where $\mathcal{C}_s = \mathcal{C}_s(z)$ is a function of only depth, which yields:

$$\underset{\sim}{b}_z = -\frac{g}{\rho_0}\delta_z = g^2 \frac{\mathcal{C}_s^2 - c_s^2}{c_s^2 \mathcal{C}_s^2}. \tag{5}$$

Denoting $\mathcal{C}_s = c_s + \Delta$ where $c_s^{-1}\Delta \ll 1$, the right-hand side (RHS) of equation (5) becomes:

$$g^2 \frac{(c_s + \Delta)^2 - c_s^2}{c_s^2 \mathcal{C}_s^2} \approx \frac{g^2}{\mathcal{C}_s^2}\Big[\big(1 + \frac{2\Delta}{c_s}\big) - 1\Big] = \frac{2g^2\Delta}{c_s \mathcal{C}_s^2} \sim O(10^{-6}). \tag{6}$$

Hence, so long as $\mathcal{C}_s \gtrsim c_s$, monotonicity is assured while removing a large portion of compressibility, i.e. the iso-surfaces of $\underset{\sim}{b}$ become close to neutral surfaces. In practice,

we chose $\mathcal{C}_s$ to be larger than the maximum sound speed by 10^{-5} m s^{-1} at each depth over the entire ensemble in order to avoid a singularity (viz. $\underset{\sim}{b}_z = 0$). With $\mathcal{C}_s$ determined, integrating for $\underset{\sim}{\rho}$ gives:

$$\underset{\sim}{\rho} = -\int_z^0 \frac{\rho_0 g}{\mathcal{C}_s} dz + \rho_0, \tag{7}$$

which reduces to $\underset{\sim}{\rho}|_{z=0} = \rho_0$. The buoyancy equation using the in-situ density anomaly becomes:

$$\frac{D}{Dt}\underset{\sim}{b} = \underset{\sim\theta}{b}\,\dot{\theta} + \underset{\sim s}{b}\,\dot{s} + \underset{\sim z}{b}\frac{Dz}{Dt} \tag{8}$$

$$= \mathcal{B} + wg^2\frac{\mathcal{C}_s^2 - c_s^2}{c_s^2\mathcal{C}_s^2}, \tag{9}$$

where $\mathcal{B} \overset{\text{def}}{=} \underset{\sim\theta}{b}\,\dot{\theta} + \underset{\sim s}{b}\,\dot{s}$, and $\dot{\theta}$ and $\dot{s}$ are the net diabatic contributions on potential temperature and practical salinity respectively, which we approximate by diagnosing off-line the sum of harmonic and biharmonic diffusion below the mixed layer using the five-day averaged outputs of θ and s. We summarize the RHS of (9) as the dia-surface velocity $\varpi \overset{\text{def}}{=} \mathcal{B} + wg^2\frac{\mathcal{C}_s^2 - c_s^2}{c_s^2\mathcal{C}_s^2}$.

A further requirement of the TWA framework is that the pressure anomaly defined by such buoyancy coordinate translates into a body force in the buoyancy coordinate

$$\nabla_{\mathrm{h}}\underset{\sim}{\phi}(z) \longmapsto \nabla_{\mathrm{h}}\underset{\sim}{\phi}(\tilde{b}) = \tilde{\nabla}_{\mathrm{h}} m, \tag{10}$$

where the subscript $(\cdot)_{\mathrm{h}}$ represents the horizontal gradient and $\tilde{\nabla}_{\mathrm{h}} = (\partial_{\tilde{x}}, \partial_{\tilde{y}})$. Using in-situ buoyancy anomaly, the pressure anomaly becomes:

$$\underset{\sim}{\phi}(z) = \int \underset{\sim}{b}\, dz, \tag{11}$$

while the pressure anomaly for a Boussinesq hydrostatic fluid is:

$$\phi(z) = \int -\frac{g}{\rho_0}(\rho - \rho_0)\, dz. \tag{12}$$

Since $\underset{\sim}{\rho}$ is only a function of depth, the horizontal gradient of the two remain identical ($\nabla_{\mathrm{h}}\underset{\sim}{\phi} = \nabla_{\mathrm{h}}\phi$) and equation (10) holds. (We note that equation (10) does not hold for pressure anomaly defined by potential density when the EOS is non-linear, and while more elaborate techniques may improve the neutrality of δ, the relation to the dynamics is non-trivial for other density variables such as neutral and orthobaric densities.) The use of in-situ density anomaly to define the buoyancy coordinate maintains the desirable properties of a unique, statically stable vertical coordinate and a simple hydrostatic

balance ($\sigma = \zeta_{\tilde{b}} = -m_{\tilde{b}\tilde{b}}$) while removing roughly 99% of the effect of compressibility basin wide at each depth ($\frac{g^2(c_s^{-2} - \mathcal{C}_s^{-2})}{g^2 c_s^{-2}} \approx \frac{2c_s\Delta}{\mathcal{C}_s^2} \sim O(10^{-2})$). For a non-linear EOS, a material conservation of potential vorticity (PV) and non-acceleration conditions do not exist (cf. Vallis, 2017, Chapter 4). Discussion regarding the energetics are given in Appendix A.

The raw simulation outputs were in geopotential coordinates so we first remapped all of the variables in equations (1) and (2) onto 55 buoyancy levels spread across the range of $\tilde{b} \in (-0.196, -0.287)$ m s^{-2} (with the mathematical formulation of $\delta = \delta_0 + A_\delta \frac{\tanh(\tau) - \tanh(0)}{\tanh(\tau_{\max}) - \tanh(0)}$ where $\delta_0 = 20$ kg m^{-3}, $A_\delta = 9.2$ kg m^{-3}, and $\tau \in [0, 2)$ in order to account for the abyssal weak stratification):

$$(u, v, \underset{\sim}{b}, \nabla_{\mathrm{h}}\underset{\sim}{\phi}, \theta, s, \varpi)(t, x, y, z) \longmapsto (u, v, \zeta, \tilde{\nabla}_{\mathrm{h}} m, \theta, s, \varpi)(\tilde{t}, \tilde{x}, \tilde{y}, \tilde{b}) \tag{13}$$

using the `fastjmd95` Python package to compute the in-situ density and its partial derivatives (Abernathey, 2020), and the `xgcm` Python package (Abernathey et al., 2021; Jones et al., 2020; Busecke & Abernathey, 2020) which allows for coordinate remapping consistent with the finite-volume discretization of MITgcm. The horizontal velocity vector becomes $u\mathbf{i} + v\mathbf{j} \longmapsto u\mathbf{e}_1 + v\mathbf{e}_2$. For the horizontal pressure anomaly gradient, we recomputed the pressure anomaly using the five-day averaged outputs have and have invoked the identity (10).

4 Results

We start by showing the time series of domain-averaged horizontal kinetic energy (KE) and potential temperature, and an arbitrary buoyancy iso-surface (Figure 2). Figure 2a shows the simulation has a prominent seasonal cycle with the KE and temperature both peaking in summer. In Figure 2, we also show the residual-mean fields on January 3, 1967, the first day of the year of output we analyze. The depth of the buoyancy level shown in Figure 2c is below the ensemble-mean mixed-layer depth (MLD; Figure 2b) basin wide where diabatic effects are small, but is shallow enough to capture the imprint of the Gulf Stream; the iso-surface shoals drastically across the latitude of $\sim 38°$N where the separated Gulf Stream is situated (Figure 2d). The ensemble-mean MLD was computed as the depth at which the potential density computed from ensemble-mean temperature and salinity fields increased by 0.03 kg m^{-3} from the density at 10 m depth ($\overline{\mathrm{MLD}} \overset{\mathrm{def}}{=} \mathrm{MLD}(\overline{\theta}, \overline{s})$; de Boyer Montégut et al., 2004). The residual-mean KE field (MKE, $K^{\#} \overset{\mathrm{def}}{=} |\hat{\mathbf{u}}|^2/2$; Figure 2d) shows the characteristic features of the Gulf Stream, North Brazil Cur-

rent and equatorial undercurrent. The North Brazil Current, although having large values in KE, shows no imprint on the buoyancy depth (Figure 2c). The residual-mean Rossby number ($\mathrm{Ro}^{\#} \overset{\text{def}}{=} f^{-1}(\hat{v}_{\tilde{x}} - \hat{u}_{\tilde{y}})$) shown in Figure 2e is smaller than unity indicating that over most of the North Atlantic basin, the residual-mean flow in the interior is balanced in our model with the exception of regions with energetic currents, e.g. the Gulf Stream, loop current in the Gulf of Mexico and the North Brazil Current. Near the equator, the Coriolis parameter becomes small leading to large Rossby numbers. The kinematics of discretizing the gradients in buoyancy coordinates are given in Appendix B. We now move on to examine the eddy feedback onto the (residual) mean flow. Hereon, we drop the prefix 'residual' unless required for clarity.

