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A unified formulation of quasi-geostrophic and shallow water equations via projection

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Key Points:

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8	•	• Introduces QG equations as a projection of RSW equations using the same prognostic		
9		variables.		
10	•	Allows consistent nested numerical methods for both QG and RSW equations.		
11	•	Successfully tested on vortex shear instability, double-gyre circulation, and a simpli-		

• Successfully tested on vortex shear instability, double-gyre circulation, and a simplified North Atlantic configuration.

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13 Abstract

This paper introduces a unified model for layered rotating shallow-water (RSW) and quasi-14 geostrophic (QG) equations, based on the intrinsic relationship between these two sets of 15 equations. We propose a novel formulation of the QG equations as a projection of the 16 RSW equations. This formulation uses the same prognostic variables as RSW, namely 17 velocity and layer thickness, thereby restoring the proximity of these two sets of equations. 18 It provides direct access to the ageostrophic velocities embedded within the geostrophic 19 velocities resolved by the QG equations. This approach facilitates the study of differences 20 between QG and RSW using a consistent numerical discretization. We demonstrate the 21 effectiveness of this formulation through examples including vortex shear instability, double-22 gyre circulation, and a simplified North Atlantic configuration. 23

²⁴ Plain Language Summary

In this paper, we present a straightforward way to connect two important sets of ocean 25 equations: the layered rotating shallow-water (RSW) equations and the quasi-geostrophic 26 (QG) equations. We consider a unified method to formulate the QG equations as a projection 27 of the RSW equations. This method uses the same variables as the RSW equations, making 28 it easier to understand how these two sets of equations relate to each other. Our approach 29 also provides direct access to important velocity information that is usually hidden in the 30 QG equations. This allows us to study the differences between the QG and RSW equations 31 32 using the same numerical techniques. We show the benefits of our model with two examples: a vortex shear instability and a double-gyre configuration. This work provides a useful tool 33 for the understanding of ocean dynamics. Developing a unified numerical framework for 34 nested models can greatly simplify oceanographic modeling and enhance accuracy. 35

³⁶ 1 Introduction

Large-scale ocean models offer a natural trade-off between complexity and realism. On one side, the primitive equations (PE) are sufficiently realistic for climate simulations and real-world data assimilation. However, they are quite complex as they describe the coupling between the equations of motion (mass and momentum) and the conservation of tracers via the equation of state following thermodynamic laws. On the other side, the barotropic planetary geostrophic equations can be efficiently solved with a single prognostic variable (the thickness), yet they ignore thermodynamics and vertical variations.

Between these extremes, there exist approximate models of the PE, such as the multi-44 layer rotating shallow-water (RSW) and the multi-layer quasi-geostrophic (QG) models. The 45 latter can be either derived from the former using an asymptotic approach (Pedlosky, 2013; 46 Vallis, 2017) or considered as a vertical discretization of the continuously stratified QG model 47 derived from the PE. These layered models describe the dynamics of vertically stratified flow 48 in isentropic (or isopycnal) coordinates and only require solving the horizontal momentum 49 and mass equations. For instance, the multi-layer RSW model can fairly reproduce the ocean 50 dynamics in the Gulf Stream region with only five vertical levels (Hurlburt & Hogan, 2000). 51 The multi-layer QG equations are widely adopted for the development of deterministic 52 mesoscale eddy parameterizations (Marshall et al., 2012; Jansen & Held, 2014; Bachman et 53 al., 2017; Uchida et al., 2022) as well as stochastic ones (Berloff, 2005; Grooms et al., 2015; 54 Zanna et al., 2017; Bauer et al., 2020; Li et al., 2023). These two sets of equations can 55 be used as research tools since their numerical integration is light enough to run on laptop 56 computers. 57

Although the multi-layer QG equations are formally derived from the multi-layer RSW equations, their relationship is still not clear from a numerical point of view. Indeed, they are usually written with different prognostic variables. The prognostic variables of the RSW system are the horizontal velocity (**u**, **v**) and the layer thickness **h**, whereas the QG system

is typically formulated with potential vorticity \mathbf{q} as the single prognostic variable, from 62 which one can diagnose the streamfunction ψ and the pressure **p**. This difference breaks 63 the conceptual continuity between these two equation sets in the ocean model hierarchy and 64 brings some undesirable consequences in practice. For instance, many eddy parameteriza-65 tions (e.g., Bachman, 2019; Li et al., 2023) yield different formulations and/or discretizations 66 when applied to the RSW model using the horizontal velocity $(\mathbf{u}, \mathbf{v}, \mathbf{h})$ and layer thickness 67 as the prognostic variables, or to the QG model using potential vorticity \mathbf{q} as the prognostic 68 variable. Moreover, from a practical point of view, it is not straightforward to use the same 69 discrete schemes for these two different models in order to compare them under the same 70 configuration. 71

In this work, we propose to reformulate the multi-layer QG model using horizontal 72 velocity and layer thickness $(\mathbf{u}, \mathbf{v}, \mathbf{h})$ as prognostic variables. This unified reformulation is 73 achieved by expressing the QG equations as a projection of the RSW equations. We also 74 present a numerical algorithm to integrate the QG equations corresponding to the proposed 75 formulation. This projection approach allows for the construction of a QG discretization 76 on top of any RSW discretization. Moreover, this formulation provides direct access to the 77 ageostrophic velocity, which is hidden in the standard QG model formulation but contributes 78 to QG dynamics. 79

Similarly, the QG dynamics can be understood as a projection in the space of normal-80 mode variables, as already proposed by Leith (1980); Salmon (1998); Saujani and Shepherd 81 (2006). This projection reveals that the slow modes correspond to the linearized potential 82 vorticity of the RSW model, while the fast modes are associated with the ageostrophic curl 83 and divergence components. However, this formal analysis relies on Fourier transformation, 84 which assumes periodic solutions and thereby limits numerical development. In our for-85 mulation, the QG equations are considered as a projection of the RSW model in physical 86 space. This approach is independent of the model configuration, such as the shape of the 87 boundary. It provides a consistent framework for developing the corresponding numerical 88 scheme in realistic basins. 89

For the numerical experiments, we adopt the RSW discretization proposed by Roullet 90 and Gaillard (2022), which relies on the vector invariant formulation and an advanced 91 high-order WENO advection scheme. The discretized QG model uses the same dynamical 92 core as the multi-layer RSW model, with the only modification being the addition of the 93 projection operator. We developed a compact, efficient, and CPU/GPU portable Python code using the PyTorch library (Paszke et al., 2019). We first use a simple test case of vortex 95 shear instability to investigate the similarities and differences of the QG and RSW solutions 96 according to different Rossby numbers. We then study the solutions produced by QG and 97 RSW in an idealized wind-driven double-gyre configuration. This final configuration is 98 also implemented in the North Atlantic basin with simplified lateral and vertical boundary 99 conditions. 100

This paper is organized as follows. In Section 2, we briefly recall the derivation of the multi-layer RSW and QG equations. In Section 3, we present our projected QG formulation. In Section 4, we numerically test our formulation on different configurations. We conclude and discuss further perspectives in Section 5.

