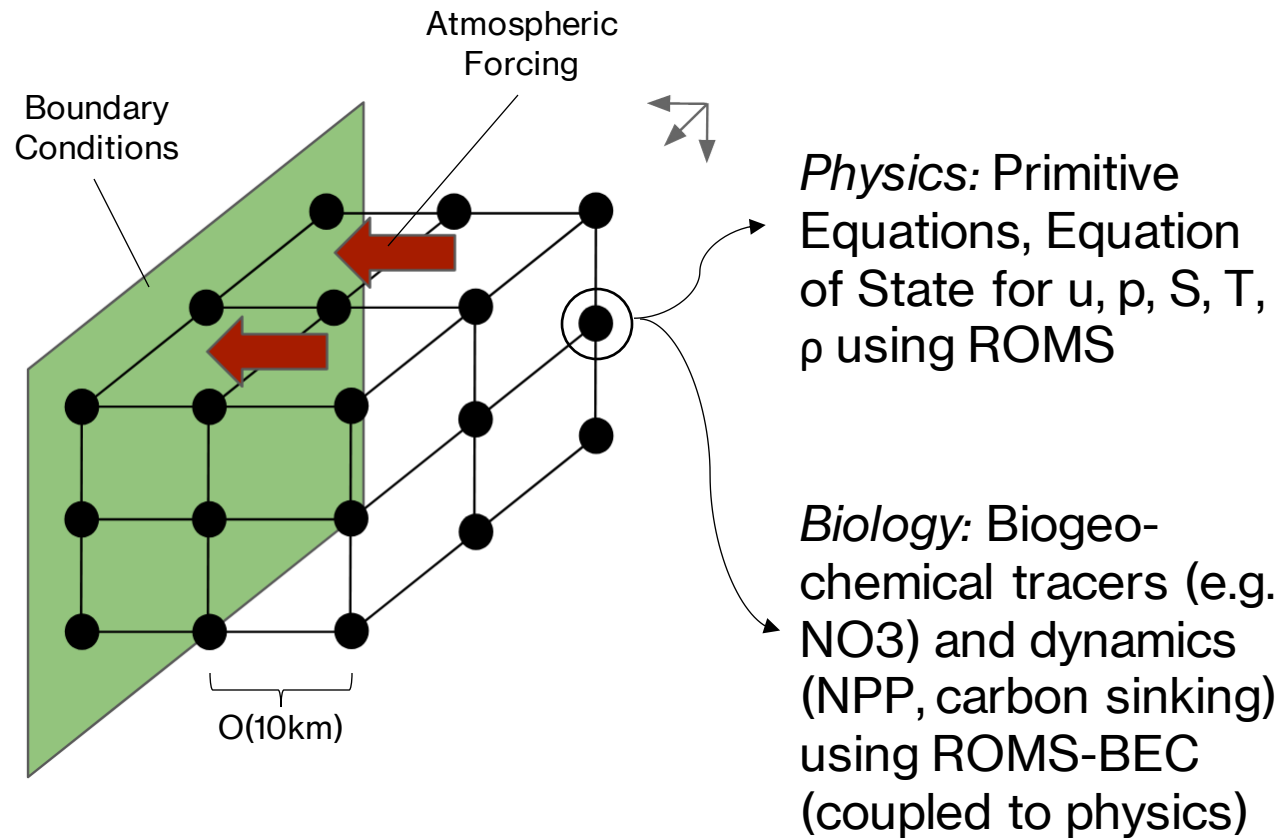


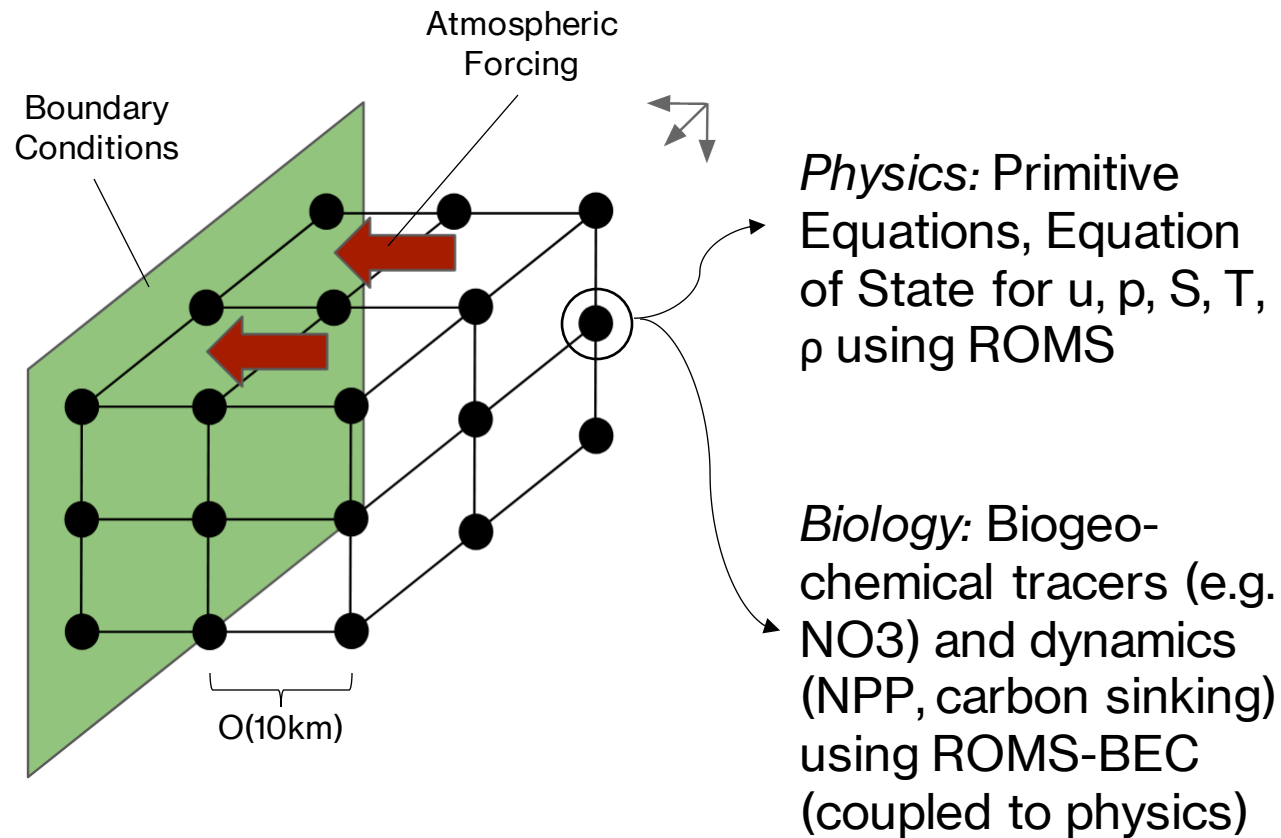
On the Impact of Submesoscale Fronts on Mesoscale Eddies and Biological Productivity in the California Current System