4.1 The Eliassen-Palm flux

The E-P flux tensor ($\mathbf{E}$) in the TWA framework (eqns. (1) and (2)) is:

$$\mathbf{E} = \begin{pmatrix} \widehat{u''u''} + \frac{1}{2\overline{\sigma}}\overline{\zeta'^2} & \widehat{u''v''} & 0 \\ \widehat{v''u''} & \widehat{v''v''} + \frac{1}{2\overline{\sigma}}\overline{\zeta'^2} & 0 \\ \widehat{\varpi''u''} + \frac{1}{\overline{\sigma}}\overline{\zeta' m'_{\tilde{x}}} & \widehat{\varpi''v''} + \frac{1}{\overline{\sigma}}\overline{\zeta' m'_{\tilde{y}}} & 0 \end{pmatrix} \tag{14}$$

where $(\cdot)'' = (\cdot) - \widehat{(\cdot)}$ and $(\cdot)' = (\cdot) - \overline{(\cdot)}$ are the residual from the thickness-weighted and ensemble averages respectively (Maddison & Marshall, 2013; Aoki, 2014; Ringler et al., 2017). The two are related via the (eddy-induced) bolus velocity (Greatbatch, 1998; McDougall & McIntosh, 2001):

$$\mathbf{u}'' = \mathbf{u} - \frac{\overline{\sigma\mathbf{u}}}{\overline{\sigma}} = \overline{\mathbf{u}} + \mathbf{u}' - \frac{\overline{(\overline{\sigma} + \sigma')(\overline{\mathbf{u}} + \mathbf{u}')}}{\overline{\sigma}} \tag{15}$$

$$= \mathbf{u}' + \frac{\overline{\sigma'\mathbf{u}'}}{\overline{\sigma}}. \tag{16}$$

We show each term in equation (14) in Figure 3. The Reynolds stress term $\widehat{u''v''}$ is associated with barotropic processes in analogy to atmospheric jets (Figure 3a; Aoki et al., 2016; Jamet et al., 2021; Vallis, 2017, Chapter 15). The eddy momentum flux terms ($\widehat{u''^2}, \widehat{v''^2}$) in Figure 3c,d are seen to exchange momentum between eddies and the mean flow, i.e. to accelerate or decelerate the Gulf Stream as they affect the horizontal shear upon taking their gradients. The term due to the vertical displacement of buoyancy layer ($\frac{1}{2\overline{\sigma}}\overline{\zeta'^2}$) is related to the eddy potential energy (EPE; cf. equations A27-A30). The interfacial form stress ($\overline{\zeta'\tilde{\nabla}_{\mathrm{h}} m'}$; Figure 3e,f) associated with baroclinic instability is "deceivingly" orders of magnitude smaller than the other terms. However, it is the divergence of the E-P flux and not the flux itself that goes into the momentum equations, and the hor-

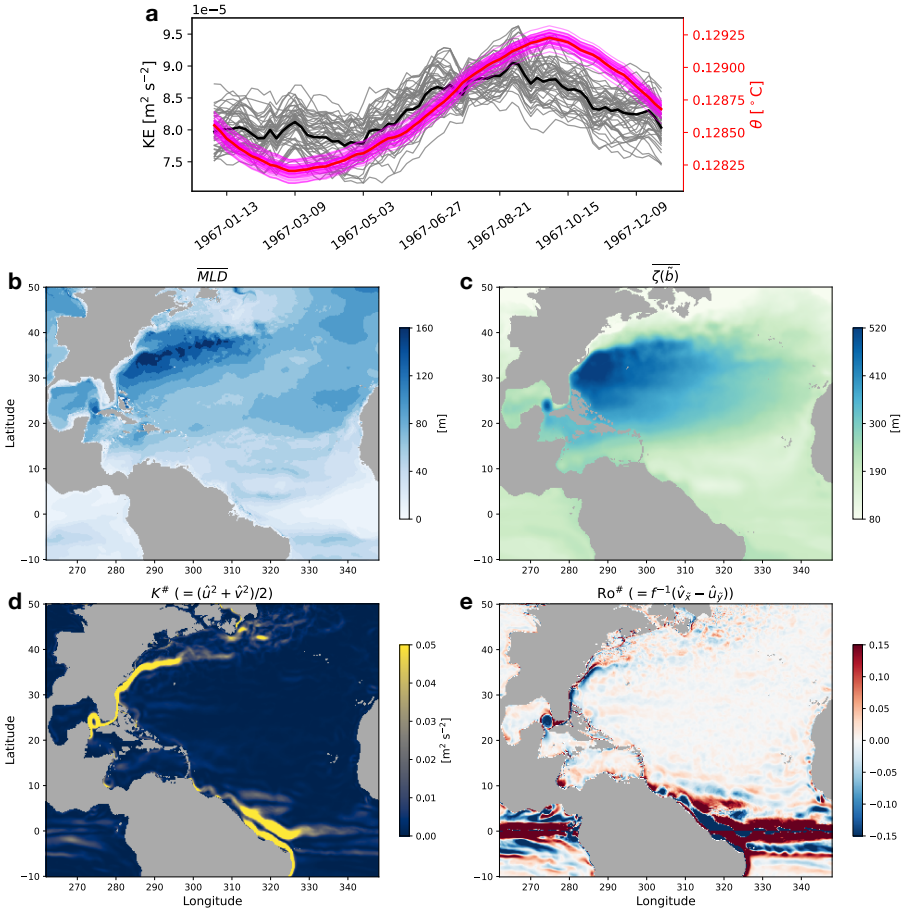

Figure 2. Time series of the domain-averaged total KE (black) and potential temperature (red) for the 48 ensemble members between 15°S-50°N. The thick lines show the ensemble mean and the thin lines each ensemble member **a**. **b**,**c** The ensemble-mean MLD on January 3, 1967 and depth of the iso-surface of buoyancy $\tilde{b} = -0.26$ m s^{-2}. **d**,**e** The residual-mean KE ($K^{\#}$) and Rossby number (Ro$^{\#}$) on the same buoyancy surface.

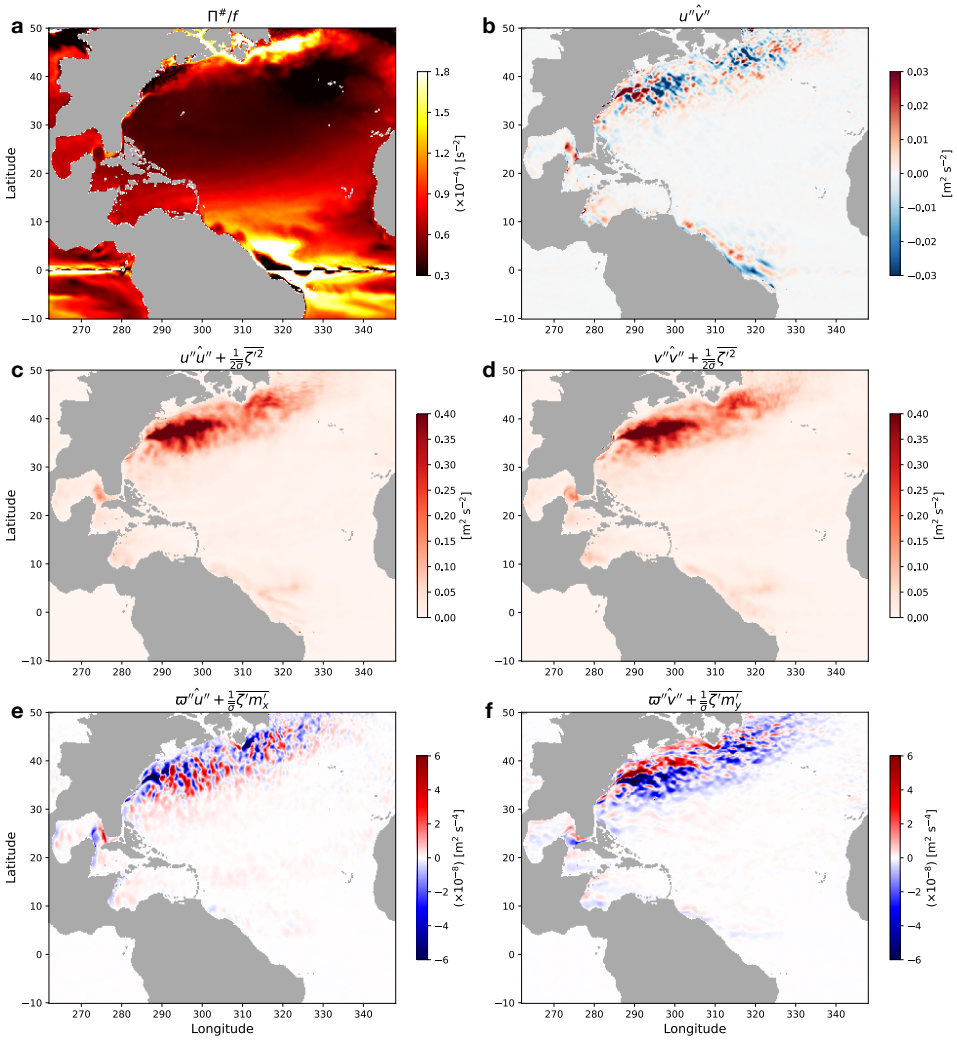

Figure 3. The residual-mean Ertel potential vorticity normalized by the local Coriolis parameter ($\Pi^{\#}/f \stackrel{\text{def}}{=} \overline{\sigma}^{-1}(1 + \mathrm{Ro}^{\#})$) **a** and terms in the E-P flux tensor **b-f** on January 3, 1967 on the iso-surface of buoyancy as in Figure 2. Note the scaling factors on panels a, e and f.

izontal ($\tilde{\nabla}_{\mathrm{h}}$) and vertical gradient ($\partial_{\tilde{b}}$) differ by roughly O(10^6). The contribution from the adiabatic and compressibility effects (i.e. the terms with ϖ) were smaller than the interfacial form stress by another order of magnitude or more in the subtropics (not shown). It is quite surprising that the signals in the equatorial undercurrent region, although having relatively high KE (Figure 2d), are significantly smaller than in the Gulf Stream and North Brazil Current regions, virtually not visible in Figure 3. This implies that the mean flow dominates over the eddies in the equatorial region.