¹⁰⁵ 2 Multi-layer RSW and QG equations

In this section, we first review the governing equations of the RSW system. We then briefly explain the QG scaling of the RSW equations and present the standard multi-layer QG equations, using potential vorticity **q** as the prognostic variable.

¹⁰⁹ 2.1 Multi-layer RSW equations

The stratification of a multi-layer RSW model consists of a stack of n isopycnal layers, as illustrated in Figure 1 with n = 3 layers. By convention, we index the layers from i = 1for the top layer to i = n for the bottom layer. These layers have a uniform reference thickness H_i and a density ρ_i . As shown in Figure 1, the total thickness of a layer i is the sum of the reference thickness H_i and the thickness anomaly $h_i(x, y)$. The vertical interface displacement $\eta_i(x, y)$ and the hydrostatic pressure $p_i(x, y)$ are given by

$$\eta_i = \sum_{j=i}^n h_j \,, \quad p_i = \rho_1 \sum_{j=1}^i g'_j \eta_j \,. \tag{1}$$

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For i > 1, the reduced gravities are $g'_i = g(\rho_i - \rho_{i-1})/\rho_1$, and for the top layer $g'_1 = g$.

Using the following vector notation

$$\mathbf{H} = (H_1, \ldots, H_n) , \qquad (2a)$$

$$\mathbf{h} = (h_1(x, y), \dots, h_n(x, y)),$$
(2b)

$$\boldsymbol{\eta} = (\eta_1(x,y), \dots, \eta_n(x,y)), \qquad (2c)$$

$$\mathbf{p} = (p_1(x, y), \ldots, p_n(x, y)), \qquad (2d)$$

we can rewrite the linear relations between $\mathbf{h}, \boldsymbol{\eta}$ and \mathbf{p} in a compact form

$$\mathbf{h} = diag(\mathbf{H})A\mathbf{p}, \qquad (3a)$$

$$\eta = C\mathbf{h}, \qquad (3b)$$

$$\mathbf{p} = M\mathbf{h}, \qquad (3c)$$

¹²⁷ with the matrices

$$A = \frac{1}{\rho_1} \begin{bmatrix} \frac{1}{H_1 g'_1} + \frac{1}{H_1 g'_2} & \frac{-1}{H_1 g'_2} & \ddots & \ddots \\ \frac{-1}{H_2 g'_2} & \frac{1}{H_2} \left(\frac{1}{g'_2} + \frac{1}{g'_3} \right) & \frac{-1}{H_2 g'_3} & \ddots \\ \vdots & \ddots & \ddots & \ddots & \ddots \\ \ddots & & \ddots & \frac{-1}{H_n g'_n} & \frac{1}{H_n g'_n} \end{bmatrix},$$
(3d)
$$B = \rho_1 \begin{bmatrix} g'_1 & 0 & 0 & \cdots & 0 \\ g'_1 & g'_2 & 0 & \cdots & 0 \\ \vdots & \ddots & \vdots & \ddots & \vdots \\ g'_1 & g'_2 & g'_3 & \cdots & g'_n \end{bmatrix}, C = \begin{bmatrix} 1 & 1 & \cdots & 1 & 1 \\ 0 & 1 & \cdots & 1 & 1 \\ \vdots & \vdots & \ddots & \vdots \\ 0 & 0 & \cdots & 0 & 1 \end{bmatrix},$$
(3e)

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and
$$M = BC$$
. We then introduce the velocity components (\mathbf{u}, \mathbf{v}) , the kinetic energy \mathbf{k} , and
the relative vorticity $\boldsymbol{\omega}$:

$$\mathbf{u} = (u_1(x, y), \dots, u_n(x, y)),$$
 (4a)

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$$\mathbf{v} = (v_1(x, y), \dots, v_n(x, y)),$$
 (4b)

$$\mathbf{k} = (\mathbf{u}^2 + \mathbf{v}^2)/2, \qquad (4c)$$

$$\boldsymbol{\omega} = \partial_x \mathbf{v} - \partial_y \mathbf{u} \,. \tag{4d}$$

 $_{136}$ With these variables, the multi-layer RSW equations read

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$$\partial_t \mathbf{u} = (\boldsymbol{\omega} + f)\mathbf{v} - \partial_x(\mathbf{p} + \mathbf{k}),$$
 (5a)

$$\partial_t \mathbf{v} = -(\boldsymbol{\omega} + f)\mathbf{u} - \partial_y(\mathbf{p} + \mathbf{k}), \qquad (5b)$$

¹³⁹
$$\partial_t \mathbf{h} = -\mathbf{H}(\partial_x \mathbf{u} + \partial_y \mathbf{v}) - \partial_x(\mathbf{u}\mathbf{h}) - \partial_y(\mathbf{v}\mathbf{h}),$$
 (5c)

where f is the Coriolis parameter. These equations can be formulated in the compact form

$$\partial_t \mathbf{X} = F(\mathbf{X}), \tag{6a}$$

with $\mathbf{X} = (\mathbf{u}, \mathbf{v}, \mathbf{h})^T$, the state variable, and

¹⁴³
$$F\begin{pmatrix}\mathbf{u}\\\mathbf{v}\\\mathbf{h}\end{pmatrix} = \begin{pmatrix}(\partial_x\mathbf{v} - \partial_y\mathbf{u} + f)\mathbf{v} - \partial_x\left(M\mathbf{h} + (\mathbf{u}^2 + \mathbf{v}^2)/2\right)\\ -(\partial_x\mathbf{v} - \partial_y\mathbf{u} + f)\mathbf{u} - \partial_y\left(M\mathbf{h} + (\mathbf{u}^2 + \mathbf{v}^2)/2\right)\\ -\mathbf{H}(\partial_x\mathbf{u} + \partial_y\mathbf{v}) - \partial_x(\mathbf{u}\mathbf{h}) - \partial_y(\mathbf{v}\mathbf{h})\end{pmatrix},$$
(6b)

the RSW model operator.

