# **Bathymetry-aware mesoscale eddy parameterizations**

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Eddies export nutrients off the Eastern Boundary Upwelling System, thus limiting marine productivity (Gruber et al. 2011).



 $75^\circ$  S

 $\theta$  (°C)

Eddies drive heat fluxes toward the ice shelves of Antarctica, shaping the abyssal MOC (Thompson et al. 2018).





### Retrograde versus Prograde



#### Retrograde or upwelling example and the example of the Prograde or downwelling

Wang and Stewart (2020); Wei, Wang, and Mak (2024)

### Retrograde versus Prograde



### Eddy and mean properties: Prograde



Prograde or downwelling

Wei, Wang, Mak, and Stewart (2022); Wei, Wang, and Mak (2024)

$$
K_{\text{GEOM}} = \alpha \frac{\sqrt{Ri}}{f_0} E,
$$

The "GEOMETRIC" theory (e.g. Marshall et al. 2012; Mak et al. 2022)



$$
K_{\text{GEOM}} = \alpha \frac{\sqrt{Ri}}{f_0} E, \qquad \text{The "GEOMETRIC" theory} \text{ (e.g. Marshall et al. 2012; Mak et al. 2022)}
$$
\n
$$
\frac{f_0^2}{Ri} \cdot K_{\text{GEOM}} = \alpha \cdot \boxed{\sigma_E} \cdot E \equiv \boxed{2\sigma} \cdot E,
$$
\n
$$
\text{normalized Eady growth rate: } \sigma_E = f_0 / \sqrt{Ri}
$$
\n
$$
\sigma / [0.31 \cdot \sigma_E] \sim \mathcal{F}_{\text{GEOM}}(S)
$$
\n
$$
S = \left\langle \left| \frac{\partial H}{\partial y} \right| \frac{1}{|H|} \int_{-|H|}^0 \frac{N}{f_0} dz \right\rangle \xrightarrow{\text{The slope Burger number dependence} \text{ (e.g. Brink, 2012; 2016; Brink and Cherian, 2017; Chen et al, 2020).}}
$$









Wei, Wang, and Mak (2024)



Wei, Wang, and Mak (2024)





Wei, Wang, and Mak (2024)



Wei, Wang, and Mak (2024)





Wei, Wang, and Mak (2024)



Wang and Stewart (2018; 2020)



**Dynamic ocean topography (cm)** 

Timmermans and Toole (2019)

Manucharyan and Isachsen (2019)



**Dynamic ocean topography (cm)** 

Timmermans and Toole (2019)

Manucharyan and Isachsen (2019)









$$
\frac{\partial}{\partial t}\overline{u} \simeq \text{Forcing} + f_0 \frac{\partial}{\partial z} \left( \frac{\overline{v'b'}}{\overline{b}_z} \right) - \frac{\partial}{\partial y} \overline{v'u'}
$$



Eddy Reynolds stress transfers momentum *offshore*



Eddy Reynolds stress transfers momentum *offshore* Depth-integral gives (under equilibrium)

$$
\psi_{\rm EMF} + \psi_{\rm GM} \simeq \psi_{\rm Ekman} + \psi_{\rm Residual}
$$



Eddy Reynolds stress transfers momentum *offshore* Depth-integral gives (under equilibrium)





No slope dependence

$$
\kappa_{\rm Geom} = \gamma_{\rm Geom} \frac{\sqrt{Ri_{\rm loc}}}{f_0} ({\rm EKE} + {\rm EPE}),
$$

Wang and Stewart (2020)



$$
\kappa_{\text{Geom}} = \gamma_{\text{Geom}} \frac{\sqrt{Ri_{\text{loc}}}}{f_0} (\text{EKE} + \text{EPE}), \qquad \delta = \frac{\text{bottom slope}}{\text{isopyonal slope}}
$$
\n(e.g. Isachsen, 2011)\n
$$
\gamma_{\text{Geom}} = \gamma \left[ \Psi \cdot \tanh(\Gamma \cdot \delta_{\text{loc}}) + \frac{1}{\delta_{\text{loc}} + \Gamma} \right]
$$
\n(e.g. Isachsen, 2011)\n
$$
\text{Wang and Stewart (2020)}
$$



No slope dependence

$$
\kappa_{\text{MLT}} = \gamma_{\text{MLT}} \sqrt{2 \cdot \text{EKE}} \cdot L_{\text{Rh}},
$$

Wang and Stewart (2020)



(a) Original and (b) slope-aware forms of the MLT-based scaling vs  $\kappa_{\theta}$ .