Writing out the E-P flux divergence in eqns. (1) and (2) gives:

$$-\overline{\mathbf{e}}_1 \cdot (\tilde{\nabla} \cdot \mathbf{E}) = -\overline{\sigma}^{-1}\Big(\big[\overline{\sigma}(\widehat{u''u''} + \frac{1}{2\overline{\sigma}}\overline{\zeta'^2})\big]_{\tilde{x}} + \big[\overline{\sigma}\widehat{v''u''}\big]_{\tilde{y}} + \big[\overline{\sigma}(\widehat{\varpi''u''} + \frac{1}{\overline{\sigma}}\overline{\zeta' m'_{\tilde{x}}})\big]_{\tilde{b}}\Big) \tag{17}$$

$$= -\overline{\sigma}^{-1}\Big([\overline{\sigma u''u''} + \overline{\zeta'^2}/2]_{\tilde{x}} + [\overline{\sigma v''u''}]_{\tilde{y}} + [\overline{\sigma\varpi''u''} + \overline{\zeta' m'_{\tilde{x}}}]_{\tilde{b}}\Big), \tag{18}$$

$$\stackrel{\text{def}}{=} -(E^{00}_{\tilde{x}} + E^{10}_{\tilde{y}} + E^{20}_{\tilde{b}}) \tag{19}$$

$$-\overline{\mathbf{e}}_2 \cdot (\tilde{\nabla} \cdot \mathbf{E}) = -\overline{\sigma}^{-1}\Big(\big[\overline{\sigma}\widehat{u''v''}\big]_{\tilde{x}} + \big[\overline{\sigma}(\widehat{v''v''} + \frac{1}{2\overline{\sigma}}\overline{\zeta'^2})\big]_{\tilde{y}} + \big[\overline{\sigma}(\widehat{\varpi''v''} + \frac{1}{\overline{\sigma}}\overline{\zeta' m'_{\tilde{y}}})\big]_{\tilde{b}}\Big) \tag{20}$$

$$= -\overline{\sigma}^{-1}\Big([\overline{\sigma u''v''}]_{\tilde{x}} + [\overline{\sigma v''v''} + \overline{\zeta'^2}/2]_{\tilde{y}} + [\overline{\sigma\varpi''v''} + \overline{\zeta' m'_{\tilde{y}}}]_{\tilde{b}}\Big), \tag{21}$$

$$\stackrel{\text{def}}{=} -(E^{01}_{\tilde{x}} + E^{11}_{\tilde{y}} + E^{21}_{\tilde{b}}). \tag{22}$$

As the signal in the North Atlantic basin is the largest in the separated Gulf Stream region (Figure 3), we show each term in the E-P flux divergence north of 25°N (Figure 4). The large signal is consistent with Jamet et al. (2021) where they found the subtropical gyre to be a Fofonoff-like inertial circulation (Fofonoff, 1981), and that the separated jet was where the energy input from surface winds were predominantly lost to eddies. The divergence of interfacial form stress ($E^{20}_{\tilde{b}}, E^{21}_{\tilde{b}}$) becomes larger than the divergence of the Reynolds stress terms ($E^{10}_{\tilde{y}}, E^{01}_{\tilde{x}}$), which are the smallest amongst the three terms in the E-P flux convergence (Figure 4b,c). The contribution from the terms with diasurface velocity (ϖ'') was roughly two-orders of magnitude smaller than the other terms in the E-P flux convergence in the adiabatic interior (not shown), which supports the neutrality of δ to define the buoyancy surfaces. Right at the separation of the Gulf Stream west of 290°E and around 36°N, the convergence of eddy momentum flux and potential energy, and interfacial form stress (i.e. baroclinic instability) tend to counteract each other; in the zonal direction, the eddy momentum flux and potential energy convergence tends to decelerate the Gulf Stream while as baroclinic instability tends to accelerate it (Figure 4a,e). The repeating positive and negative features further downstream are roughly on the scales of the Rossby deformation radius, consistent with Uchida, Deremble, Dewar, and Penduff (2021) where they diagnosed the E-P flux convergence from a 101-member quasi-geostrophic double-gyre ensemble. In the meridional direction, the eddy momentum flux and potential energy convergence tends to smooth out the Gulf Stream (decelerate the jet in the subpolar gyre by injecting northward momentum, and southward momentum in the subtropical gyre) while baroclinic instability tends to sharpen it (Figure 4d,f).

We now examine further details in the separated Gulf Stream, a region where eddies have been shown to modulate the mean flow structure (e.g. Cronin, 1996; Chassignet

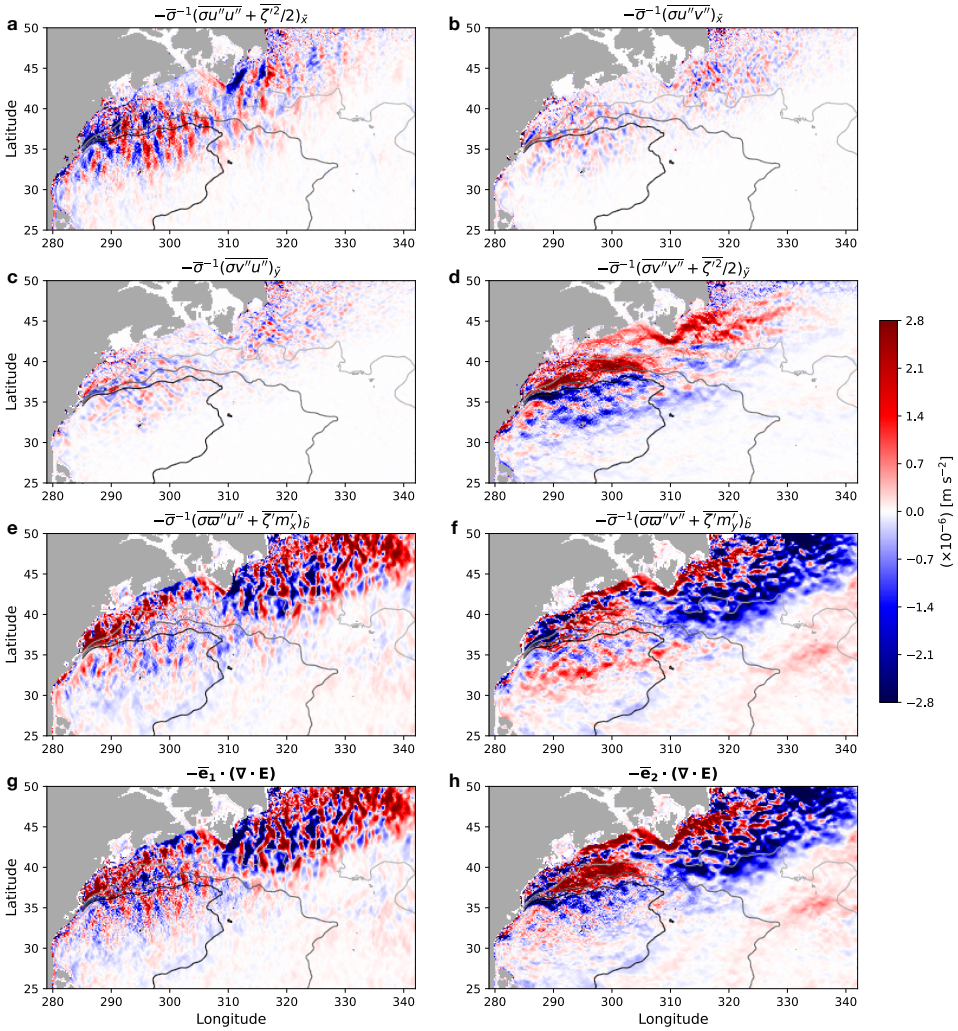

Figure 4. The terms in the convergence of E-P flux tensor on January 3, 1967 on the isosurface of $\tilde{b} = -0.26$ m s^{-2} **a-f**. Positive values (red shadings) indicate the eddies fluxing momentum to the mean flow and vice versa. The panels are laid out so that summing up the top three rows per column yields the total zonal $(-\overline{\mathbf{e}}_1 \cdot (\tilde{\nabla} \cdot \mathbf{E}))$ **g** and meridional E-P flux divergence $(-\overline{\mathbf{e}}_2 \cdot (\tilde{\nabla} \cdot \mathbf{E}))$ **h** respectively. The contours in grey shading east of 285°E indicate the 400, 300 and 200 m depth of the buoyancy surface.

& Xu, 2021), as seasonal means in order to capture representative features. Winter is defined as the months of January, February, March, and summer as July, August, September. Upon separation, the zonal E-P flux convergence tends to decelerate the Gulf Stream. The repeating features of positive and negative values for the zonal component of the E-P flux convergence persist and are likely associated to the jet meandering (Figure 5a,c). In the meridional direction, the E-P flux convergence tends to smooth out the separated Gulf Stream in the meridional direction (decelerate the jet northwards in the subtropical gyre on the North flank of the separated Gulf Stream and southwards in the subpolar gyre; Figure 4b,d) although this largely being contained west of 310°E. East of 310°E, the E-P flux convergence tends to shift the North Atlantic Current east and southwards in the open ocean, while northwards closer to the continental rise. Examining the meridional transect averaged over the zonal extent of 290°E-305°E where the separated Gulf Steam is roughly zonal (Figure 2d), the separated Gulf Stream can be identified with the steep shoaling of the iso-surfaces of buoyancy between 36°N-40°N (Figure 5e-h). The overall magnitude and reversal in sign at the core of the jet (around 37.5°N) with diminishing amplitude with depth for the zonal E-P flux divergence during winter ($-\overline{\mathbf{e}}_1 \cdot (\tilde{\nabla} \cdot \mathbf{E}$); Figures 5g, 6a,b) is roughly in agreement with Ringler et al. (2017, their Figure 6 where the sign convention in equation (17) is reversed from ours for the eddy forcing term and their units are in [m s^{-1} day^{-1}]) where they diagnosed an idealized zonally re-entrant jet. It is interesting to note, however, that the vertical structure of the E-P flux convergence is much smoother and barotropic during the summer with a consistent deceleration of the jet on its northern flank and acceleration on its southern flank (Figures 5g, 6e,f).