Masterthesis by Max Simon
at *Environmental Physics Group*,
ETH Zurich

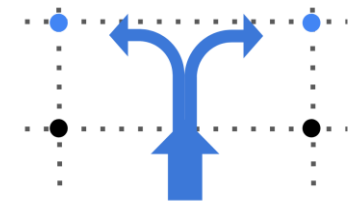
Computational Model Approach



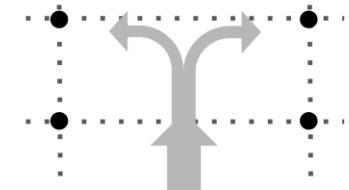
Computational Model Approach



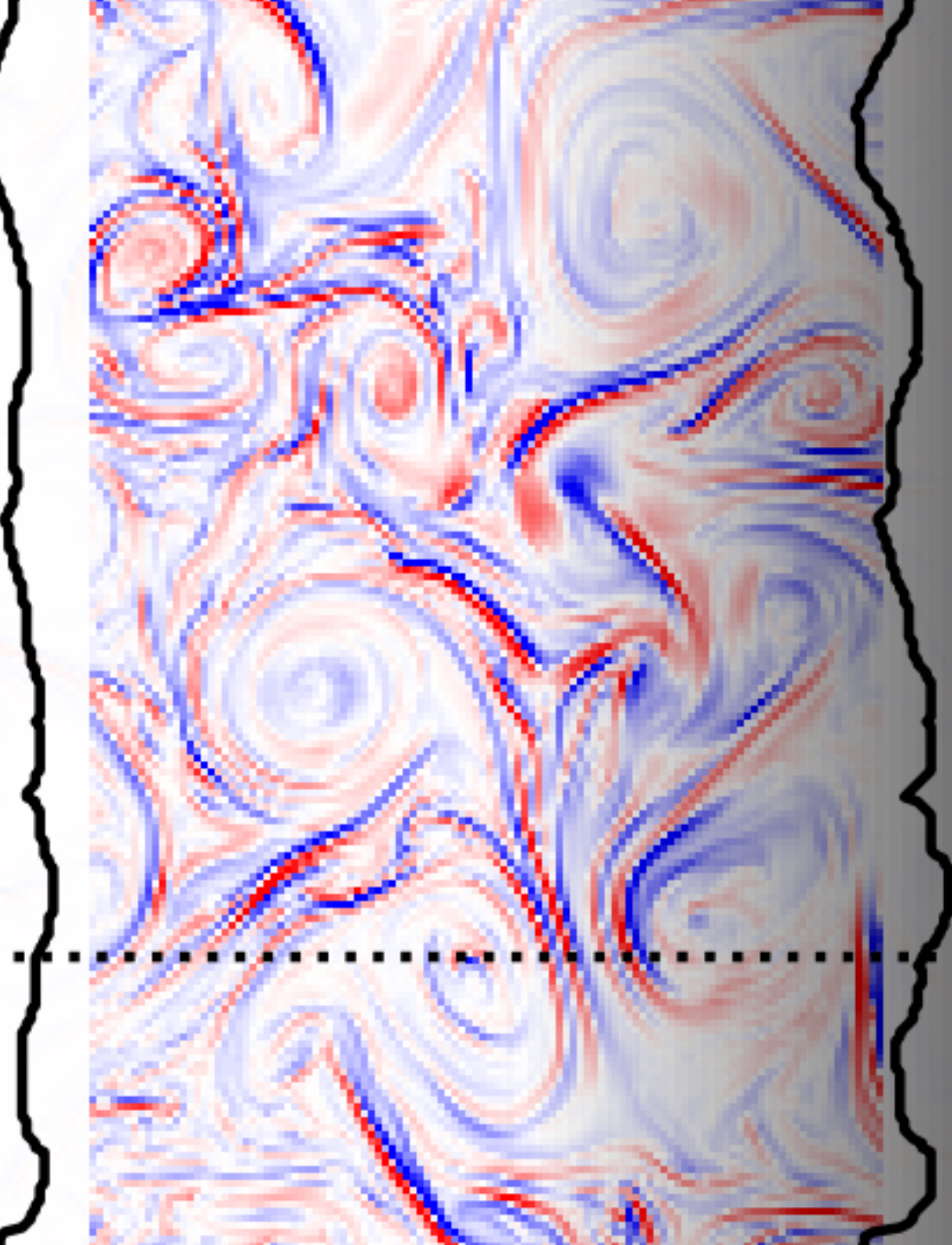
Discretization



Observations: all processes contribute to observations



Model: only resolved processes can contribute



**What is the difference
between a model that
resolves submeso-
scale fronts and a
model that does not?**



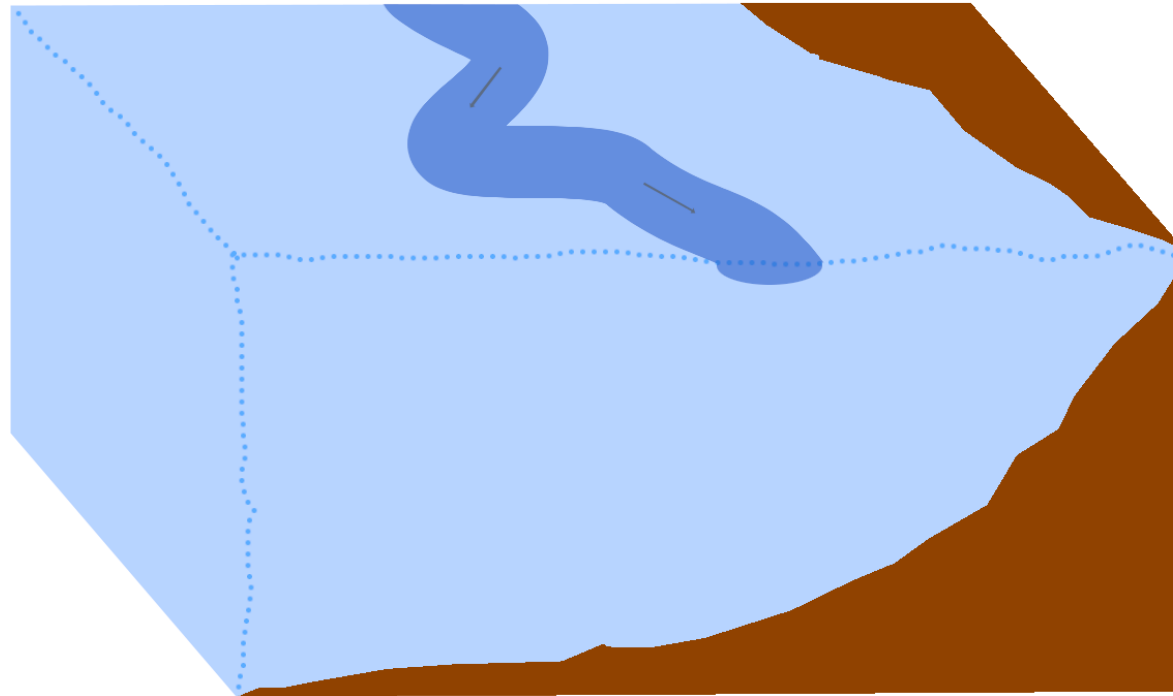
Structure

1. Domain & Model Data
2. Submesoscale Fronts
3. Impact on Mesoscale Eddies
4. Biological Productivity
5. Summary



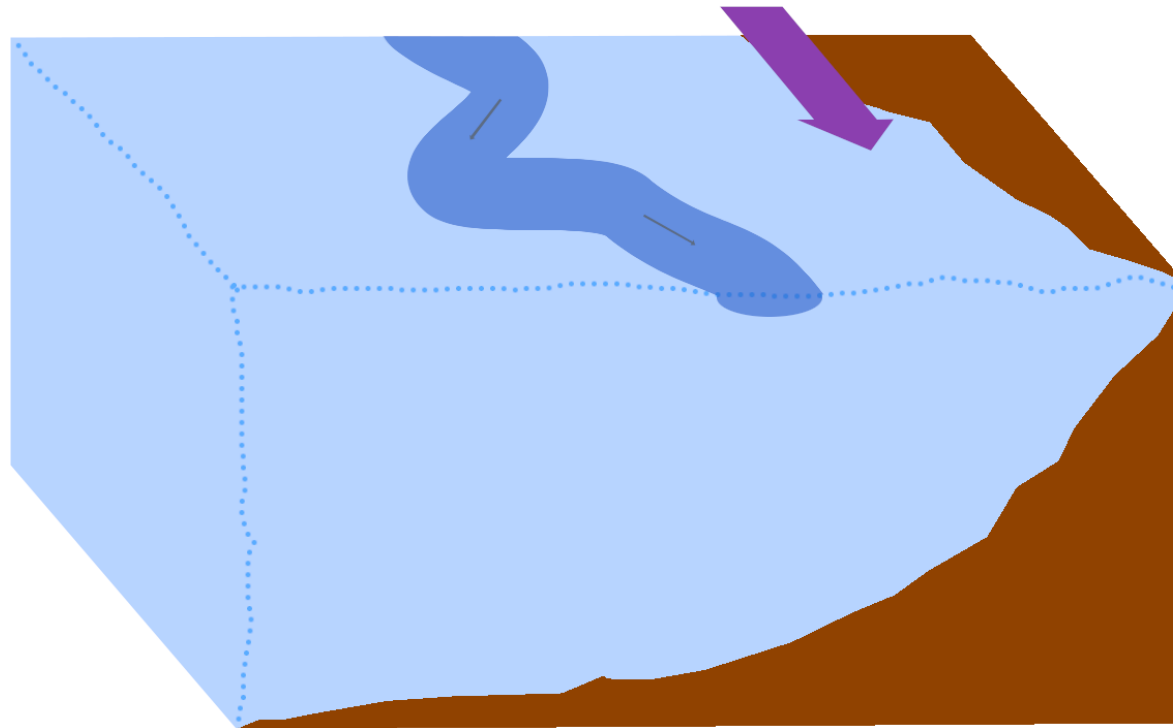
Domain & Model Data

Domain: Eastern Boundary Upwelling System



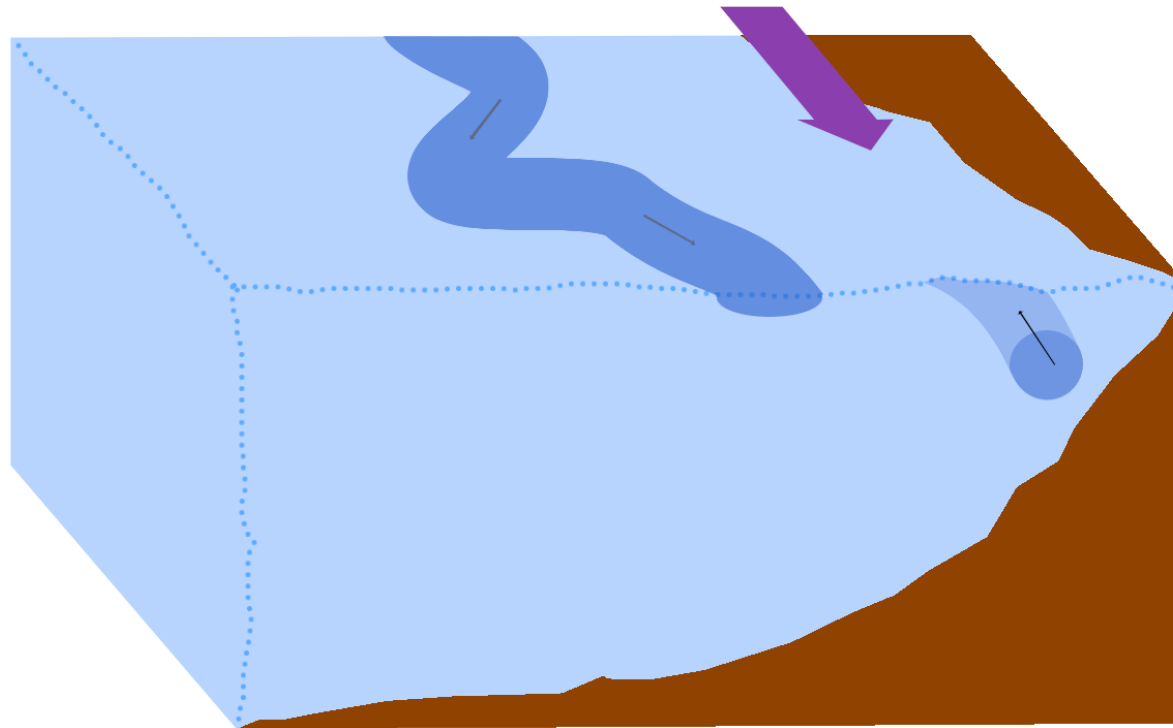
(based on Nagai et al., 2015)