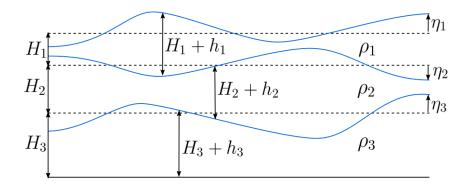


Figure 1. Vertical cross-section of a three-layer RSW model displaying layer thicknesses $H_i + h_i$ and interface heights η_i

¹⁴⁵ 2.2 QG scaling of RSW equations

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The QG model is derived from the RSW model under two scaling assumptions: $Ro \ll 1$ 146 and $Bu \sim 1$ (J. McWilliams, 2006; Zeitlin, 2018), where Ro is the Rossby number and Bu is 147 the Burger number (ratio of the deformation Radius $L_d = \sqrt{gH}/f$ to the scale of motion L). 148 The consistency of the QG scaling necessitates a beta-plane approximation for the Coriolis 149 parameter $f = f_0 + \beta y$, where β is the meridional gradient of the Coriolis parameter. The 150 condition $Ro \ll 1$ implies that the velocity is near the geostrophic balance, specifically that 151 the ageostrophic correction is O(Ro). We define $(\mathbf{u}_{g}, \mathbf{v}_{g})$ as the geostrophic velocity that 152 adheres the geostrophic balance 153

$$-f_0 \mathbf{u}_{\mathbf{g}} = \partial_u \mathbf{p}, \quad f_0 \mathbf{v}_{\mathbf{g}} = \partial_x \mathbf{p},$$
(7a)

and decompose the velocity into the geostrophic and the ageostrophic components $(\mathbf{u}_a, \mathbf{v}_a)$:

$$\mathbf{u} = \mathbf{u}_{g} + \mathbf{u}_{a}, \quad \mathbf{v} = \mathbf{v}_{g} + \mathbf{v}_{a}.$$
 (7b)

¹⁵⁷ The conditions $Bu \sim 1$ and $Ro \ll 1$ imply that $\mathbf{h}/\mathbf{H} \sim O(Ro)$. Following the approach of ¹⁵⁸ Holton (1973); J. McWilliams (2006); Cushman-Roisin and Beckers (2011); Zeitlin (2018), ¹⁵⁹ we do not decompose $\mathbf{p}, \mathbf{h}, \boldsymbol{\eta}$ into a geostrophic and an ageostrophic parts, as this would ¹⁶⁰ require an additional assumption to define the ageostrophic component of the stratification, ¹⁶¹ which is unnecessary for deriving the QG model. Thus, there is a single mass variable and ¹⁶² two velocity components per layer.

¹⁶³ Under these assumptions, the multi-layer QG equations can be expressed in terms of ¹⁶⁴ three equations for the prognostic variables $(\mathbf{u}_{g}, \mathbf{v}_{g}, \mathbf{h})$ with the right-hand side terms that ¹⁶⁵ depend on the ageostrophic velocities $(\mathbf{u}_{a}, \mathbf{v}_{a})$:

$$\partial_t \mathbf{u}_a = (\boldsymbol{\omega}_a + f_0 + \beta y) \mathbf{v}_a + f_0 \mathbf{v}_a - \partial_x (M\mathbf{h} + \mathbf{k}_a), \qquad (8a)$$

$$\partial_t \mathbf{v}_q = -(\boldsymbol{\omega}_q + f_0 + \beta y)\mathbf{u}_q - f_0\mathbf{u}_a - \partial_y(M\mathbf{h} + \mathbf{k}_q), \qquad (8b)$$

$$\partial_t \mathbf{h} = -\mathbf{H}(\partial_x \mathbf{u}_q + \partial_y \mathbf{v}_q) - \partial_x(\mathbf{u}_q \mathbf{h}) - \partial_y(\mathbf{v}_q \mathbf{h}) - \mathbf{H}(\partial_x \mathbf{u}_a + \partial_y \mathbf{v}_a).$$
(8c)

¹⁶⁹ Note that using the geostrophic balance (7a), one can simplify these equations to

$$\partial_t \mathbf{u}_g = (\boldsymbol{\omega}_g + \beta y) \mathbf{v}_g + f_0 \mathbf{v}_a - \partial_x \mathbf{k}_g, \qquad (9a)$$

$$\partial_t \mathbf{v}_g = -(\boldsymbol{\omega}_g + \beta y)\mathbf{u}_g - f_0\mathbf{u}_a - \partial_y\mathbf{k}_g, \qquad (9b)$$

$$\partial_t \mathbf{h} = -\partial_x(\mathbf{u}_q \mathbf{h}) - \partial_y(\mathbf{v}_q \mathbf{h}) - \mathbf{H}(\partial_x \mathbf{u}_a + \partial_y \mathbf{v}_a). \tag{9c}$$

In this form, the QG equations still appear similar to the RSW equations, but this is misleading as there is only one degree of freedom per layer. The two components of the geostrophic velocity are constrained by **h** via (7a) and (3a). Another difficulty with this system is that, although well-posed, it is highly implicit. There is no straightforward method to determine the ageostrophic velocity. In practice, and particularly for numerical models, the equations are rewritten in a more explicit form. This form reveals a hidden variable of the system that is the potential vorticity (PV):

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$\mathbf{q} = eta \, y + oldsymbol{\omega}_g - f_0 rac{\mathbf{h}}{\mathbf{H}} \, .$

(10)

2.3 Multi-layer QG equations

The multi-layer QG equations are obtained upon by differentiating (10) with respect to time and utilizing (9). The resulting equations are

$$\partial_t \mathbf{q} = -\partial_x (\mathbf{u}_{\mathbf{g}} \mathbf{q}) - \partial_y (\mathbf{v}_{\mathbf{g}} \mathbf{q}), \qquad (11a)$$

$$\Delta \mathbf{p} - f_0^2 A \mathbf{p} = f_0 \mathbf{q} - f_0 \beta y, \qquad (11b)$$

$$-f_0 \mathbf{u}_{\mathbf{g}} = \partial_y \mathbf{p}, \quad f_0 \mathbf{v}_{\mathbf{g}} = \partial_x \mathbf{p}, \tag{11c}$$

where $\Delta = \partial_{xx}^2 + \partial_{yy}^2$ denotes the horizontal Laplacian operator, and A represents the vertical discretization of the stretching operator introduced in Equation (3d). The PV **q** is the sole prognostic variable in (11a). All other model variables are derived from **q** via the diagnostic relations (11b) for **p** and (11c) for **u** and **v**. The QG model is thus expressed in terms of the variables (**q**, **p**), with **p**/f_0 being the vector of streamfunction for each layer.