In Figure 6, we show the vertical profile of the seasonal E-P flux convergence along with each component in equations (17) and (20) area averaged over the zonal extent of 290°E-305°E. The E-P flux convergence closely follows that of the interfacial form stress convergence (i.e. baroclinic instability) with the Reynolds stress due to cross correlation between the zonal and meridional eddy momentum ($E^{10}_{\tilde{y}}, E^{01}_{\tilde{x}}$; orange lines) taking the smallest magnitude. The amplitude of interfacial form stress convergence is larger near the surface (viz. larger buoyancy values), which is expected from the seasonal surface forcing affecting the isopycnal tilt and hence baroclinicity of the surface flow. The meridional smoothing of the separated Gulf Stream is also apparent from the vertical profiles with the meridional E-P flux convergence taking negative values on the southern flank

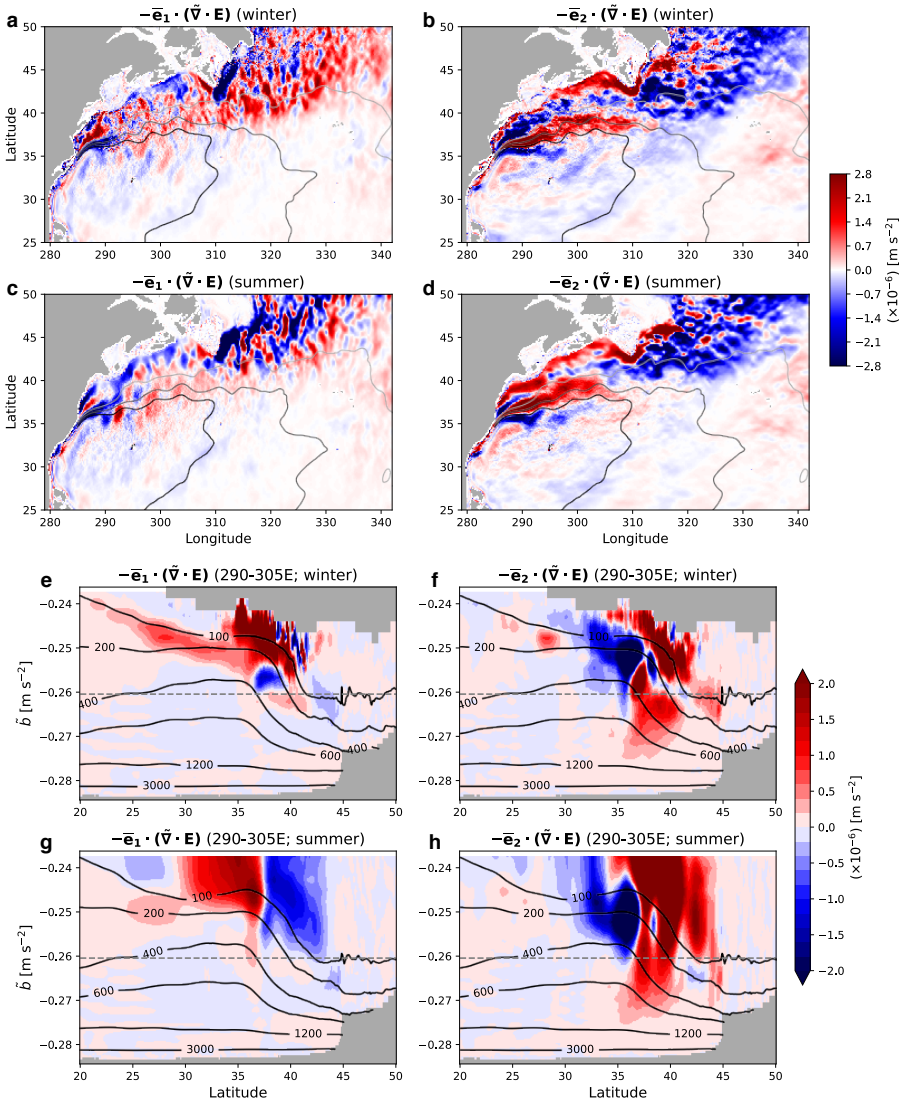

Figure 5. The seasonal mean of the zonal and meridional E-P flux convergence for winter and summer **a-d**. The contours in grey shading indicate the 400, 300 and 200 m depth of the buoyancy surface. **e-h** The zonal-mean transect between 290°E-305°E of the E-P flux convergence is shown in colored shading and ensemble-mean depth in black contours. The iso-surface of buoyancy used through Figures 2-4 is shown as the grey dashed line. The masked out region north of 30°N near the surface during winter is where the iso-surfaces of buoyancy outcrop across all ensemble members. We see that more buoyancy surfaces outcrop during winter.

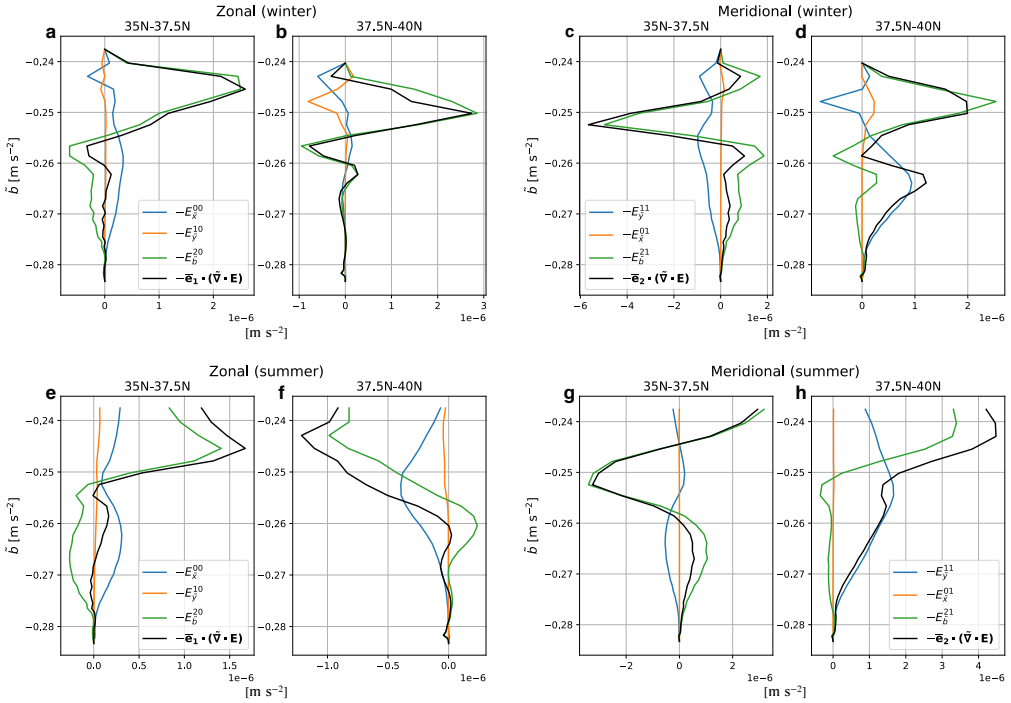

Figure 6. Vertical profile of the area-averaged, seasonal zonal and meridional E-P flux convergence north and south of the separated Gulf Stream over the zonal extent 290°E-305°E. The area averaging is separated between 35°N-37.5°N and 37.5°N-40°N. The top panels show the seasonal mean for winter and bottom for summer.

of the jet and positive values on the northern flank. The convergence of eddy momentum flux and potential energy tends to mirror that of interfacial form stress (blue and green lines in Figure 6). This counteracting balance is consistent with what Aoki et al. (2016, the terms $\partial_x R^x$ and $\partial_z(R^z + F_a^+)$ in their Figures 5a and 6) found in the Kuroshio extension region.

4.2 The ergodic assumption

In this section, we replace the averaging operator with the temporal mean of the 50 years of output ($\overline{(\cdot)}^t, (\cdot)'^t \stackrel{\text{def}}{=} (\cdot) - \overline{(\cdot)}^t$) from a single arbitrary realization (realization `00` to be specific) to examine the ergodic assumption and compare with our TWA results. Realization `00` was taken from a 24-member ensemble originally designed for a different study (Jamet et al., 2019b). The 48 members discussed above were constructed by adding 24 members to the first five years of this dataset. The TWA operator now becomes $\widehat{(\cdot)}^t \stackrel{\text{def}}{=} \overline{\sigma}^{t-1}\overline{\sigma(\cdot)}^t$ and eddies $(\cdot)''^t \stackrel{\text{def}}{=} (\cdot) - \widehat{(\cdot)}^t$. The maximum sound speed per

depth ($\mathcal{C}_s$) was recomputed for the 50 years of realization `00` in remapping the coordinate system. Although the averaging operator is now along the time dimension, we note that this is different from the Temporal-Residual Mean (TRM) framework developed by McDougall and McIntosh (2001) in the sense that our variables are thickness weighted. The hope of applying the ergodic assumption to a temporally varying system, as we have shown in previous sections, is that for a sufficiently long time series, such sub- and inter-annual variability will cancel out with only the stationary feature being extracted in the 'mean' flow.

In Figure 7, we show the climatological E-P flux convergence from realization `00`. In other words, all time scales shorter than 50 years are now relegated to the eddies. While having similar spatial structures to Figures 4 and 5a-d, they are more spread out with less detail. In particular, the seasonality is obscured by the climatological mean of 50 years and becomes similar to the summertime of the 48-member ensemble (Figure 5c,d). In other words, it misses the variability we see during wintertime (Figure 5a,b). Considering the 50-year time scale of averaging, the signals that emerge in the climatological E-P flux convergence are likely due to standing eddies. The climatological zonal-mean transect also resemble the ensemble summertime albeit with weaker amplitude (Figures 5e-h and 8) where the eddies tend to zonally decelerate the separated Gulf Stream on its northern flank and accelerate it on its southern flank (Figure 8a). In the meridional direction, the eddies tend to decelerate the subpolar gyre on the northern flank of the separated Gulf Stream and the subtropical gyre on its southern flank (Figure 8b).