Domain: Eastern Boundary Upwelling System



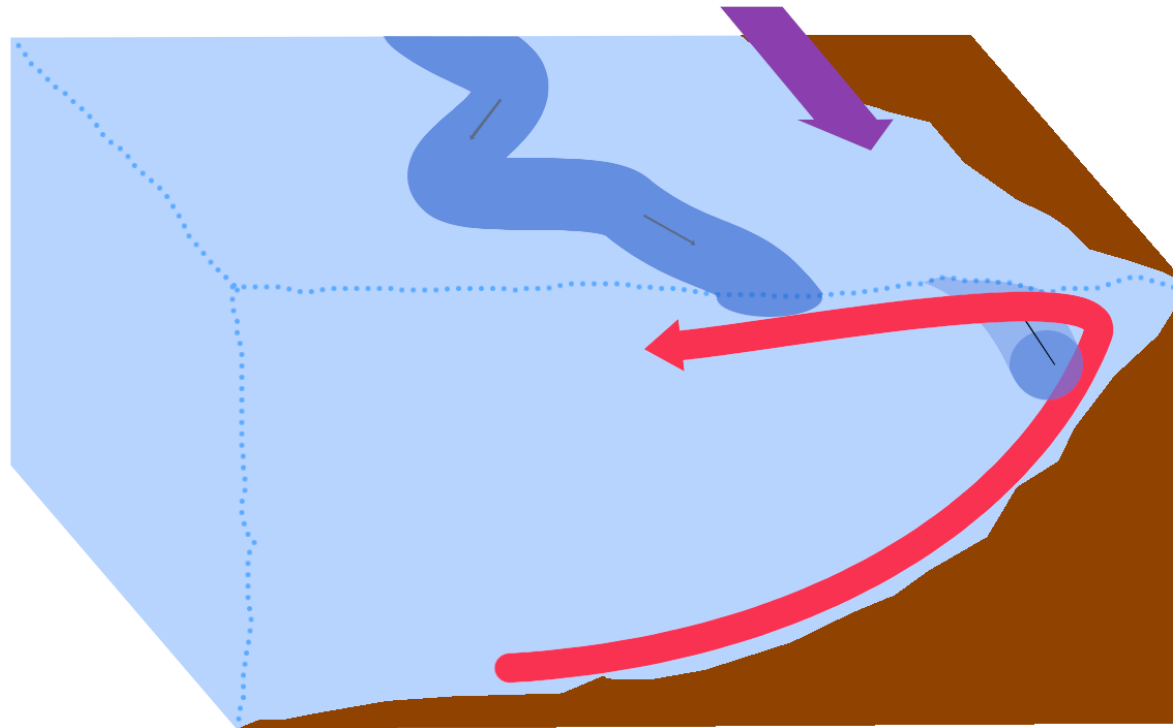
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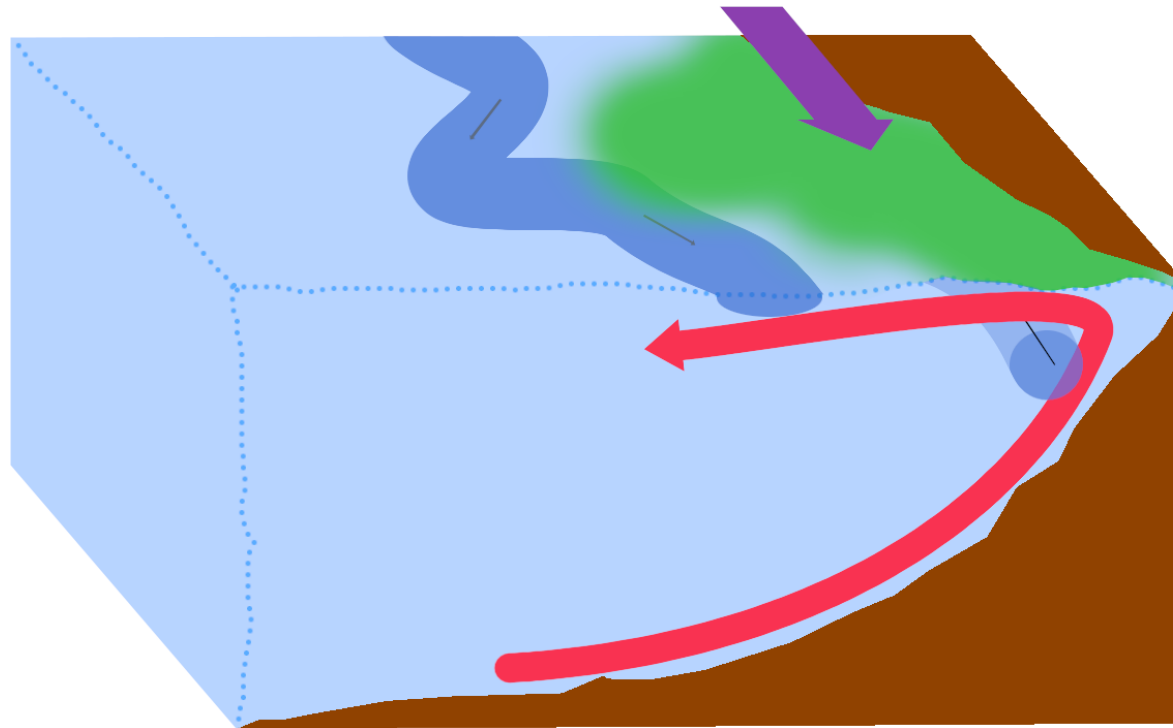
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Domain: Eastern Boundary Upwelling System



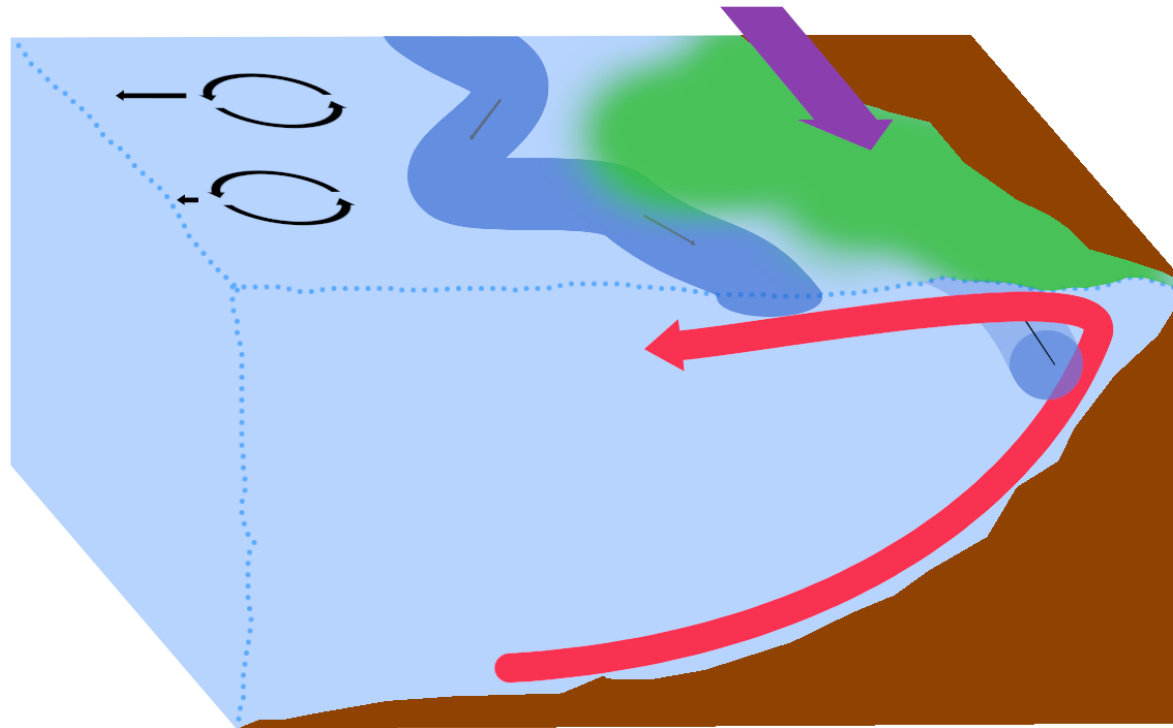
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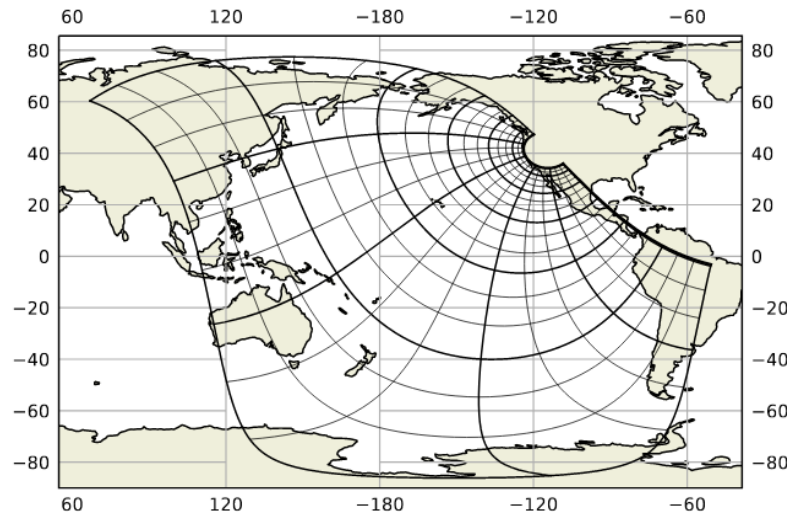
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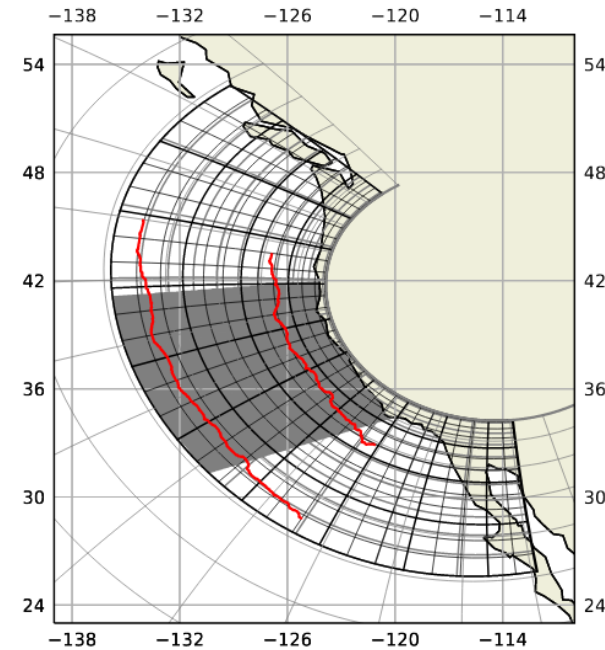
(based on Nagai et al., 2015)