Numerical implementations of the QG model typically rely on this system of equations. 192 However, this system differs significantly from the RSW system of equations. One notable 193 aspect is the absence of the ageostrophic velocities from the RSW system of equations. This 194 absence does not imply that \mathbf{u}_{a} and \mathbf{v}_{a} vanish; rather, it means they can be disregarded if 195 the focus is solely on the evolution of \mathbf{p} and \mathbf{q} . The substantial difference between the QG 196 and RSW model equations complicates direct comparisons between them. Consequently, 197 numerical versions of the QG and RSW models generally have distinct implementations, 198 with differing numerical methods in all aspects. In the following sections, we demonstrate 199 how to reestablish the similarity between the two models. 200

3 Quasi-geostrophic model as projected rotating shallow-water

In this section, we propose a straightforward formulation of the QG equation using the horizontal velocity and layer thickness $(\mathbf{u}, \mathbf{v}, \mathbf{h})$ as state variables, along with the non-linear RSW operator F defined in (6b), and a linear projection operator P. To our knowledge, this projection relation has been largely overlooked, with one notable exception being Charve (2004).

3.1 Projection formulation

To derive this projection, we start from the QG equations (8), and isolate the part controlled by F:

$$\partial_t \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix} = F \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix} + \begin{pmatrix} f_0 \mathbf{v}_a \\ -f_0 \mathbf{u}_a \\ -\mathbf{H}(\partial_x \mathbf{u}_a + \partial_y \mathbf{v}_a) \end{pmatrix}, \tag{12}$$

where several terms cancel due to the geostrophic balance. In this form, the QG model can be interpreted as a RSW model applied to the geostrophic component and forced by an ageostrophic source term, represented by the second term of the right-hand side.

Let us now introduce the PV linear operator Q:

$$Q\begin{pmatrix}\mathbf{u}\\\mathbf{v}\\\mathbf{h}\end{pmatrix} = \partial_x \mathbf{v} - \partial_y \mathbf{u} - f_0 \frac{\mathbf{h}}{\mathbf{H}}.$$
 (13a)

²¹⁶ This operator relates to the PV by

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$$Q\begin{pmatrix}\mathbf{u}_g\\\mathbf{v}_g\\\mathbf{h}\end{pmatrix} = \mathbf{q} - \beta y\,,\tag{13b}$$

and ensures that the contribution of the ageostrophic source term in (12) vanishes:

²¹⁹
$$Q\begin{pmatrix} f_0 \mathbf{v}_a \\ -f_0 \mathbf{u}_a \\ -\mathbf{H}(\partial_x \mathbf{u}_a + \partial_y \mathbf{v}_a) \end{pmatrix} = 0.$$
(13c)

 $_{220}$ Since Q is independent of time, it commutes with the time derivative. Therefore,

$$\partial_t Q \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix} = Q \circ F \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix}.$$
(14)

This equation is a reformulation of (11a), representing the conservation of PV. As Q reduces the state vector from three to one variable, we need a reverse operation to retrieve the three variables ($\mathbf{u}_q, \mathbf{v}_q, \mathbf{h}$). This is accomplished by introducing the geostrophic operator G:

$$\begin{pmatrix} -\partial_y \mathbf{p} \end{pmatrix}$$

$$G\left(\mathbf{p}\right) = \begin{pmatrix} \partial_{x}\mathbf{p} \\ \partial_{x}\mathbf{p} \\ f_{0}\mathbf{H}A\mathbf{p} \end{pmatrix}.$$
 (15a)

Thus, G is a linear operator with uniform and time-independent coefficients. The composition of the two operators Q and G yields:

$$(Q \circ G)(\mathbf{p}) = \Delta \mathbf{p} - f_0^2 A \mathbf{p} \tag{15b}$$

which is the QG elliptic operator (11b) relating **p** to **q**. This operator is invertible (Dutton, 1974; Bourgeois & Beale, 1994), hence $(Q \circ G)^{-1}$ is well-defined.

 $_{231}$ Finally, we introduce the QG projection operator P:

$$P = G \circ (Q \circ G)^{-1} \circ Q.$$
⁽¹⁶⁾

²³³ P is a projection because $P \circ P = P$, as demonstrated by

$$P \circ P = G \circ (Q \circ G)^{-1} \circ (Q \circ G) \circ (Q \circ G)^{-1} \circ Q = P.$$
⁽¹⁷⁾

By construction, P preserves the geostrophic state $\mathbf{X}_g = (\mathbf{u}_g, \mathbf{v}_g, \mathbf{h})^T$, *i.e.*, $P(\mathbf{X}_g) = \mathbf{X}_g$. Indeed, since \mathbf{X}_g is geostrophic, we have

 $Q(\mathbf{X}_q) = \mathbf{q} - \beta y, \qquad (18)$

$$(Q \circ G)^{-1}(\mathbf{q} - \beta y) = \mathbf{p}/f_0, \qquad (19)$$

 $G(\mathbf{p}/f_0) = \mathbf{X}_g.$

Applying P to Equation (12), and noting that P commutes with ∂_t , we can formulate the multi-layer QG model as

$$\partial_t \mathbf{X}_g = P \circ F(\mathbf{X}_g) \ . \tag{21}$$

This form differs from the RSW model (6a) by the additional projection operator P acting on F. By projecting the RSW tendency onto the geostrophic manifold, P ensures that the QG state remains in geostrophic balance. Alternatively, the QG model can be viewed as evolving under the action of the RSW operator with the ageostrophic tendency removed.

To fully implement the projection method, it is necessary to specify the lateral boundary 247 condition for Equation (15b). The appropriate condition, consistent with the QG model, is 248 the Dirichlet boundary condition, where the pressure remains constant along each connected 249 boundary. Given that the projection is applied to the model tendency rather than the model 250 251 state, and that this work focuses on simply connected domains, the constant term is zero. In cases involving multiply connected domains, the constant can be explicitly evaluated as 252 proposed by J. C. McWilliams (1977); however, this is beyond the scope of the present 253 paper. 254

3.2 Diagnostic variables

With this formulation, the ageostrophic velocity $(\mathbf{u}_a, \mathbf{v}_a)$ can be expressed in a simple closed form. Using equations (12) and (21), we have

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$$\begin{pmatrix} f_0 \mathbf{v}_a \\ -f_0 \mathbf{u}_a \\ -\mathbf{H}(\partial_x \mathbf{u}_a + \partial_y \mathbf{v}_a) \end{pmatrix} = P \circ F \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix} - F \begin{pmatrix} \mathbf{u}_g \\ \mathbf{v}_g \\ \mathbf{h} \end{pmatrix} .$$
(22)

In a numerical model, this requires only a basic difference between the QG and RSW tendencies, with no costly computations.