Taking the climatological time mean of 50 years of output is perhaps the most conservative definition of the mean flow under ergodicity. We, therefore, now loosen the temporal averaging to a climatological annual cycle in defining the residual mean flow. In doing so, we chunk the 50 years into 50 annual segments and take their average to produce a single segment of $\sim$ 365 days. Namely, we treat each year as an individual realization of the ocean, generating a pseudo 50-member year-long ensemble. The eddies are now defined as fluctuations about this climatological annual cycle. In Figure 9, we show the MKE on a buoyancy level on January 3 with similar depths diagnosed from the ensemble and realization `00`. While the maximum MKE amplitudes are similar, the mean flow is more spread out in realization `00`. This likely comes from the different paths the Gulf Stream takes resulting as a response to different yearly atmospheric states, which get averaged all together. In other words, while the degrees of freedom are similar be-

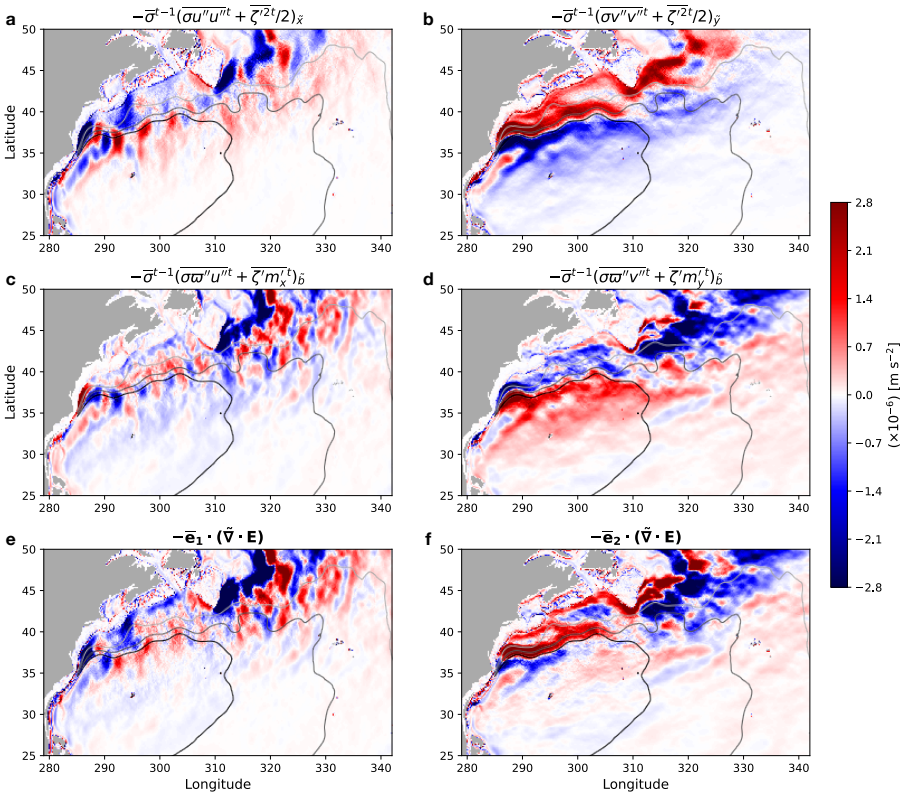

Figure 7. The terms in the climatological convergence of E-P flux tensor on the iso-surface of $\tilde{b} = -0.26$ m s^{-2} from realization `00` **a-d**. We do not show the terms due to the Reynolds stress ($\widehat{u''^t v''^t}^t$) as they were negligible compared to the other terms, and omit the supercript t on variables with primes to avoid the clutter. **e**,**f** Climatology of the total zonal ($-\overline{\mathbf{e}}_1 \cdot (\tilde{\nabla} \cdot \mathbf{E})$) and meridional E-P flux divergence ($-\overline{\mathbf{e}}_2 \cdot (\tilde{\nabla} \cdot \mathbf{E})$) respectively. The contours in grey shading east of 285°E indicate the 400, 300 and 200 m depth of the buoyancy surface.

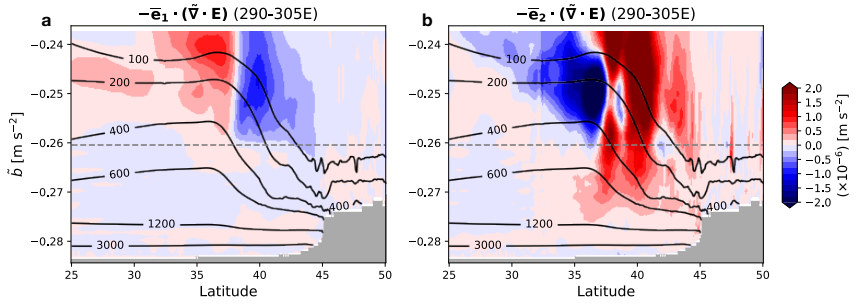

Figure 8. The climatological zonal-mean transect between 290°E-305°E of the E-P flux convergence is shown in colored shading and ensemble-mean depth in black contours from realization `00` **a**,**b**. The iso-surface of buoyancy used in Figure 7 is shown as the grey dashed line.

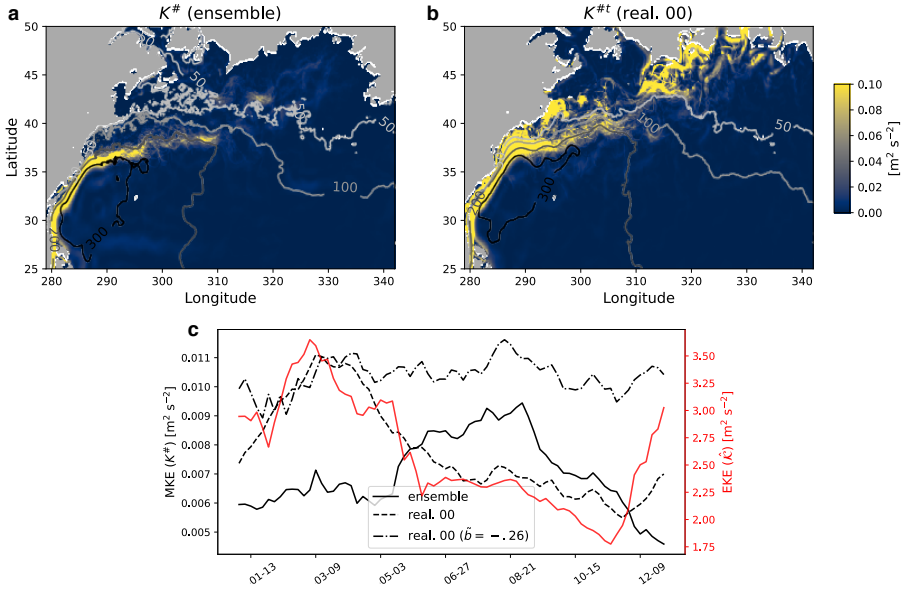

Figure 9. The (residual) mean KE on January 3 from the ensemble ($K^{\#}$) and realization `00` ($K^{\#t}$) on buoyancy levels with similar depth **a**,**b**. The regions with outcropping buoyancy surface are masked out. The colors indicate the MKE and contours in grey scaling show the depths for 50, 100, 200 and 300 m. **c** Time series of domain averaged MKE ($K^{\#}$ and $K^{\#t}$) in black plotted against the left y axis and EKE ($\widehat{\mathscr{K}}$) in red plotted against the right y axis. The domain was taken over the horizontal extent shown in panels a,b. Note the difference in magnitudes of order on the y axes.

tween the ensemble (48 members) and realization `00` (50 members assuming a decorrelation time scale of a year), the ensemble mean captures the oceanic response to the atmospheric state specific to 1967. Realization `00`, on the other hand, implies that 50 years are not sufficient for the 'eddies' to cancel out upon averaging for a climatological annual cycle and the mean flow becomes ill defined.

The imprint of fluctuations from each year onto the MKE domain averaged over the depths of ∼50-500 m ($\tilde{b} \in (-0.25, -0.26)$) result in its seasonality to differ from the ensemble mean; realization `00` takes its maximum around March while the ensemble around August (black solid and dashed lines in Figure 9c respectively). However, the seasonality in the area averaged MKE from realization `00` on $\tilde{b} = -0.26$ shows a summertime maximum (black dot-dashed line in Figure 9c). This implies that the discrepancy between $K^{\#}$ and $K^{\#t}$ results from the surface ocean being sensitive to the atmospheric state while being less so in the interior. Indeed, the domain averaged eddy KE (EKE;

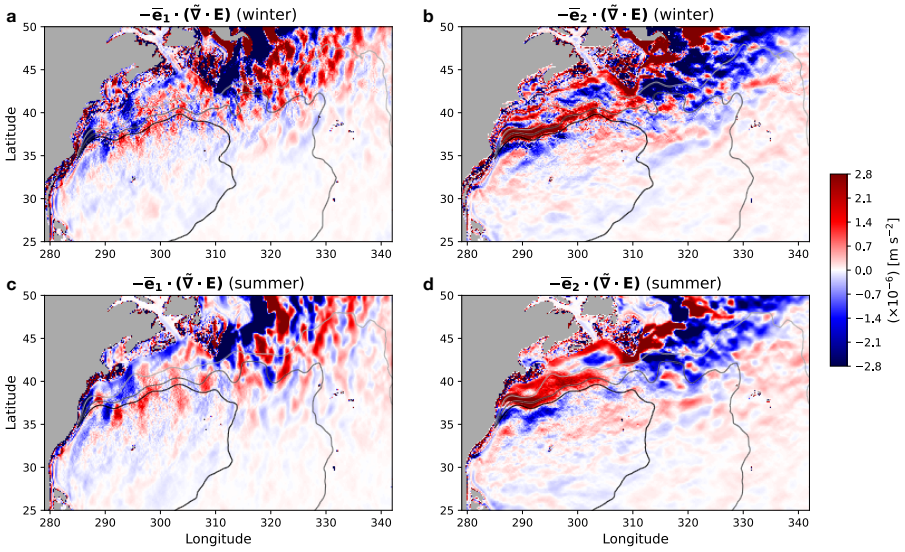

Figure 10. The E-P flux convergence from realization `00` for the climatological winter and summer on the iso-surface of $\tilde{b} = -0.26$ m s^{-2}. The contours in grey shading east of 285°E indicate the 400, 300 and 200 m depth of the buoyancy surface.

see Appendix A for definition) diagnosed from the ensemble shows a maximum during winter when the surface ocean is more susceptible to baroclinic instability due to atmospheric cooling (red line in Figure 9c; Uchida et al., 2017). We conclude that in the process of creating a climatological annual cycle, we convolute the oceanic response to different atmospheric states (i.e. interannual variability) and contaminate the eddy-mean flow decomposition. The ill defined mean flow also imprints itself onto the E-P flux convergence for the climatological winter and summer as we show in Figure 10, which arguably looks noisier than Figure 5a-d particularly north of the 300 m depth contour in the subpolar gyre.