Model data

Mid resolution (7.0 km)
pactcs30



High resolution (2.8 km)
uswtcs

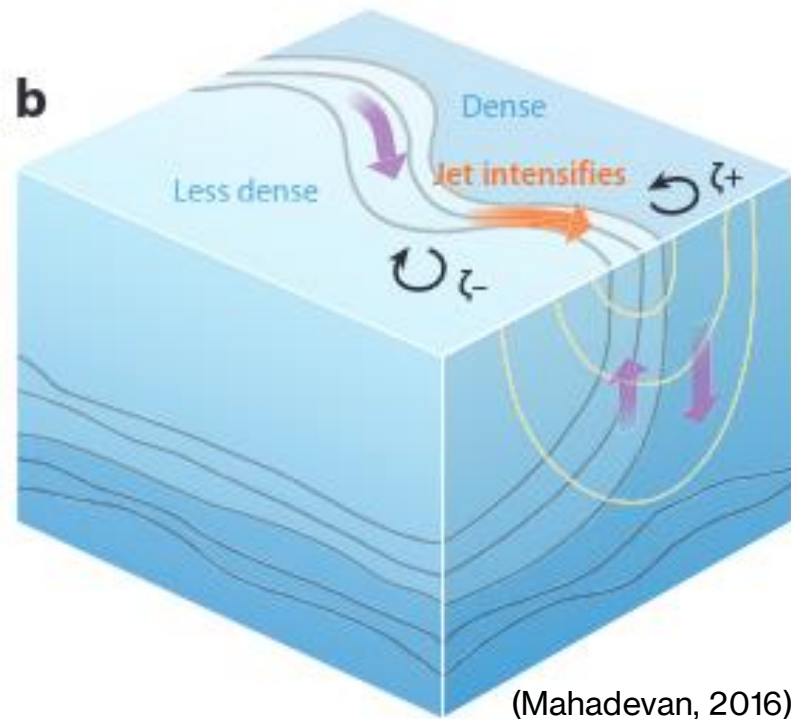


- climatological forcing (normal year, ERA5)
- MR integrated on full domain, used as boundary condition for HR
- five years integration time, last three years used for analysis
- data saved as bidaily averages



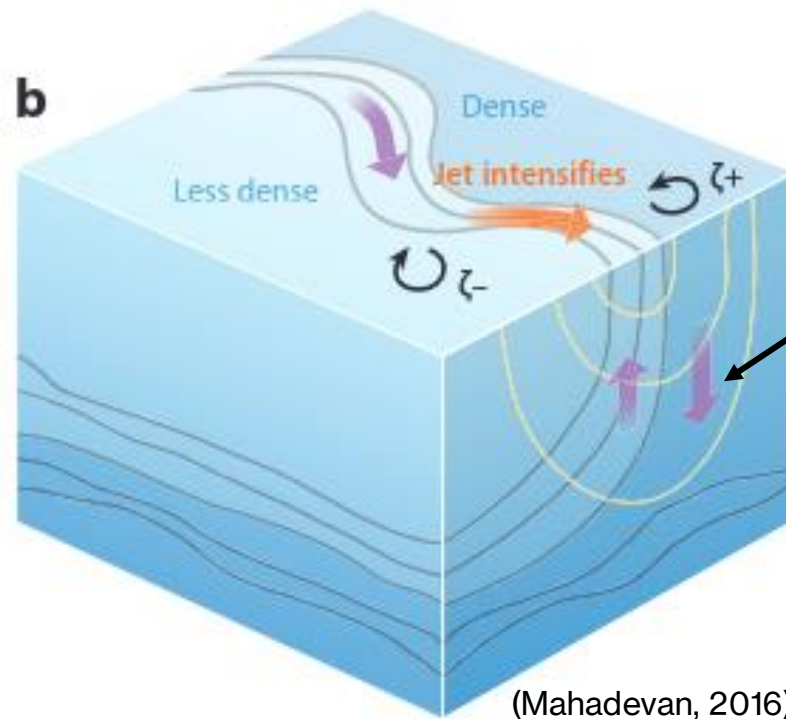
Submesoscale Fronts

Submesoscale Fronts: Frontogenesis



- emerge at horizontal density fronts, driven by mesoscale eddy strain or atmospheric forcing

Submesoscale Fronts: Frontogenesis

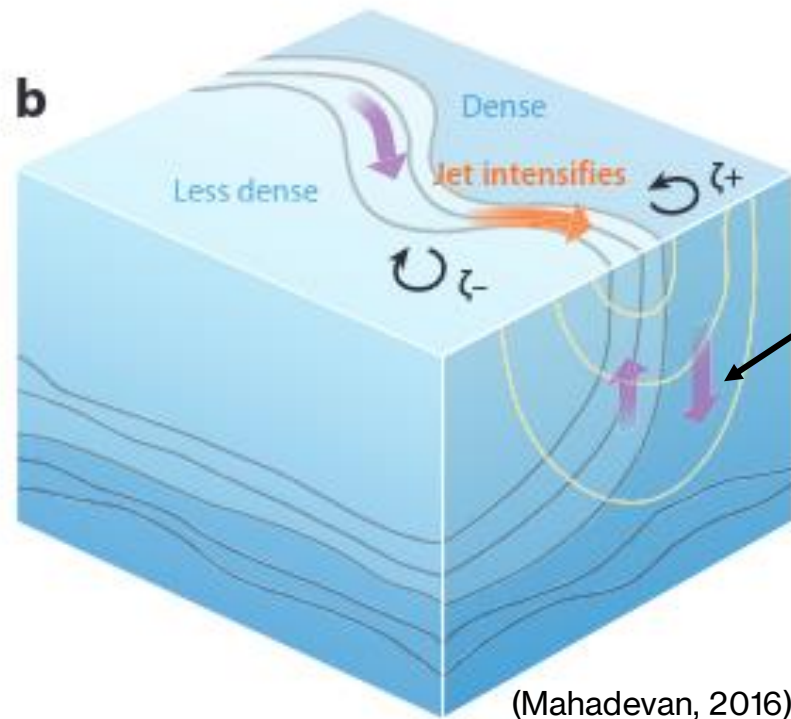


(Mahadevan, 2016)

- emerge at horizontal density fronts, driven by mesoscale eddy strain or atmospheric forcing
- ageostrophic secondary circulation to restore geostrophic balance of jet



Submesoscale Fronts: Frontogenesis

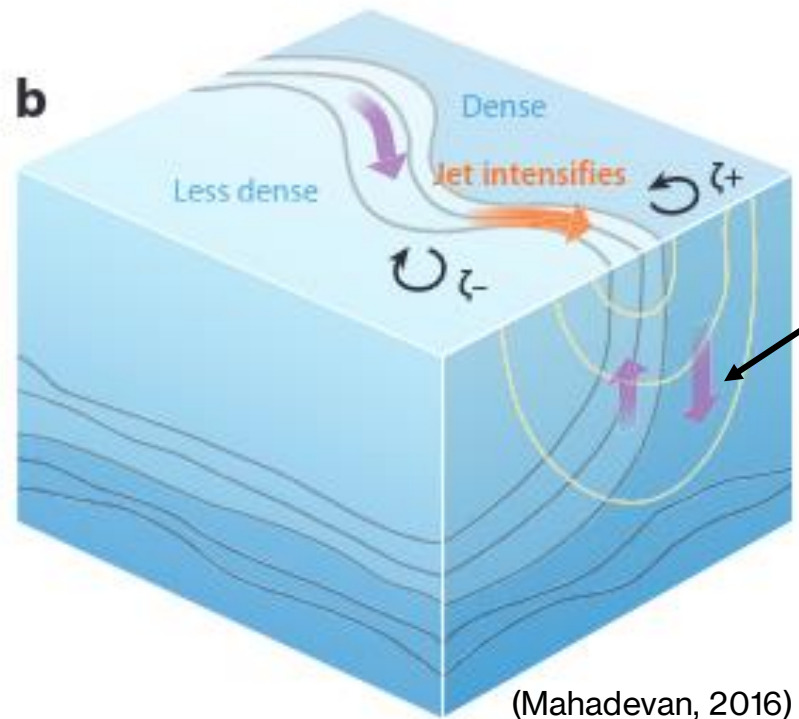


(Mahadevan, 2016)

- emerge at horizontal density fronts, driven by mesoscale eddy strain or atmospheric forcing
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- upwelling at less dense side, downwelling at dense side ($\mathcal{O}(\text{m/day})$)