$$
\kappa_{\text{MLT}} = \gamma_{\text{MLT}} \sqrt{2 \cdot \text{EKE}} \cdot L_{\text{Rh}}, \qquad \delta = \frac{\text{bottom slope}}{\text{isopycnal slope}}
$$
  

$$
\gamma_{\text{MLT}} = \gamma \left[ \delta_{\text{loc}} + \frac{1}{\delta_{\text{loc}} + \Gamma} \right]
$$
  
(e.g. Isachsen, 2011)

Wang and Stewart (2020)

$$
\frac{\partial}{\partial y} \overline{v'u'} \sim \mathcal{K}_q \cdot \beta_{\text{topog.}}, \quad \mathcal{K}_q \equiv C_{\text{eddy}} \frac{\text{EKE}}{f_0} \bigg|_{\text{Barotropic}}
$$

$$
\frac{\partial}{\partial y} \overline{v'u'} \sim \mathcal{K}_q \cdot \beta_{\text{topog.}}, \quad \mathcal{K}_q \equiv C_{\text{eddy}} \frac{\text{EKE}}{f_0} \bigg|_{\text{Barotropic}}
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$$
\overline{v'u'} \sim \text{EKE}
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$$

$$
\overline{v'u'} \sim \text{EKE}
$$

Consistent with barotropic "GEOMETRIC" (Hoskins et al., 1983; Marshall et al., 2012):

$$
M = \frac{\overline{v'^2 - u'^2}^z}{2}, \quad N = \overline{u'v'}^z,
$$
  

$$
M^2 + N^2 \le EKE
$$
  

$$
N = \gamma_m E \sin 2\phi_m \cos^2 \lambda,
$$

$$
\frac{\partial}{\partial y} \overline{v'u'} \sim \mathcal{K}_q \cdot \beta_{\text{topog.}}, \quad \mathcal{K}_q = C_{\text{eddy}} \frac{\text{EKE}}{f_0} \bigg|_{\text{Barotropic}}
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 $M^2 + N^2 \leq EKE$ 

$$
N = \gamma_m E \sin 2\phi_m \cos^2 \lambda,
$$

Resembling "selective decay" of 2D topographic turbulence (Bretherton and Haidvogel, 1976):



He and Wang (2024)

 $\overline{v'u'}\sim EKE$ 



```
\overline{v'u'}\sim EKE
```


### Convert scaling(s) into eddy closure(s): Retrograde



### Convert scaling(s) into eddy closure(s): Retrograde





3

 $(d)$ 

50

250

Offshore distance (km)

150

350

450











#### Impact of parameterized eddy momentum forcing: Retrograde



#### Impact of parameterized eddy momentum forcing: Retrograde



Xie, Wei, and Wang (2024)

Physics-based eddy closure(s): Retrograde







### Physics-based eddy closure(s): Retrograde 2D runs



### Physics-based eddy closure(s): 3D coarse-grid "raw" flow



Acceptable stratification, wrong jet structures.

### Physics-based eddy closure(s): 3D coarse-grid "raw" flow



Acceptable stratification, wrong jet structures.

Physics-based eddy closure(s): Retrograde 3D runs







Model momentum equation(s)



#### Physics-based eddy closure(s): 3D coarse-grid parameterized flow



#### Physics-based eddy closure(s): 3D coarse-grid parameterized flow



### Summary

- Prograde frontal systems are theorized and parameterized via GEOMETRIC adapted by an analytical function of the slope Burger number controlling efficiency of eddy buoyancy fluxes.
- Retrograde frontal systems are forced jointly by eddy buoyancy and momentum fluxes; the former can be quantified using a range of GM-based scalings, adapted via analytical functions of the topographic slope parameter.
- Eddy momentum fluxes across retrograde fronts depend linearly on eddy energy, and echo with barotropic eddy PV fluxes theorized in 2D topographic turbulence, driving prograde undercurrents.
- Machine learning approaches can augment physics-based, bathymetry-aware mesoscale eddy parameterizations by constraining eddy energy or/and forcing online.
- Scale separation may exist between eddy buoyancy and momentum forcing, which alludes to muting GM-based schemes but utilizing numerically-dissipated energy for driving subgrid-scale eddy momentum forcing in eddy permitting regimes across continental margins (*ongoing*).

#### Bathymetry-aware recipe (to be cont.):

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[Redi] C. Xie, H. Wei, and Y. Wang, 2023a, "Impact of parameterized isopycnal diffusivity on shelf-ocean exchanges under upwelling-favorable winds: offline tracer simulations augmented by artificial neural network", Journal of Advances in Modeling Earth Systems, 15, e2022MS00342.

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