Using this projection formulation, the QG system can be expressed with the same 261 prognostic variables as the RSW system, namely the horizontal velocity (\mathbf{u}, \mathbf{v}) and the 262 layer thickness **h**. This reestablishes the proximity between these two sets of equations 263 in the ocean model hierarchy, leading to four practical implications. First, given a RSW 264 discretization, one can implement the projection to derive the companion QG model for this 265 specific discretization. Second, this formulation provides access to the ageostrophic velocity 266 hidden in the QG equations at the cost of a simple subtraction. This enables an a posteriori 267 diagnostic of the validity of the QG scaling. For a given geostrophic state $(\mathbf{u}_q, \mathbf{v}_q, \mathbf{h})$, the 268 corresponding ageostrophic velocity $(\mathbf{u}_a, \mathbf{v}_a)$ can be computed and checked against: 269

$$\frac{\mathbf{k}_a}{\mathbf{k}_g} \sim Ro^2 \,, \qquad \frac{\mathbf{h}}{\mathbf{H}} \sim Ro \,\,, \tag{23}$$

where $\mathbf{k}_a = (|\mathbf{u}_a|^2 + |\mathbf{v}_a|^2)/2$ and $\mathbf{k}_g = (|\mathbf{u}_g|^2 + |\mathbf{v}_g|^2)/2$ are the ageostrophic and the geostrophic kinetic energies, respectively.

Third, using the same variables $(\mathbf{u}, \mathbf{v}, \mathbf{h})$ facilitates the development of eddy parameterizations, such as those in Bachman (2019); Li et al. (2023), which work similarly for both the RSW and the QG models. Finally, this formulation may offer new insights and approaches for the mathematical analysis of the QG equations, particularly regarding the extension of recent results on the well-posedness properties for a stochastic RSW model (Crisan & Lang, 2023) by examining the effect of the QG projector on these properties.

This formulation also presents an interesting analogy with the Leray projector formula-279 tion of the Navier-Stokes equations, where the Leray projector enforces the incompressible 280 constraint by filtering out compressible sound waves through an elliptic Poisson equation for 281 the pressure. Similarly, the proposed QG projector enforces the QG balance by filtering out 282 fast gravity waves through an elliptic Helmholtz equation for the PV. It is noteworthy that 283 the QG balance is not a constraint added to the RSW model; the Hamiltonian structure of 284 the QG model (Holm & Zeitlin, 1998) is distinct from that of the RSW model. Specifically, 285 contrary to the pressure, the PV is not a Lagrange multiplier enforcing a constraint. 286

²⁸⁷ 4 Numerical experiments

This section presents the numerical experiments carried out to validate and explore the behavior of our new formulation. We first describe the implementation of the RSW solver and QG projector, then detail the specific experiments designed to test vortex shear instability, the idealized double-gyre circulation, and a simplified North Atlantic configuration. The first two experiments are analyzed to compare the solutions obtained from the QG and RSW models under varying conditions and parameters.

4.1 Numerical implementations

To implement our formulation, we require a RSW solver and a QG projector. We 295 utilize the RSW solver developed by Roullet and Gaillard (2022), which is available at 296 https://github.com/pvthinker/pyRSW. We re-implemented this solver in PyTorch to 297 enable seamless GPU acceleration, verifying that our implementation reproduces their orig-298 inal results up to numerical precision. The key element of the discretization is a fifth-order 200 Weighted Essentially Non-Oscillatory (WENO) upwinded reconstruction for both the mass 300 flux and the nonlinear vortex-force term. This approach provides sufficient numerical dis-301 sipation, eliminating the need for an ad-hoc hyperviscous diffusion, while ensuring good 302 material conservation of PV (Roullet & Gaillard, 2022). 303

The QG projector requires an elliptic solver. Thiry et al. (2024) released an efficient 304 Python-PyTorch implementation of the QG equations. They solve the QG elliptic equation 305 using discrete sine transforms implemented with PyTorch's Fast Fourier Transform (FFT), 306 which leverages highly optimized MKL FFT on Intel CPUs and cuFFT on Nvidia GPUs. 307 We employ their elliptic solver to solve the QG elliptic equation (11b). Once the projector 308 is available, the QG solver is implemented by simply adding the projection step to the RSW 309 solver. Numerically, the two solvers differ by only one line of code – the projection step. All 310 other elements, including variable staggering, time discretization, and core RSW equations, 311 are identical. 312

To summarize, the QG model is advanced in time as follows: (1) compute the RSW tendencies, (2) apply the projection operator P to obtain the QG tendencies, and (3) update the state variables. For the RSW model, step (2) is omitted, and only steps (1) and (3) are performed.

Consequently, we achieve a PyTorch implementation (see Supporting Information files) that is concise (approximately 800 lines of code), remains true to the equations, and implements both the multi-layer QG and RSW equations using the same state variables (**u**, **v**, **h**).

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4.2 Vortex shear instability

To validate our formulation, we first study a vortex shear instability and compare its 321 evolution in both the QG and the RSW models as Ro increases for Bu = 1. The initial state 322 is a perfectly shielded vortex with a core of uniform vorticity ω_1 surrounded by a ring of 323 opposite sign uniform vorticity ω_2 . The system involves two lengths: the core radius r_0 and 324 the vortex outer radius r_1 . The ratio ω_2/ω_1 is such that the total circulation vanishes. This 325 system is unstable and leads to the formation of multipoles (Morel & Carton, 1994). The 326 number of poles depends on the ratio of the vortex radius to the core radius. We focus here 327 on a tripole formation case with $r_1/r_0 = 1.4$. To promote the growth of the most unstable 328 mode, we add a small mode azimuthal perturbation. 329

The experiments are set up in dimensional form with a square domain of size $L_x \times L_y =$ 100 km × 100 km on a f-plane. There is a single layer of fluid with thickness H = 1 km. We assume no-flow and free-slip boundary conditions. The acceleration of gravity is set to $g = 10 \text{ m s}^{-2}$. The vortex core has a radius $r_0 = 10$ km and a positive vorticity; the vortex radius is $r_1 = 14$ km. We run the simulations on a 512×512 grid, providing a 200m spatial

resolution. The Coriolis parameter is chosen such that Bu = 1, *i.e.*, $f_0 = \sqrt{gH}/r_0$. The 335 vorticity ω_1 is set indirectly via u_{\max} , the maximum velocity of the initial condition. We 336 define the Rossby number as $Ro = u_{\text{max}}/(f_0 r_0)$. We impose Ro and deduce u_{max} . We have 337 tested four cases: $Ro \in \{0.01, 0.05, 0.1, 0.5\}$. In all cases, we apply the QG projector to 338 the initial state before starting the time integration. Consequently, the initial states are 339 in geostrophic balance and differ only by a scaling factor. As Ro increases, the instability 340 develops faster in dimensional time. Therefore, we present the results in the rescaled eddy-341 turnover time τ , defined as the inverse of the ℓ^2 -norm of the initial vorticity, *i.e.*, $\tau = 1/||\omega||$. 342 We integrate the simulations for $T = 10 \tau$. 343