Submesoscale Fronts: Frontogenesis



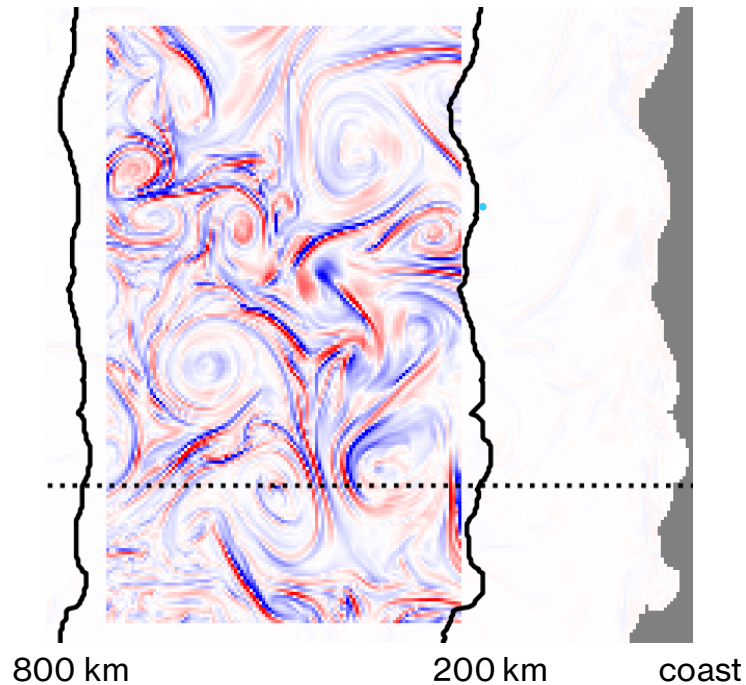
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- ageostrophic secondary circulation to restore geostrophic balance of jet
- upwelling at less dense side, downwelling at dense side ($\mathcal{O}(\text{m/day})$)
- modulated by mixed layer depth

(Mahadevan, 2016)



Submesoscale Fronts: Characteristics

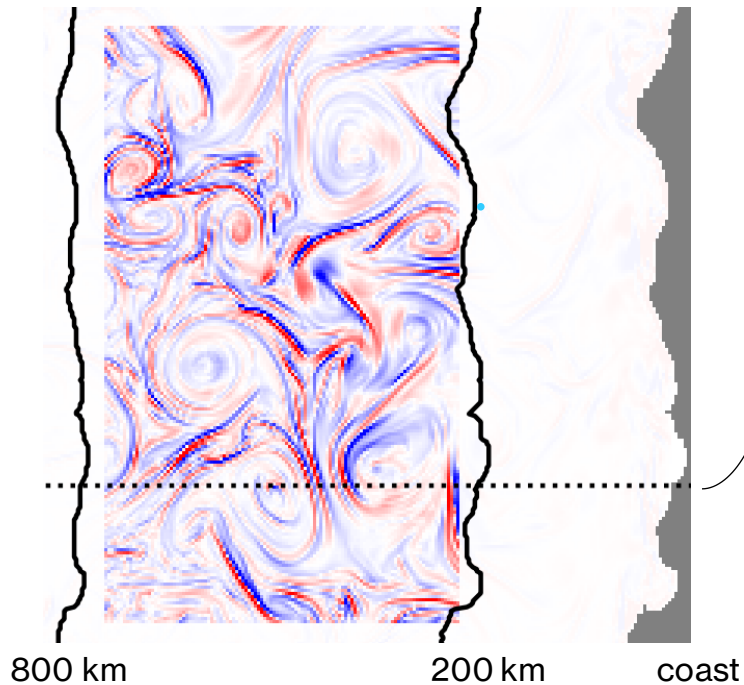
Vertical velocity field at 25m depth



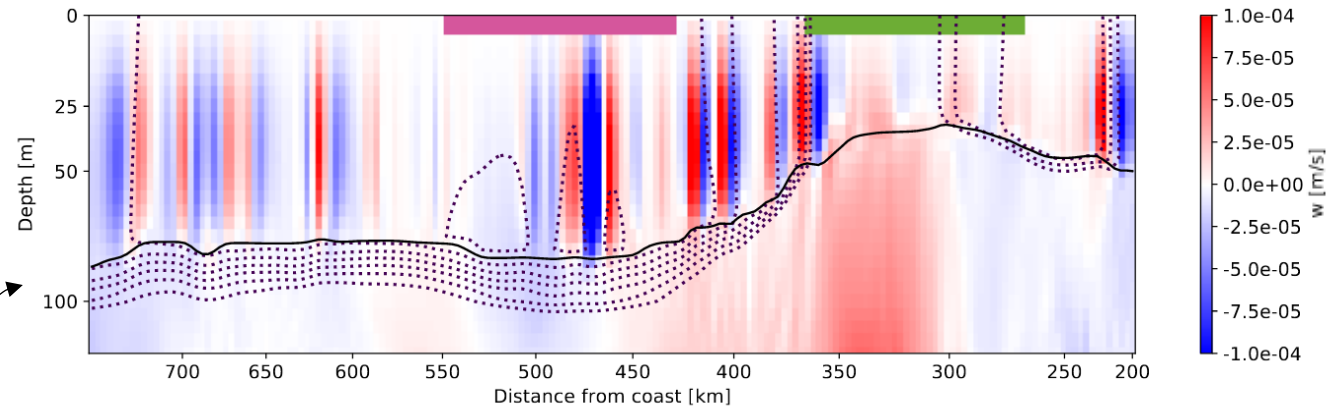


Submesoscale Fronts: Characteristics

Vertical velocity field at 25m depth



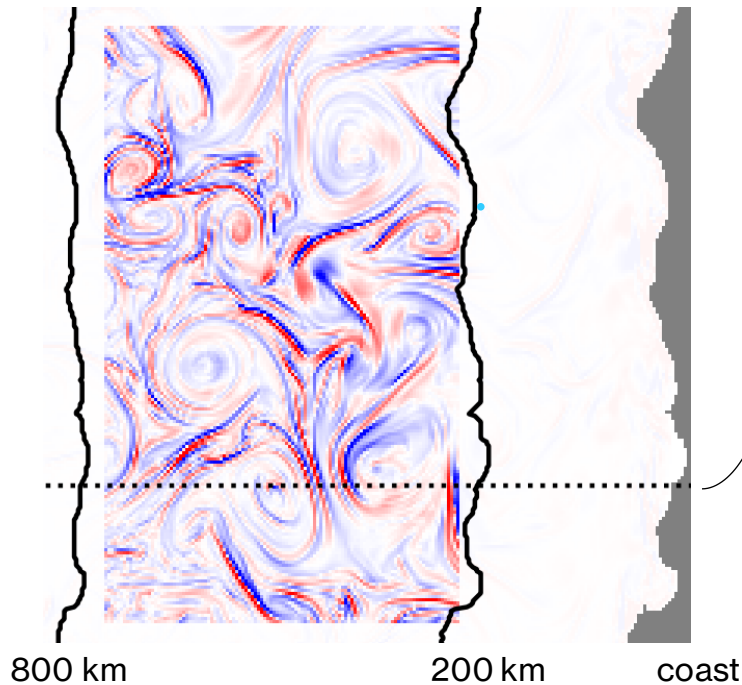
Vertical velocity field as vertical section