5 Discussion and summary

By running a 48-member ensemble run of the North Atlantic Ocean at mesoscale-permitting resolution (1/12°), we have shown that the thickness-weighted average (TWA) framework can be employed successfully in diagnosing eddy-mean flow interactions in a realistic ocean simulation. In doing so, we have introduced a new buoyancy variable for a realistic EOS, which is neutral and dynamically consistent; both characteristics are necessary for the TWA analysis. The ensemble approach negates the necessity for any temporal averaging in defining the residual-mean flow; we are able to exclude any tem-

poral variability, such as seasonal and interannual fluctuations, from the eddy term and extract the intrinsic variability of the ocean. We show that the Eliassen-Palm (E-P) flux convergence (i.e. negative divergence), which encapsulates the eddy feedback onto the mean flow (Maddison & Marshall, 2013), tends to flux northward momentum to Gulf Stream on its northern flank and southward moment on its southern flank ($-\overline{\mathbf{e}}_2 \cdot (\tilde{\nabla} \cdot \mathbf{E}$); Figure 5b,d,f,h); i.e. the eddies tend to smooth out the Gulf Stream in the meridional direction.

Modelling studies with varying spatial resolution have shown that the Gulf Stream tends to overshoot northwards and the North Atlantic Current (NAC) flows too zonally in coarse resolution models (e.g. Lévy et al., 2010; Chassignet & Xu, 2017, 2021). The overshooting may partially be attributable to eddy feedback being insufficiently resolved at mesoscale-permitting resolutions, in addition to unresolved submesoscale boundary layer processes (e.g. Renault et al., 2016). In particular, it would be interesting to see whether further increasing the model resolution would increase the amplitude of baroclinic instability near the surface ($E_{\tilde{b}}^{20}, E_{\tilde{b}}^{21}$) and convergence of eddy momentum flux and potential energy in the interior ($E_{\tilde{x}}^{00}, E_{\tilde{y}}^{11}$), which tend to acccelerate the jet southward in the subpolar gyre and decelerate it southward in the subtropical gyre upon the Gulf Stream separation west of 290°E (i.e. shift the jet southwards) as we see from their annual means (Figure 11). The same could be said for a better representation of the NAC path where the eddies in our model tend to flux northward momentum into the mean flow and hence allow for its north-eastward turn near the continental rise of the Grand Banks (Figures 4 and 5). Although it is beyond the scope of this study, the significance of baroclinic processes will likely increase with resolution as mixed-layer instability becomes better resolved (Boccaletti et al., 2007; Capet et al., 2008a, 2008b; Su et al., 2018; Uchida et al., 2019; Yang et al., 2021).

We have also examined the often assumed ergodicity in decomposing the eddy and mean flow by replacing the averaging operator with a 50-year time mean for a single realization within the ensemble. To some extent, the agreement between Figures 4, 5, 11 and 7 implies that the ensemble size of 48 is able to extract the eddy signals that emerge at mesoscale-permitting resolution. Amplitudes of the 95% confidence interval of the terms in E-P flux convergence being smaller than one-third of the amplitudes of the convergence itself supports the statistical significance of our eddy signals diagnosed from the ensemble (Figures 4 and C1). The difference between the ensemble and 50-year clima-

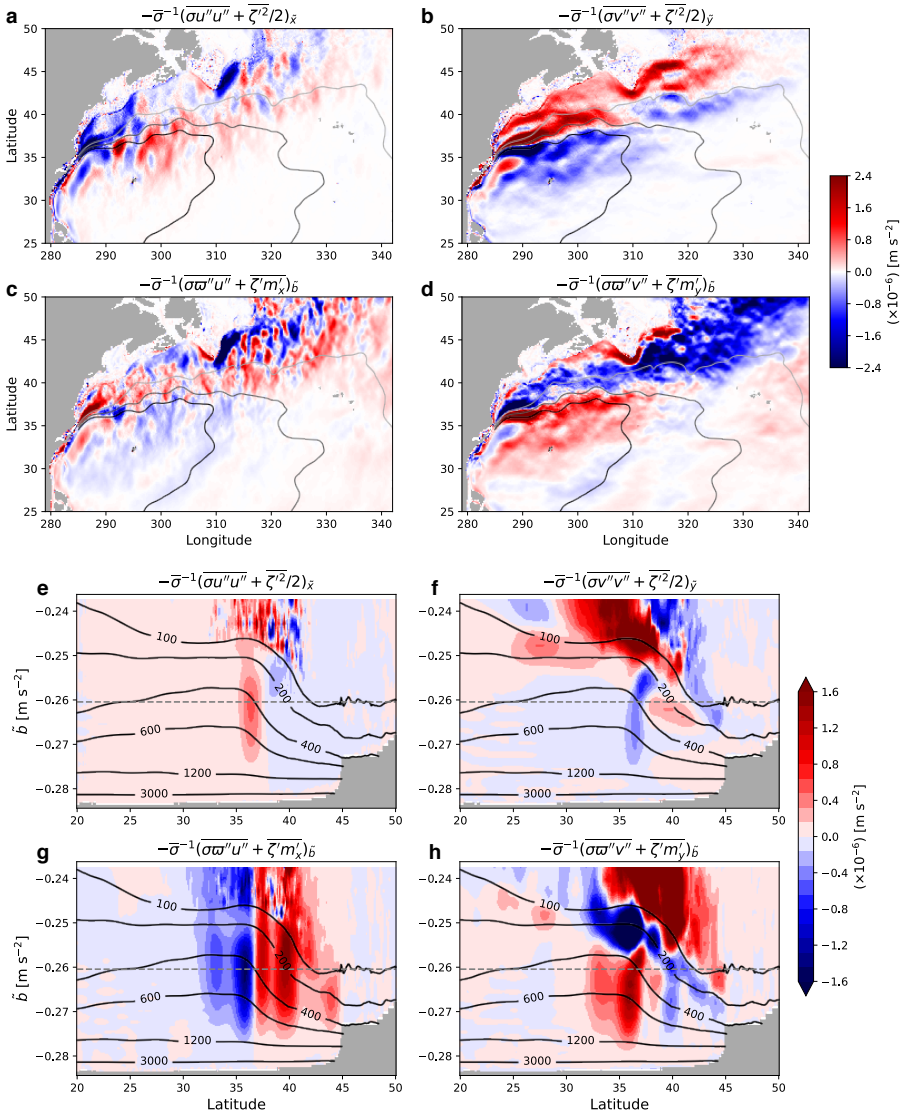

Figure 11. The annual mean of the covergence of eddy momentum flux and potential energy, and interfacial form stress for $\tilde{b} = -0.26$ **a-d**. The contours in grey shading east of 285°E indicate the 400, 300 and 200 m depth of the buoyancy surface. **e-h** The annual and zonal mean transect between 290°E-305°E of the E-P flux convergence is shown in colored shading and ensemble-mean depth in black contours. The iso-surface of buoyancy used through panels **a-d** is shown as the grey dashed line.

tology of an arbitrary realization amongst the ensemble (realization `00`), on the other hand, likely comes from seasonal, interannual and decadal variability, and transient eddies, which are obscured in the climatological view. Loosening the time mean to a climatological annual cycle for the mean flow, on the other hand, convolutes the oceanic response to interannual variability in the atmospheric forcing and contaminates the eddy-mean flow decomposition (Figure 9). This is consistent with Aiki and Richards (2008) where they found the energy stored in the mean and eddy flow to change depending on the duration of the temporal averaging applied. While it is not our intention to claim whether defining the mean flow via a time mean is correct or not for realistic simulations, our results imply that one should be mindful of what goes into defining the mean flow and consequently the eddies.

Lastly, ensemble modelling has shown us that a small perturbation to the non-linear system can lead to very different states of the ocean and climate (e.g. Bessières et al., 2017; Maher et al., 2019; Jamet et al., 2019b; Uchida, Deremble, & Penduff, 2021; Fedele et al., 2021). In light of this, we argue that it is important to consider the full temporal variability of the ocean and that eddy parametrizations should incorporate information of the time-varying eddy-mean flow interaction and not just its climatological state.