Figure 2 shows the evolution of the initial state for the two extreme cases, Ro = 0.01 and 344 Ro = 0.5. In the Ro = 0.01 case, the differences between the QG and the RSW solutions are 345 not perceptible to the naked eye. This is consistent with the QG scaling and the fact that the 346 QG model is an asymptotic limit of the RSW model. In the Ro = 0.5 case, the differences 347 are of order one. In the RSW model, the vortex spins faster, and the filaments of negative 348 vorticity are stabilized. The smoothness of the RSW solution at $t = 10 \tau$ might be surprising 349 as we expect some gravity waves generated during the fast cyclo-geostrophic adjustment of 350 the initial state. These gravity waves are present but at $t = 10\tau$, they have bounced back 351 and forth several times along the boundary and are strongly scattered. Interestingly, the 352 QG solution is exactly the same as in the Ro = 0.01 case. This is expected since the QG 353 equations are scaling invariant, *i.e.*, the evolution is invariant under multiplication by a 354 constant. However, it is also quite remarkable to recover this property in the numerical 355 solutions because the QG solver relies on the full RSW right-hand side. Another symmetry 356 of the QG model is parity invariance. The solution should be invariant under a sign change 357 of the vorticity. In other words, cyclones and anticyclones follow the same evolution, up to 358 a change in rotation. This is not at all the case for the RSW model. By flipping the sign 359 of the initial vorticity, we verified that the solutions satisfy this property (not shown). This 360 means that the QG projector behaves well as it restores two invariances, scaling and parity, 361 that are absent in the RSW solver. 362

To assess the influence of Ro on the time evolution, we define the normalized difference 363 $\delta = 2||\omega_{\rm qg} - \omega_{\rm sw}||/(||\omega_{\rm qg}|| + ||\omega_{\rm sw}||)$. Figure 3 shows $\delta(t)$ for the four Ro cases. The 364 oscillations during the $[0, 4\tau]$ period are due to the gravity waves in the RSW case resulting 365 from the imperfect initial balance. Interestingly, the shortening of the oscillation period as 366 Ro decreases is due to the time rescaling by τ . In dimensional time, the periods are the 367 same. A practical consequence is that the RSW experiment requires more time steps to 368 reach $t = 10 \tau$ as Ro decreases, whereas for the QG experiment, the number of time steps 369 is constant. After $t = 4\tau$, the differences are dominated by the shear instability developing 370 on the vortex. The small difference seen in the snapshots in the Ro = 0.01 case has actually 371 reached a plateau, meaning the QG solution closely follows the RSW one. This confirms 372 that the QG model is a good simplified model when the scaling assumption holds. On a 373 longer time scale and with chaotic vortex dynamics, the solutions would diverge, but in 374 such a simple setup, the solutions remain close. The time evolution of δ is similar for all 375 Ro except Ro = 0.5, where δ saturates at one, the maximum value of this metric. In 376 this case, this metric suggests that the two models predict a completely different solution. 377 Looking back at the snapshots, this seems exaggerated. The order one difference is mostly 378 due to the difference in timing, not the difference in pattern. Depending on the purpose, 379 the QG solution might still be of interest as it still captures the main phenomenology. Note 380 that the QG solution could be made closer to the RSW solution if the two models were 381 started with different initial states: a cyclo-geostrophic balance for the RSW model and 382 the associated projected state for the QG model. The initial state would thus depend on 383 Ro. For this illustrative experiment, we preferred to stick to the same initial state, up to a 384 scaling constant. 385

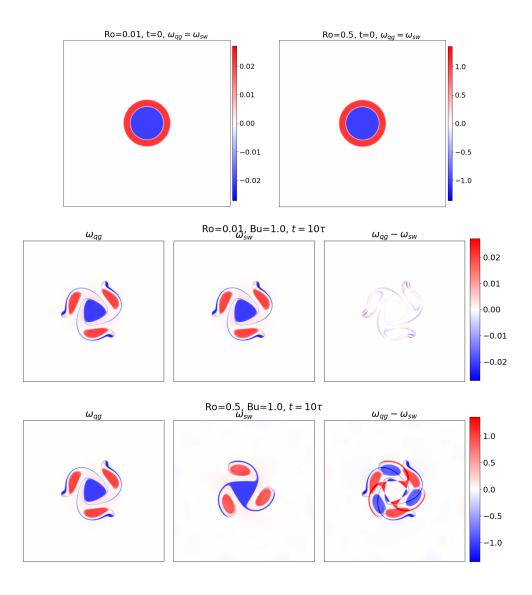


Figure 2. Vortex shear instability solved using QG and SW for Bu = 1. (Top to bottom) Initial relative vorticity for Ro = 0.01 and Ro = 0.5. Final relative vorticities and their differences for QG and SW models with Ro = 0.01. Final relative vorticities and their differences for QG and SW models with Ro = 0.5. Units are in s^{-1} .

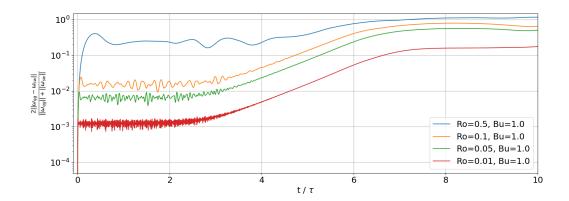


Figure 3. Time evolution of the normalized differences of relative vorticity between the QG model and the RSW model with Bu = 1 and different Ro.