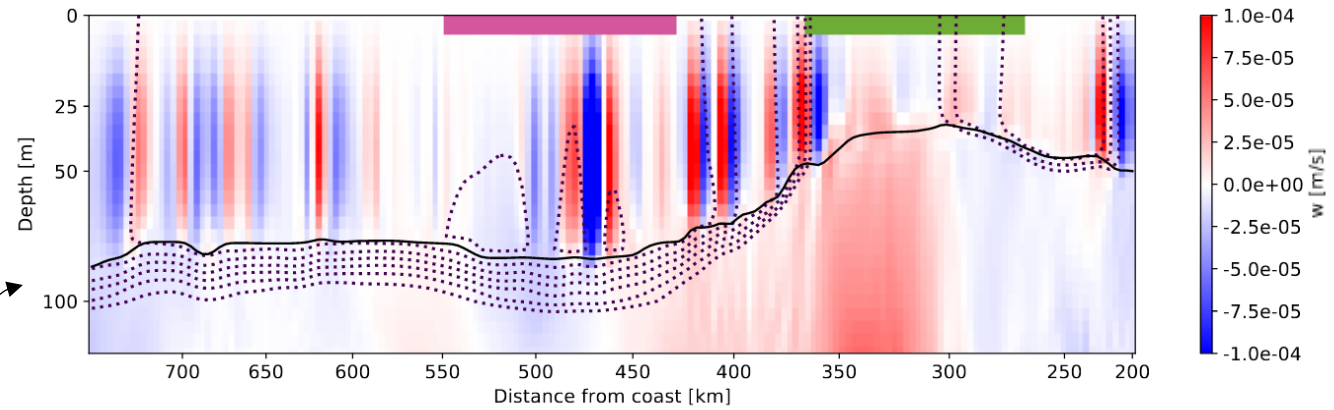


Submesoscale Fronts: Characteristics

Vertical velocity field at 25m depth



Vertical velocity field as vertical section

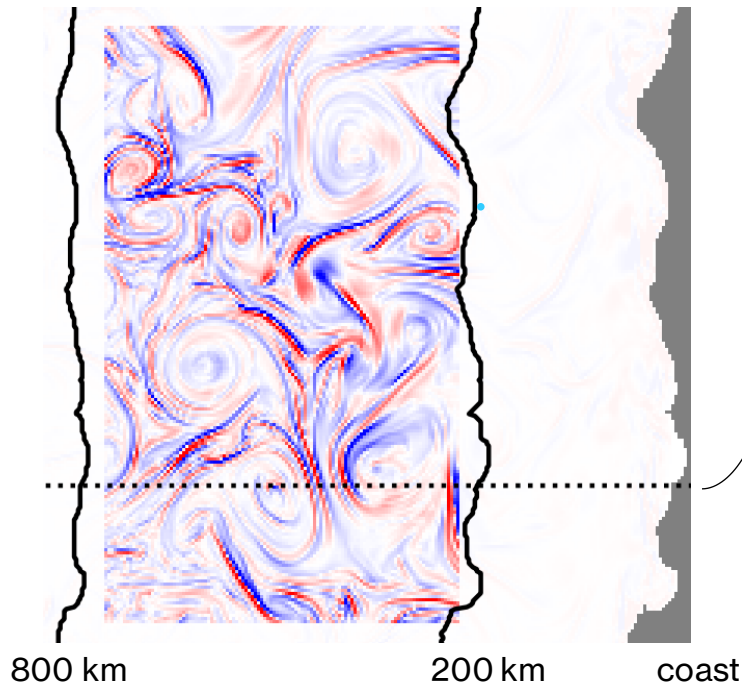


Submesoscale fronts
shape vertical velocities
in the mixed layer

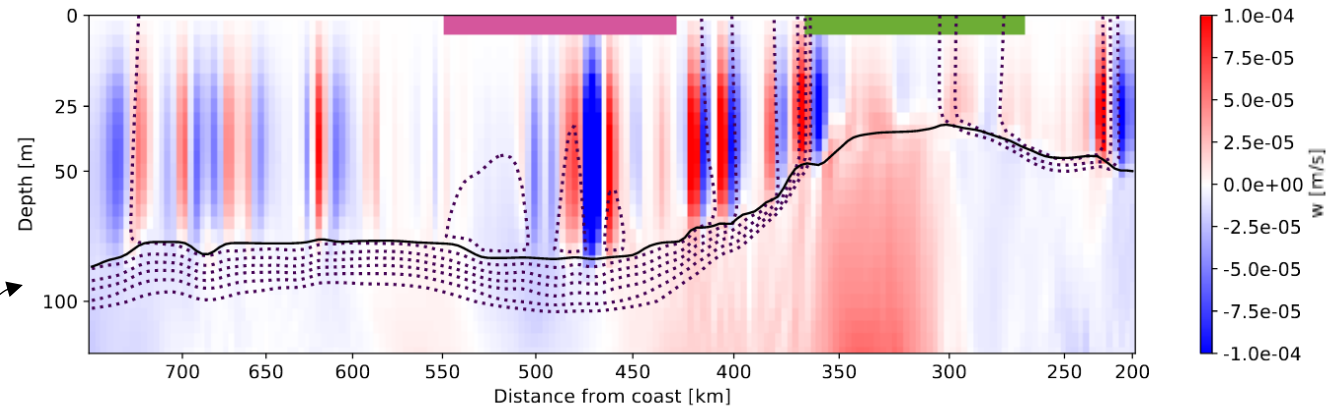


Submesoscale Fronts: Characteristics

Vertical velocity field at 25m depth



Vertical velocity field as vertical section



Characteristics:

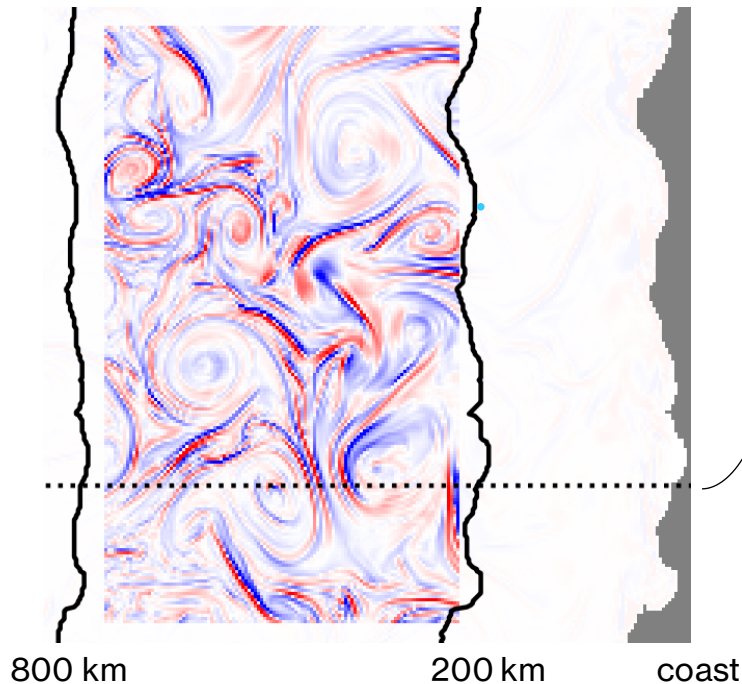
- strong vertical velocities
- elongated features
- horizontally & vertically coherent

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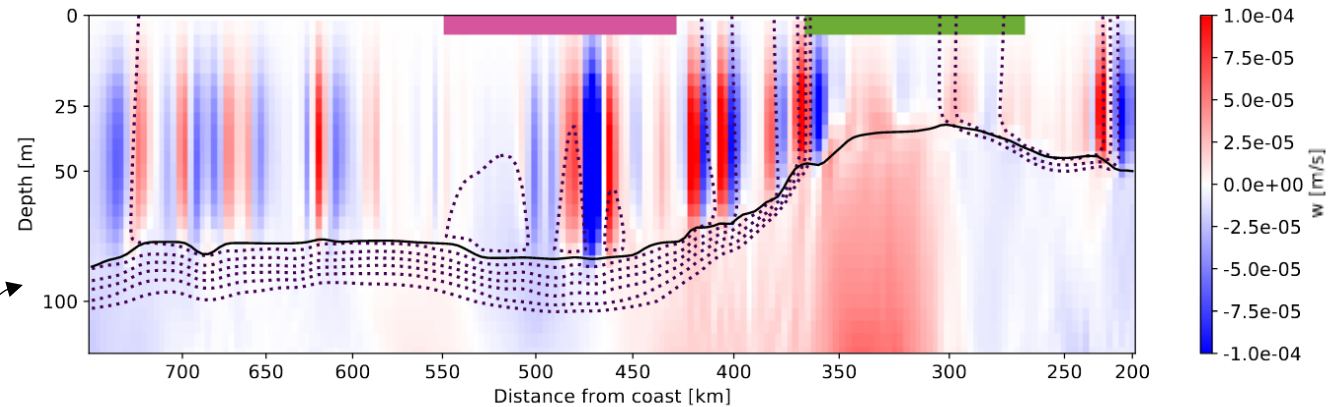


Submesoscale Fronts: Characteristics

Vertical velocity field at 25m depth



Vertical velocity field as vertical section



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Detection:

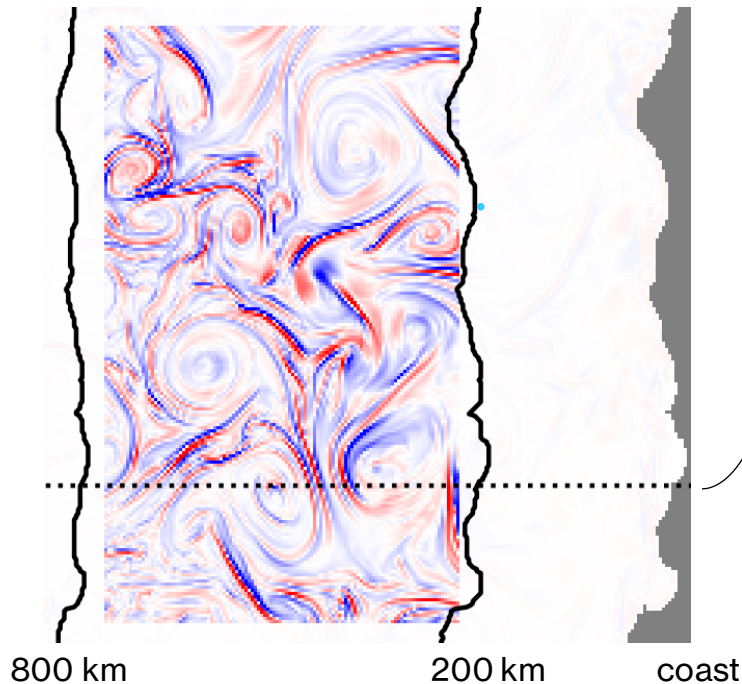
1. thresholding vertical velocity field
2. connected components

Submesoscale fronts
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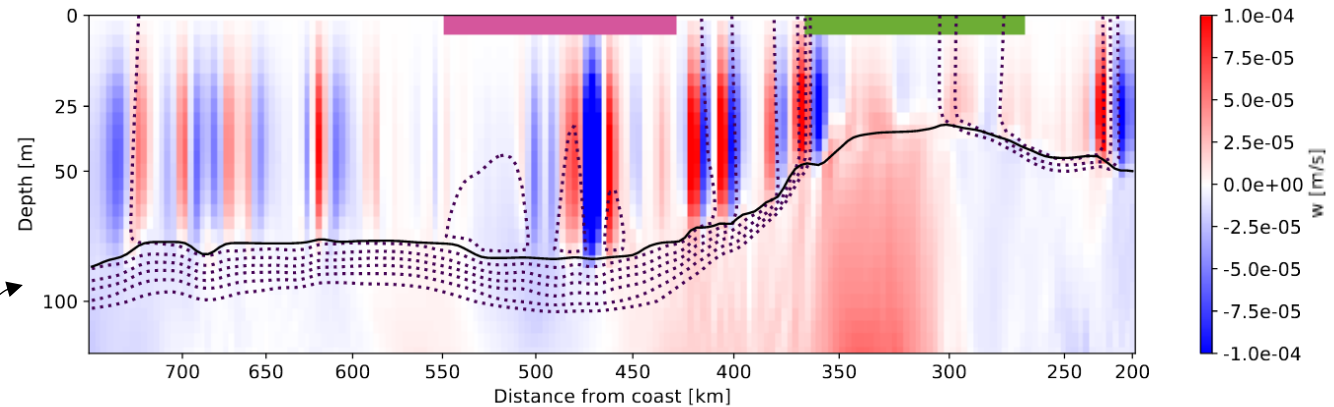