Appendix A Energetics under a non-linear equation of state

In this Appendix, we derive the energetics in a similar manner to Aiki et al. (2016) but in a framework consistent with the ensemble formalism and a realistic EOS. The TWA residual-mean horizontal momentum equation in geopotential coordinates neglecting dissipation is (Young, 2012; Ringler et al., 2017):

$$\hat{\mathbf{u}}_t + \mathbf{v}^{\#} \cdot \nabla \hat{\mathbf{u}} + f\mathbf{k} \times \hat{\mathbf{u}} = -\nabla_{\mathrm{h}} \phi^{\#} - \overline{\mathbf{e}} \cdot (\nabla \cdot \mathbf{E}), \tag{A1}$$

where $\mathbf{v}^{\#} \overset{\text{def}}{=} \hat{u}\mathbf{i} + \hat{v}\mathbf{j} + w^{\#}\mathbf{k}$ and $\phi^{\#} \overset{\text{def}}{=} \overline{m}(\tilde{t}, \tilde{x}, \tilde{y}, b^{\#}(t,x,y,z)) + b^{\#} z$ are the residual-mean velocity and hydrostatic pressure anomaly. It is important to keep in mind that the "z" here is the ensemble averaged depth of an iso-surface of buoyancy, viz. $z = \overline{\zeta}(\tilde{t}, \tilde{x}, \tilde{y}, b^{\#}(t,x,y,z))$. The residual-mean kinetic energy (MKE; $K^{\#} = |\hat{\mathbf{u}}|^2/2$) budget becomes:

$$K^{\#}_t + \mathbf{v}^{\#} \cdot \nabla K^{\#} = -\hat{\mathbf{u}} \cdot \nabla_{\mathrm{h}} \phi^{\#} - \hat{\mathbf{u}} \cdot \left[\overline{\mathbf{e}} \cdot (\nabla \cdot \mathbf{E})\right] \tag{A2}$$

$$= -\hat{\mathbf{u}} \cdot \nabla_{\mathrm{h}} \phi^{\#} - w^{\#} \phi^{\#}_z + w^{\#} b^{\#} - \hat{\mathbf{u}} \cdot \left[\overline{\mathbf{e}} \cdot (\nabla \cdot \mathbf{E})\right] \tag{A3}$$

$$= -\mathbf{v}^{\#} \cdot \nabla \phi^{\#} + w^{\#} b^{\#} - \hat{\mathbf{u}} \cdot \left[\overline{\mathbf{e}} \cdot (\nabla \cdot \mathbf{E})\right]. \tag{A4}$$

We can now define the mean dynamic enthalpy as (McDougall, 2003; Young, 2010):

$$h^{\#} \overset{\text{def}}{=} \int_{\Phi_0}^{\Phi^{\#}} \frac{b^{\#}(\overline{\theta}, \overline{s}, \Phi^{\#})}{g} d\Phi^{\#\prime} = \int_{z}^{0} b^{\#} dz', \tag{A5}$$

where $\Phi^{\#} = \Phi_0 - gz$ is the dynamically non-active part of the hydrostatic pressure to be consistent with the Boussinesq approximation. The material derivative of $h^{\#}(\overline{\theta}, \overline{s}, \Phi^{\#})$ is:

$$\frac{D^{\#}}{Dt} h^{\#} = h^{\#}_{\Phi^{\#}} \frac{D^{\#}\Phi^{\#}}{Dt} + h^{\#}_{\overline{\theta}} \frac{D^{\#}\overline{\theta}}{Dt} + h^{\#}_{\overline{s}} \frac{D^{\#}\overline{s}}{Dt} \tag{A6}$$

$$= h^{\#}_{\Phi^{\#}} \Phi^{\#}_{z} \frac{D^{\#} z}{Dt} + h^{\#}_{\overline{\theta}} \frac{D^{\#}\overline{\theta}}{Dt} + h^{\#}_{\overline{s}} \frac{D^{\#}\overline{s}}{Dt} \tag{A7}$$

$$= -w^{\#} b^{\#} + h^{\#}_{\overline{\theta}} \frac{D^{\#}\overline{\theta}}{Dt} + h^{\#}_{\overline{s}} \frac{D^{\#}\overline{s}}{Dt}. \tag{A8}$$

Therefore,

$$\frac{D^{\#}}{Dt}(K^{\#} + h^{\#}) = -\nabla \cdot \mathbf{v}^{\#} \phi^{\#} + \mathcal{H}^{\#} - \hat{\mathbf{u}} \cdot \big[\overline{\mathbf{e}} \cdot (\nabla \cdot \mathbf{E})\big], \tag{A9}$$

where $\mathcal{H}^{\#} \overset{\text{def}}{=} h^{\#}_{\overline{\theta}} \frac{D^{\#}\overline{\theta}}{Dt} + h^{\#}_{\overline{s}} \frac{D^{\#}\overline{s}}{Dt}$ and we have invoked $\nabla \cdot \mathbf{v}^{\#} = 0$.

On the other hand, the total KE budget remapped onto buoyancy coordinate is:

$$\frac{DK}{Dt} = -\tilde{\nabla} \cdot \mathbf{v}\phi + w\tilde{b}, \tag{A10}$$

where $\mathbf{v} \overset{\text{def}}{=} v^1 \mathbf{e}_1 + v^2 \mathbf{e}_2 + v^3 \mathbf{e}_3 = u\mathbf{e}_1 + v\mathbf{e}_2 + \big(\varpi + \frac{\zeta_{\tilde{t}}}{\sigma}\big)\mathbf{e}_3$ and $\tilde{\nabla} \cdot \mathbf{v} = \sigma^{-1}\big[(\sigma v^1)_{\tilde{x}} + (\sigma v^2)_{\tilde{y}} + (\sigma v^3)_{\tilde{b}}\big]$ $(= 0)$ is the three-dimensional divergence. Defining the dynamic enthalpy in a similar manner as in equation (A5), namely,

$$h = \int_{\zeta}^{0} \tilde{b}\ d\zeta' = \int_{\tilde{b}}^{b_{\text{surf}}} b'\sigma\ db', \tag{A11}$$

yields:

$$\frac{D}{Dt}(K + h) = -\tilde{\nabla} \cdot \mathbf{v}\phi + \mathcal{H}, \tag{A12}$$

where $\mathcal{H} \overset{\text{def}}{=} h_\theta \frac{D\theta}{Dt} + h_s \frac{Ds}{Dt}$. Ensemble averaging after thickness weighting equation (A12) gives:

$$\overline{\sigma \frac{D}{Dt}(K + h)} = -\overline{\sigma \tilde{\nabla} \cdot \mathbf{v}\phi} + \overline{\sigma \mathcal{H}} \tag{A13}$$

$$= -\overline{\sigma}\,\widehat{\tilde{\nabla} \cdot \mathbf{v}\phi} + \overline{\sigma}\widehat{\mathcal{H}}, \tag{A14}$$

The total KE can be expanded as:

$$K = \frac{1}{2}|\hat{\mathbf{u}} + \mathbf{u}''|^2 \tag{A15}$$

$$= \frac{|\hat{\mathbf{u}}|^2}{2} + \frac{|\mathbf{u}''|^2}{2} + \hat{u}u'' + \hat{v}v'' \tag{A16}$$

$$\overset{\text{def}}{=} K^{\#} + \mathscr{K} + \hat{u}u'' + \hat{v}v'', \tag{A17}$$

so plugging in equation (A17), and keeping in mind that $\overline{\widehat{(\cdot)}} = \widehat{(\cdot)}$ and $\overline{\sigma(\cdot)''} = 0$, each term on the left-hand side (LHS) of equation (A14) can be written as:

$$\overline{\sigma\frac{DK}{Dt}} = \overline{\sigma(K_{\tilde{t}} + uK_{\tilde{x}} + vK_{\tilde{y}} + \varpi K_{\tilde{b}})} \tag{A18}$$

$$= (\overline{\sigma K})_{\tilde{t}} + (\overline{\sigma u K})_{\tilde{x}} + (\overline{\sigma v K})_{\tilde{y}} + (\overline{\sigma\varpi K})_{\tilde{b}} \tag{A19}$$

$$= \overline{\sigma}\Big[\frac{D^{\#}}{Dt}(K^{\#} + \widehat{\mathscr{K}}) + \tilde{\nabla}\cdot(\mathbf{J}^K + \hat{u}\mathbf{J}^u + \hat{v}\mathbf{J}^v)\Big], \tag{A20}$$

where $\widehat{\mathscr{K}}$ is the eddy kinetic energy (EKE), and $\mathbf{J}^K \overset{\text{def}}{=} \widehat{u''\mathscr{K}}\mathbf{e}_1 + \widehat{v''\mathscr{K}}\mathbf{e}_2 + \widehat{\varpi''\mathscr{K}}\mathbf{e}_3$, $\mathbf{J}^u \overset{\text{def}}{=} \widehat{u''^2}\mathbf{e}_1 + \widehat{v''u''}\mathbf{e}_2 + \widehat{\varpi''u''}\mathbf{e}_3$, $\mathbf{J}^v \overset{\text{def}}{=} \widehat{u''v''}\mathbf{e}_1 + \widehat{v''^2}\mathbf{e}_2 + \widehat{\varpi''v''}\mathbf{e}_3$ are the eddy fluxes of kinetic energy, eddy zonal and meridional velocities respectively, and

$$\overline{\sigma\frac{Dh}{Dt}} = \overline{\sigma(h_{\tilde{t}} + uh_{\tilde{x}} + vh_{\tilde{y}} + \varpi h_{\tilde{b}})} \tag{A21}$$

$$= (\overline{\sigma h})_{\tilde{t}} + (\overline{\sigma u h})_{\tilde{x}} + (\overline{\sigma v h})_{\tilde{y}} + (\overline{\sigma\varpi h})_{\tilde{b}} \tag{A22}$$

$$= (\overline{\sigma}\hat{h})_{\tilde{t}} + \big[\overline{\sigma}(\hat{u}\hat{h} + \widehat{u''h''})\big]_{\tilde{x}} + \big[\overline{\sigma}(\hat{v}\hat{h} + \widehat{v''h''})\big]_{\tilde{y}} + \big[\overline{\sigma}(\hat{\varpi}\hat{h} + \widehat{\varpi''h''})\big]_{\tilde{b}} \tag{A23}$$

$$= \overline{\sigma}\Big(\frac{D^{\#}}{Dt}\hat{h} + \tilde{\nabla}\cdot\mathbf{J}^h\Big), \tag{A24}$$

where $\mathbf{J}^h \overset{\text{def}}{=} \widehat{u''h''}\mathbf{e}_1 + \widehat{v''h''}\mathbf{e}_2 + \widehat{\varpi''h''}\mathbf{e}_3$ is the eddy flux of fluctuations in dynamic enthalpy, and we have used the relation $\overline{\sigma\phi\theta} = \overline{\sigma}(\hat{\phi}\hat{\theta} + \widehat{\phi''\theta''})$ (equation (72) in Young, 2012). Hence, combining equations (A20) and (A24), equation (A14) becomes:

$$\frac{D^{\#}}{Dt}(K^{\#} + \widehat{\mathscr{K}} + \hat{h}) = -\tilde{\nabla}\cdot(\mathbf{J}^K + \mathbf{J}^h + \hat{u}\mathbf{J}^u + \hat{v}\mathbf{J}^v) - \widehat{\tilde{\nabla}\cdot\mathbf{v}\phi} + \widehat{\mathcal{H}}. \tag{A25}$$

Subtracting equation (A9) from (A25) yields the eddy energy budget:

$$\frac{D^{\#}}{Dt}(\widehat{\mathscr{K}} + \hat{h} - h^{\#}) = -(\widehat{\tilde{\nabla}\cdot\mathbf{v}\phi} - \nabla\cdot\mathbf{v}^{\#}\phi^{\#}) - \tilde{\nabla}\cdot(\mathbf{J}^K + \mathbf{J}^h + \hat{u}\mathbf{J}^u + \hat{v}\mathbf{J}^v) + \widehat{\mathcal{H}} - \mathcal{H}^{\#} + \hat{\mathbf{u}}\cdot\big[\overline{\mathbf{e}}\cdot(\nabla\cdot\mathbf{E})\big]. \tag{A26}$$

Equations (A9) and (A26) are the relations derived by Aoki (2014) but for a non-linear EOS and non-zero dia-surface velocity where the residual-mean flow and eddies exchange energy via the E-P flux divergence. It is perhaps interesting to note that h'' is not the eddy potential energy (EPE; $\widehat{\mathscr{H}} \overset{\text{def}}{=} \hat{h} - h^{\#}$ in equation (A26)) and they are related to one another as $h'' = h - (h^{\#} + \widehat{\mathscr{H}})$.