Parameter	Value	Description
L_x, L_y	5120, 5120 km	Domain size
H_k	400, 1100, 2600 m	Mean layer thickness
g'_k	$9.81, 0.025, 0.0125 \text{ m s}^{-2}$	Reduced gravity
γ	$3.6 \ 10^{-8} \ \mathrm{s}^{-1}$	Bottom drag coefficient
$ au_0$	$0.08 \ {\rm N} \ {\rm m}^{-2}$	Wind stress magnitude
ho	$1000 {\rm ~kg} {\rm ~m}^{-3}$	Ocean density
f_0	$9.375 \ 10^{-5} \ \mathrm{s}^{-1}$	Mean Coriolis parameter
β	$1.754 \ 10^{-11} \ (m \ s)^{-1}$	Coriolis parameter gradient
L_d	$41,25 \mathrm{~km}$	Baroclinic Rossby radii
n_x, n_y	256, 256	Grid size
dt $$	4000 s	Time-step

Table 1. Parameters of the idealized double-gyre configuration. There no viscosity nor diffusion coefficient as the grid-scale dissipation is implicitely handled by the upwinded WENO reconstruction of the masse flux and the vortex-force (see Roullet & Gaillard, 2022).

386 4.3 Double-gyre circulation

To explore a richer phenomenology, we have tested our new formulation on a classical oceanic test case, the idealized wind-forced double-gyre circulation. The domain is a nonperiodic square ocean basin with N = 3 layers. We assume free-slip boundary conditions on each boundary. A stationary and symmetric wind stress (τ_x, τ_y) is applied in the top layer, with $\tau_x = -(\tau_0/\rho_0) \cos(2\pi y/L_y)$ and $\tau_y = 0$. Additionally, a linear drag with drag coefficient γ is applied in the bottom layer. The parameter values are given in Table 1.

We study this configuration in an eddy-permitting resolution of 20 km, meaning that the spatial resolution (20 km) is half of the largest baroclinic Rossby radius (41 km). We expect QG and RSW simulations to produce strong western boundary currents converging to the middle of the western boundary and an eastward jet departing from the middle of the western boundary. Starting from the rest state, this configuration requires about 100 years to spin up and achieve converged statistics (Hogg et al., 2005; Simonnet, 2005).

In Figure 4, we present snapshots of key quantities of the upper layer after 100 years of integration. The solution exhibits expected properties of this setup: a double-gyre circulation (Fig. 4e) separated by a meandering eastward jet (Fig. 4a,d) emanating from the western boundary, two strong and narrow western boundary currents (Fig. 4b) feeding the eastward jet, mesoscale turbulence throughout, especially near the jet (Fig. 4c,d), and Rossby waves propagation (Fig. 4e,f). The local Rossby number, defined as ω/f_0 peaks at 0.2, which is significant but not large enough to dismiss the solution. Interestingly, the layer thickness perturbation h_1 is substantial compared to the reference depth $H_1 = 400$ m.

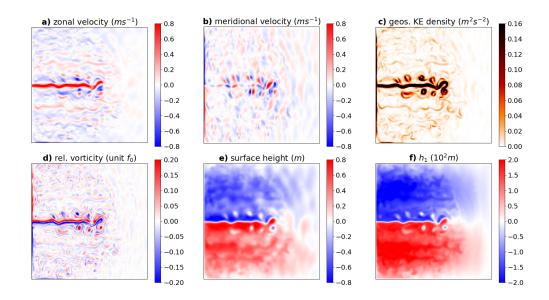
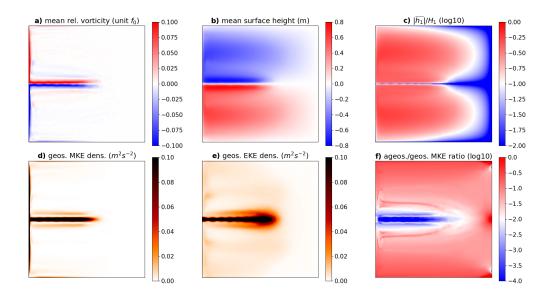


Figure 4. QG upper-layer snapshot after 100 years of spin-up from the rest state. KE, geos., and rel. stand for kinetic energy, geostrophic, and relative, respectively.

To complement this snapshot, we present statistics estimated over the years (100-200)407 after the initial state, using one snapshot every 10 days. We decompose the geostrophic 408 kinetic energy into its mean and eddy components, and compute the ratio k_a/k_a . The 409 results are shown in Figure 5 for the upper layer. The statistics confirm the presence of the 410 strong western boundary currents (Fig. 5a) and a strong eastward jet reaching the middle of 411 the domain (Fig. 5a,d). A remarkable feature is the symmetry of all quantities with respect 412 to the central latitude, due to the symmetry of the forcing and the cyclone/anticyclone 413 symmetry of the QG model. This symmetry prevents the model from breaking the symmetry 414 of the forcing. From the ratio k_a/k_g and h/H (Fig. 5c,f), we test the validity of the QG 415 scaling assumptions (Eq. 23). The color scale is adjusted so that the white intermediate 416 color corresponds to Ro = 0.1. Red areas indicate where the QG scaling assumptions are not 417 respected. Counter-intuitively, the central jet region, where kinetic energy is the highest, 418 shows the best QG scaling. The worst regions are the gyre centers due to large thickness 419 deviations and the boundaries due to large ageostrophic velocities. 420

Finally, we compare the QG solution with its companion RSW one. Due to the 421 free surface and the presence of fast barotropic gravity waves, the RSW solver requires 422 a much smaller time step, typically 200 times smaller. This factor corresponds to the ratio 423 $\sqrt{gH}/\max(u)$. Integrating from the rest state over 200 years would be computationally 424 intensive. A compromise would be to use a barotropic-baroclinic time splitting (Higdon & 425 De Szoeke, 1997) or implicit stepping of the free surface (Roullet & Madec, 2000), but this 426 is beyond the scope of the present study. Instead, we ran the RSW solver starting from year 427 200 of the QG solution and integrate it over 2 years. Figure 6 compares QG and RSW on 428 a snapshot of vorticity in the upper layer. The central jet has a southward component, the 429 two gyres are no longer symmetric, and mesoscale turbulence has intensified in the Northern 430 gyre and weakened in the Southern gyre. Applying the QG projector on the RSW state 431 results in a state that remains very close (Fig. 6c) yet with damped fluctuations. The QG 432



QG upper-layer statistics over 100 years after 100 years spin-up from rest state. Figure 5.

projector tends to dampen the short scales, but since it is applied on the RSW model ten-433 dency, it does not affect the QG state, as seen from the comparison between Fig. 6a and 434 435 Fig. 6b. The closeness suggests that while the QG solution might be locally tangent to the 436

RSW solution, long-term integration results in noticeable differences.

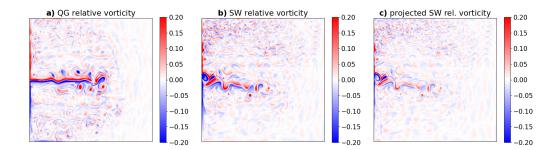


Figure 6. (Left) QG upper-layer relative vorticity after 100 years of spin-up, (middle) RSW upper-layer relative vorticity, and (right) projected RSW vorticity after 2 additional years of spinup. Units are in f_0 .