Submesoscale Fronts: Characteristics

Vertical velocity field at 25m depth



Vertical velocity field as vertical section



Characteristics:

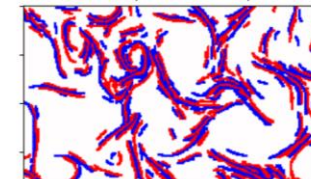
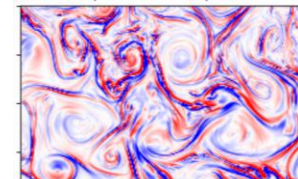
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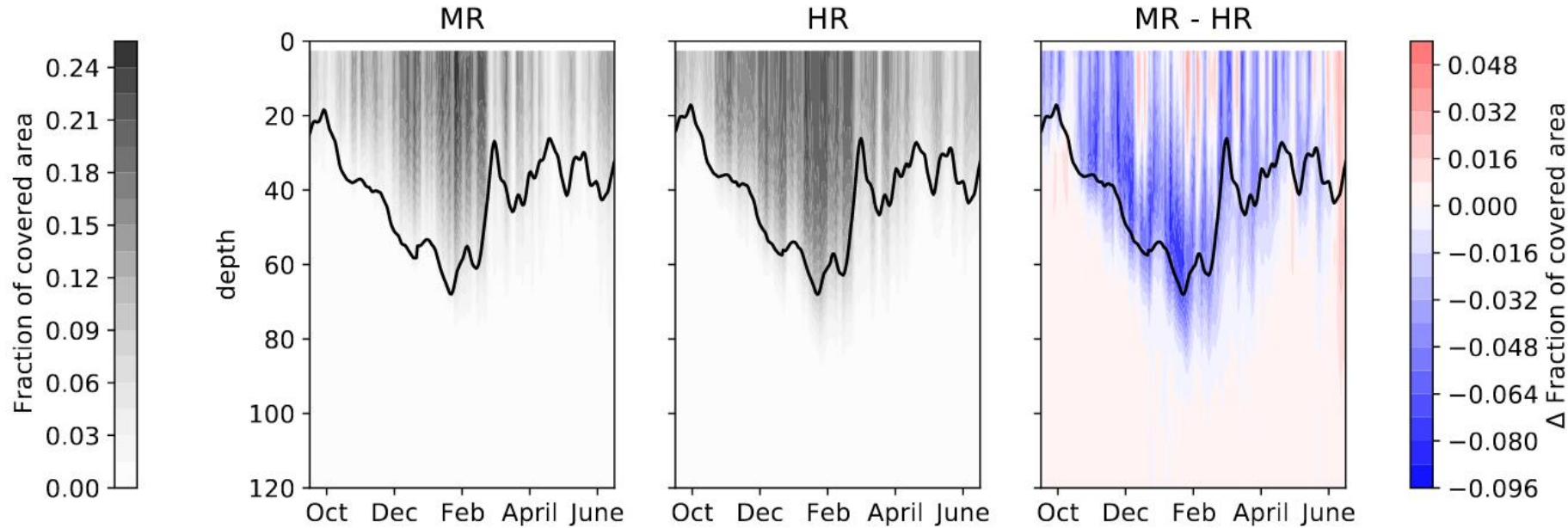
Submesoscale fronts shape vertical velocities in the mixed layer

Continuous values of vertical velocity



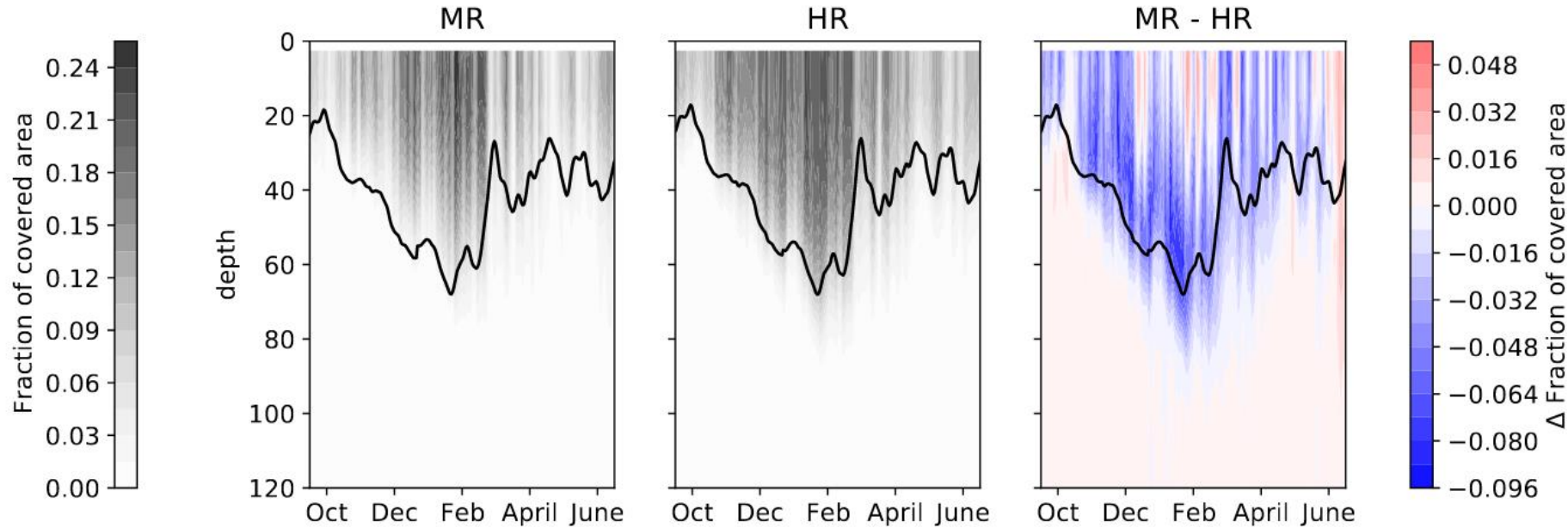
Boolean map of submesoscale fronts

Submesoscale Fronts: Detection Algorithm





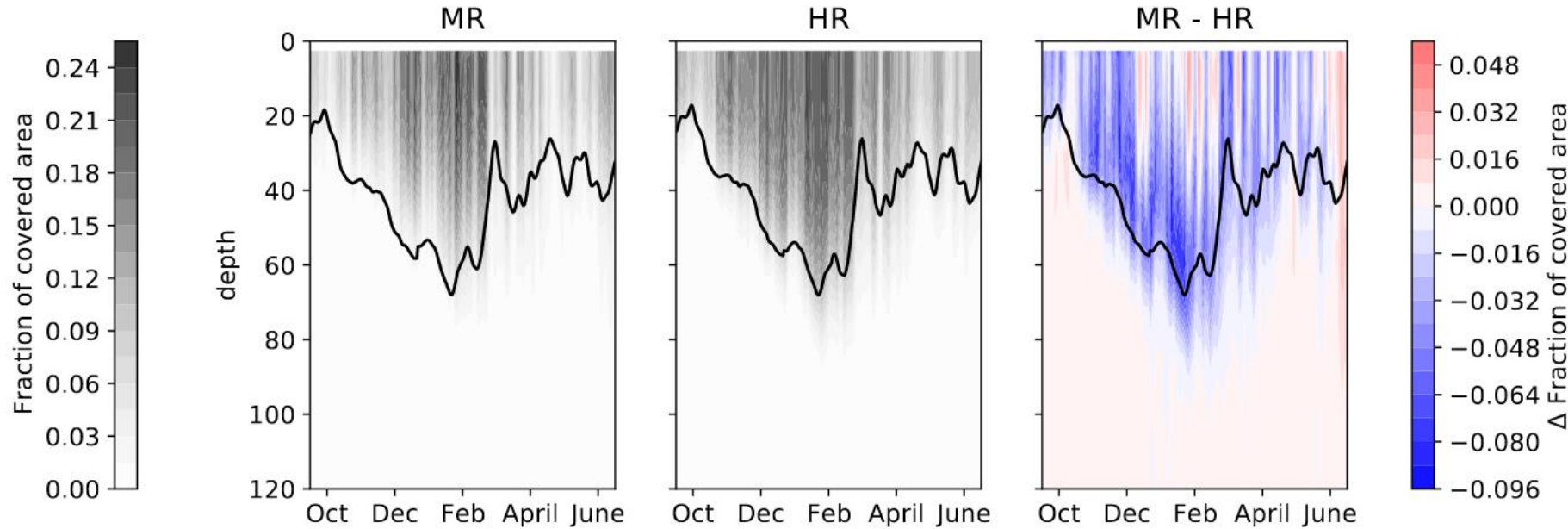
Submesoscale Fronts: Detection Algorithm



- reproduce modulation by MLD
- reproduce seasonality (given by MLD, deepest in winter)