For a linear EOS, the EPE can be rewritten as:

$$\widehat{\mathscr{H}} = -b^{\#}(\hat{\zeta} - \overline{\zeta}) = -b^{\#}\frac{\overline{\sigma'\zeta'}}{\overline{\sigma}}, \tag{A27}$$

by taking advantage of $\hat{h} = -\tilde{b}\hat{\zeta}$, $h^{\#} = -b^{\#}\overline{\zeta}$ and $\tilde{b} = b^{\#}(t, x, y, \overline{\zeta}(\tilde{t}, \tilde{x}, \tilde{y}, \tilde{b}))$. Equation (A27) provides the physical intuition of EPE being defined as the difference between

potential energy at the TWA depth ($\hat{\zeta}$) and ensemble-mean depth ($\overline{\zeta}$). In a similar manner, we can also derive:

$$h'' = -\tilde{b}(\zeta - \hat{\zeta}) = -\tilde{b}\zeta'', \tag{A28}$$

and hence, $\overline{h''} = -\widehat{\mathscr{H}}$. Assuming the background buoyancy frequency can be defined as the inverse of ensemble-mean thickness (viz. $\overline{\sigma}^{-1} \sim N^2$) leads to further manipulation of EPE:

$$\widehat{\mathscr{H}} \sim -b^{\#} N^2 \overline{\zeta'_{\tilde{b}} \zeta'} = -b^{\#} N^2 \Big(\frac{\overline{\zeta'^2}}{2} \Big)_{\tilde{b}} \tag{A29}$$

$$= -N^2 \left[\Big(b^{\#} \frac{\overline{\zeta'^2}}{2} \Big)_{\tilde{b}} - \frac{\overline{\zeta'^2}}{2} \right], \tag{A30}$$

where the last term in equation (A30) further reduces to the available potential energy under quasi-geostrophic approximation ($b' \sim N^2 \zeta'$). The first-term on the RHS of equation (A30) vanishes upon volume integration pending on boundary conditions (i.e. rigid lid and a flat bottom).

Appendix B Kinematics of discretization

As in Figure B1, imagine u_1 and u_2 are on the same buoyancy contour. The relation between the two is:

$$u_2 = u_1 + u_x \Delta x + u_\zeta \Delta \zeta. \tag{B1}$$

Now,

$$u_{\tilde{x}} \overset{\text{def}}{=} u_x + \frac{\Delta \zeta}{\Delta x} \sigma^{-1} u_{\tilde{b}} \tag{B2}$$

$$= u_x + \frac{\Delta \zeta}{\Delta x} u_\zeta \tag{B3}$$

$$= \frac{u_2 - u_1}{\Delta x} \qquad (\because \text{ equation (B1)}), \tag{B4}$$

so once all of the variables are remapped onto the buoyancy coordinate from geopotential, the discretized horizontal gradients can be taken along the original Cartesian grid. The gradients on the model outputs were taken using the `xgcm` Python package (Abernathey et al., 2021; Busecke & Abernathey, 2020). In order to minimize the computational cost, we took the ensemble mean first whenever possible, e.g. $\overline{\sigma} = \overline{\partial_{\tilde{b}} \zeta} = \partial_{\tilde{b}} \overline{\zeta}$, $\tilde{\nabla}_{\mathrm{h}} \overline{\sigma} = \partial_{\tilde{b}} \tilde{\nabla}_{\mathrm{h}} \overline{\zeta}$ etc. The gradient operators commuting with the ensemble mean is also the case for the perturbations, i.e.

$$\tilde{\nabla}_{\mathrm{h}} (\overline{m} + m') = \tilde{\nabla}_{\mathrm{h}} m = \overline{\tilde{\nabla}_{\mathrm{h}} m} + (\tilde{\nabla}_{\mathrm{h}} m)'. \tag{B5}$$

Hence, $\tilde{\nabla}_{\mathrm{h}} m' = (\tilde{\nabla}_{\mathrm{h}} m)'$ (cf. Maddison & Marshall, 2013, Section 2.3 in their paper).

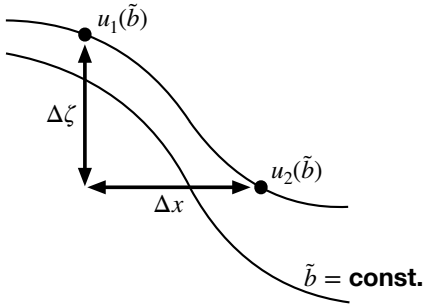

Figure B1. Schematic of discretized gradients.

Appendix C Statistical significance of the eddy signals

In this section, we examine the statistical significance of the terms in the E-P flux convergence. As the terms are all averaged quantities (e.g. $\overline{\sigma}E^{10}_{\tilde{y}} = [\overline{\sigma u'' v''}]_{\tilde{y}}$), based on the Central-Limit Theorem, they should follow a Gaussian distribution. We can have an a-posteriori estimate of the standard deviation of the terms being averaged as (Menke & Menke, 2016):

$$\Sigma^{10}_{\text{post}} = \sqrt{\frac{1}{\mathcal{N}-1}\sum_{i=1}^{\mathcal{N}}\left([\sigma u'' v'']_{\tilde{y}_i} - [\overline{\sigma u'' v''}]_{\tilde{y}}\right)^2}, \tag{C1}$$

where the subscript "post" indicates a-posteriori, and $\mathcal{N}$ the number of ensembles. The 95% confidence interval of the E-P flux convergence terms becomes twice the root-mean square error (RSME):

$$RMSE = \frac{\Sigma_{\text{post}}}{\mathcal{N}-1}, \tag{C2}$$

divided by the mean layer thickness (Figure C1). As the confidence interval is roughly one-third of the amplitudes of E-P flux convergence themselves, based on the Central-Limit Theorem, if we wanted reduce the uncertainty to 10%, we would need ~ 250 ensemble members.

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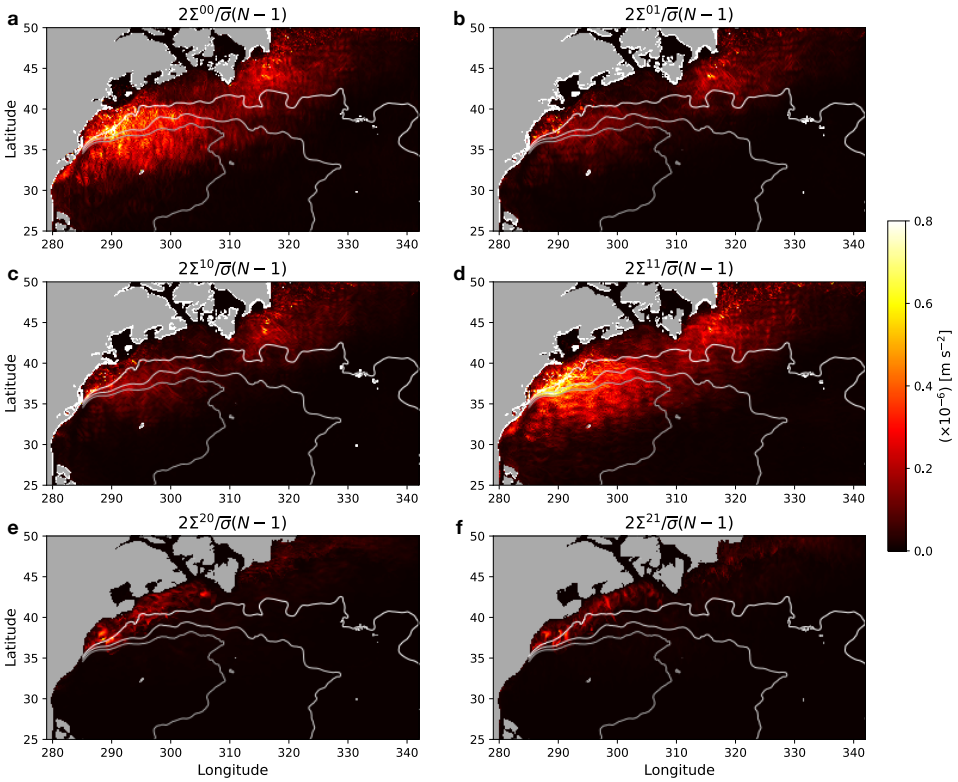

Figure C1. The 95% confidence interval of each term in the E-P flux convergence on January 3, 1967 on $\tilde{b} = -0.26$ m^2 s^{-2}. Σ^{ij} represents the a posteriori standard deviation of each term $\overline{\sigma} E^{ij}_{\tilde{k}}$ where the subscript $\tilde{k}$ denotes the derivatives (equations 17 and 20).

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