4.4 Simplified North Atlantic configuration

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To demonstrate the applicability of the proposed projection formulation to more com-438 plex ocean configurations, we extend the previous idealized double-gyre circulation to the 439 North Atlantic basin, located at 9°N–48°N and 98°W–4°W. The ocean boundaries are set 440 at a depth of 250 meters to exclude the continental shelf from the simulation. In this study, 441 we simplify the realistic North Atlantic configuration by not considering inflows and out-442 flows across the northern and southern open boundaries (Marchesiello et al., 2001; Blayo & 443 Debreu, 2005), which will be investigated in subsequent studies. Here, we assume a flat bot-444 tom to be consistent with the formulation presented in the previous sections. However, the 445 presented formulation could be extended to include bottom topography in the future. The 446

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The simulation runs on a horizontal grid of 1024×512 points, corresponding to a spatial 450 resolution of 8.5 km ($\sim 1/11^{\circ}$), with 3 vertical layers using the same reference thickness and 451 reduced gravity as specified in Table 1. The time step is set to 2000 s, and a partial free-slip 452 condition is applied on the ocean boundaries with the coefficient set to 0.6 (0 for no-slip 453 and 1 for free-slip). To solve the elliptic equation on non-rectangular geometries for the QG 454 455 projector, we extend the fast discrete sine transform spectral solver using the capacitance matrix method (Thiry et al. (2024), see also Blayo and LeProvost (1992) for the original 456 technique). 457

Figure 7 illustrates the instantaneous prognostic and diagnostic variables of the pro-458 jected QG model after 40 years of spin-up simulation. The surface relative vorticity in 459 Fig. 7a reveals the meandering and energitic western boundary current, along with the tur-460 bulent eddying structures throughout most of the basin. The sea surface height in Fig. 7b 461 illustrates the gyre circulation structure in this configuration and could potentially be as-462 similated with available observations. Fig. 7c and Fig. 7d demonstrate the surface current 463 speed $(\sqrt{u_1^2 + v_1^2})$ for the prognostic geostrophic motions and the diagnostic ageostrophic 464 motions, respectively. The latter is at least five times smaller than the former across the 465 entire basin. This instantaneous snapshot notably shows that the ageostrophic velocity 466 component is extremely small in the region going from 25°N to 30°N, which approximately 467 corresponds to the range of latitudes for the state of Florida. However, the ageostrophic 468 motions remain significant along the Gulf Stream current. 469

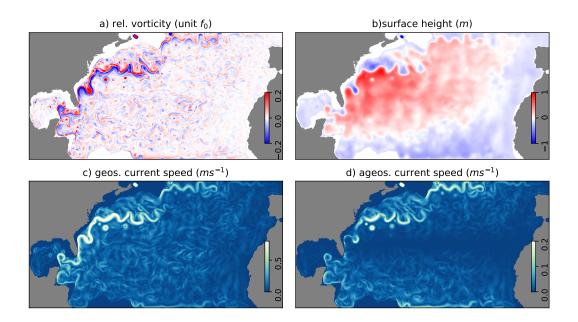


Figure 7. QG upper-layer snapshot after 40 years of spin-up from the rest state.

We also investigate the temporal statistics of the projected QG model over 20 years following a 40-year spin-up. For instance, Figure 8 illustrates the surface MKE and EKE densities for both geostrophic and ageostrophic motions. Figures 8a and 8b reveal that EKE predominates over MKE across the basin, particularly along the Gulf Stream, highlighting the significant influence of mesoscale eddies on flow variability. Figures 8c and 8d show the ratio of ageostrophic to geostrophic MKE and EKE, confirming the previous instantaneous

- 476 finding: geostrophic balance is markedly dominant in the North Atlantic Subtropical Gyre,
- validating the QG scaling in that region.

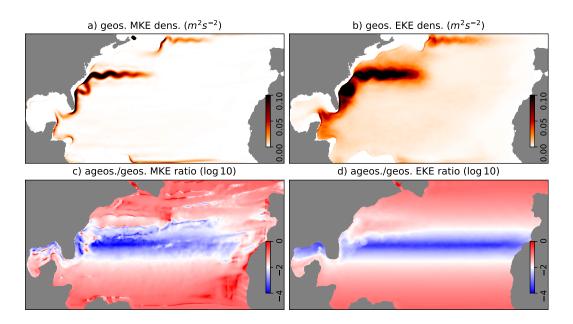


Figure 8. QG upper-layer statistics over 20 years after 40 years spin-up from rest state.

478 5 Conclusions

In this paper, we have demonstrated that the QG model can be formulated as a pro-479 jected RSW model by applying the QG projector P (defined in Equation 16) to the RSW 480 tendency. This formulation allows the QG model to utilize the same variables $(\mathbf{u}, \mathbf{v}, \mathbf{h})$ as 481 the RSW model, rather than the more conventional (\mathbf{p}, \mathbf{q}) variables. This unified approach 482 enables us to enhance the similarities and differences between the two models and facilitates 483 a coherent integration of both models within the same numerical framework. In contrast to 484 earlier approaches based on similar concepts (Leith, 1980; Salmon, 1998; Saujani & Shep-485 herd, 2006), the projection formulation we propose here does not depend on the shape of the 486 boundary. As demonstrated, it can be easily implemented for basins with general coastal 487 geometries. 488

We have validated this approach through a vortex shear instability test, demonstrating 489 that the resulting QG model retains essential symmetry properties, such as scaling and 490 parity, which are not present in the RSW model. Furthermore, we have shown that a QG 491 model implemented in this manner reproduces the expected characteristics of a double-gyre 492 experiment. An immediate benefit of this approach is the ability to directly compare RSW 493 and QG solutions. This straightforward formulation paves the way for further investigations 494 into the differences between QG and RSW equations, such as studies on the stability of 495 geostrophic equilibrium or spontaneous imbalance phenomena. 496

Additionally, it holds significant potential for data assimilation applications, enabling seamless switching between these nested RSW and QG models or even their combination. For instance, one could initially run a data assimilation algorithm, such as an ensemble Kalman filter (Evensen, 2003), using the projected QG model to capture geostrophic dynamics. Subsequently, the obtained solution could be refined by transitioning to the RSW model. This flexibility could enhance the accuracy and efficiency of data assimilation processes in oceanographic modeling and related fields.

⁵⁰⁴ Open Research Section

The code files necessary to reproduce the results presented in this paper are publicly available in Thiry and Li (2024).

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