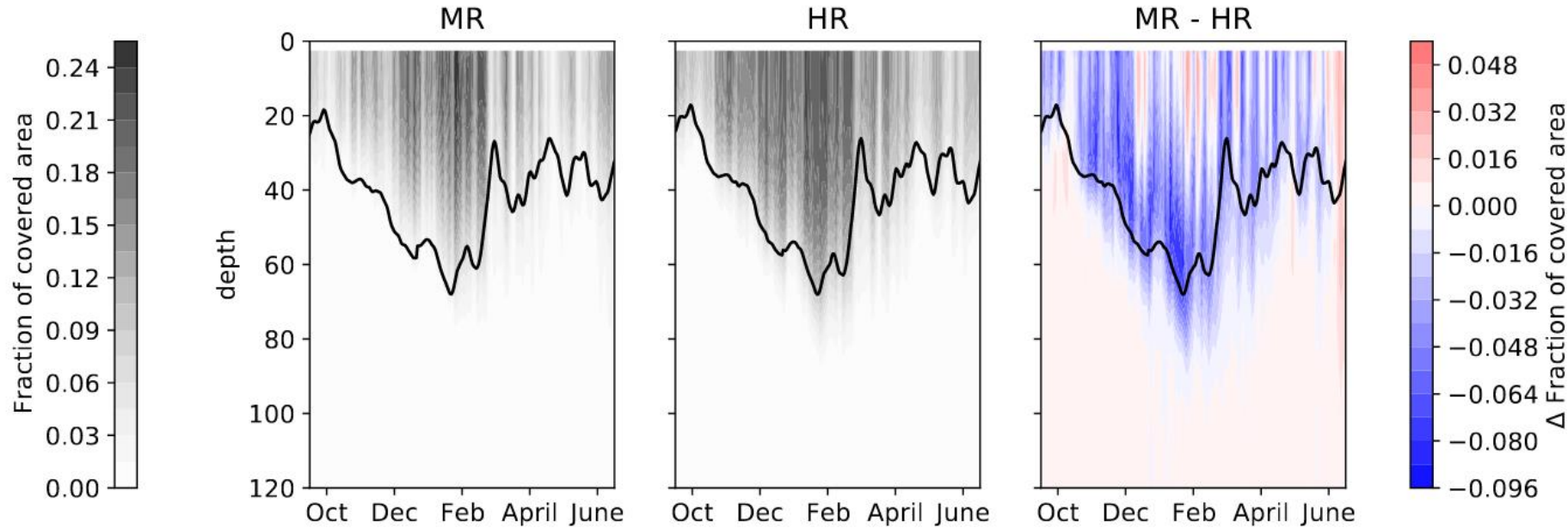
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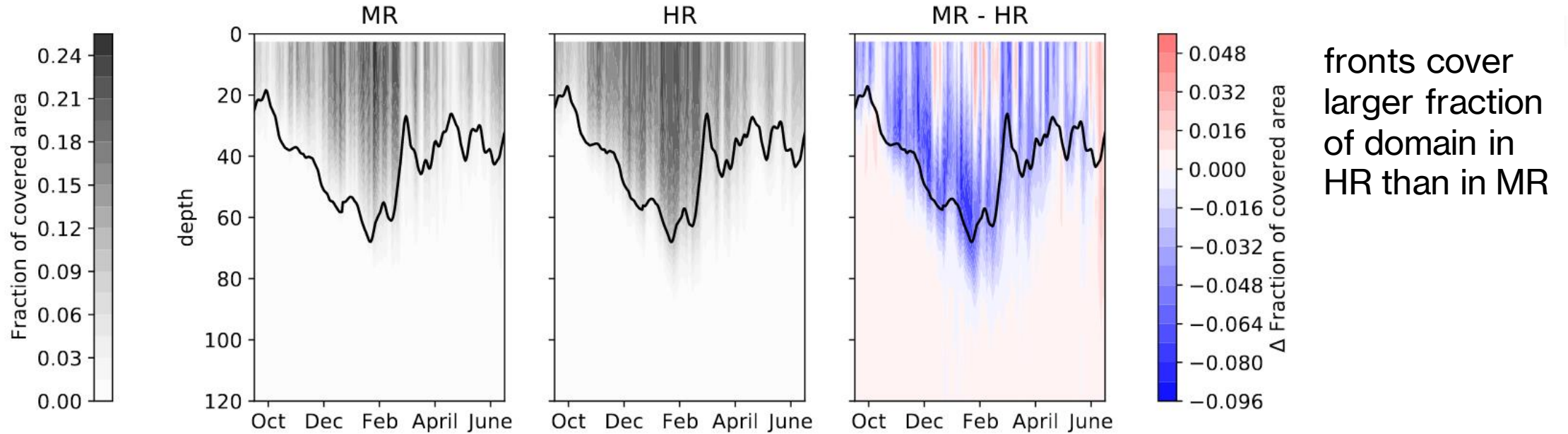
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- visual inspection

Does its job in both,
MR and HR ✓

Submesoscale Fronts: Detection Algorithm

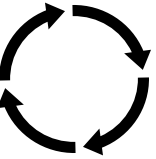


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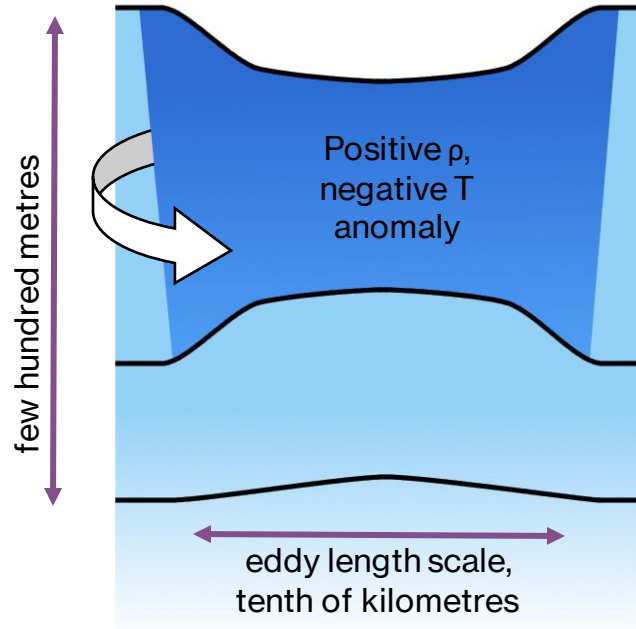


Impact on Mesoscale Eddies

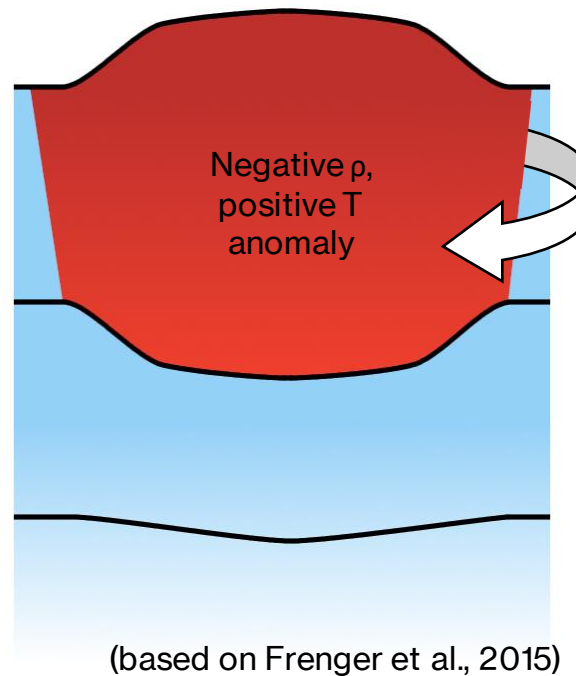


Mesoscale Eddies

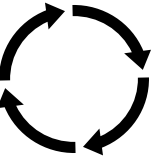
Cyclones



Anticyclones

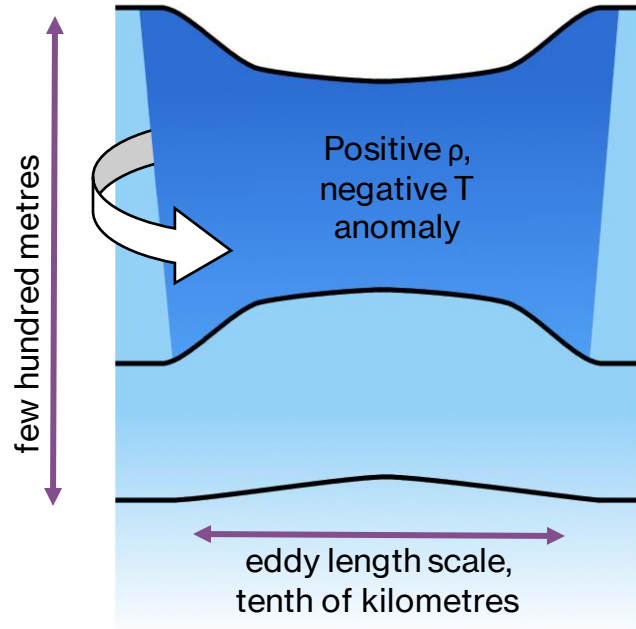


- radius 20 km - 200 km, several months lifetime

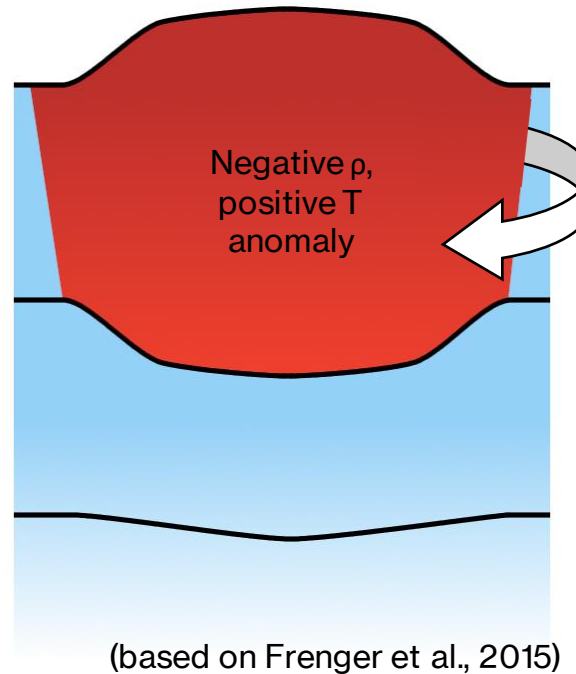


Mesoscale Eddies

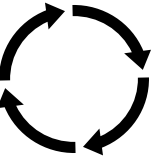
Cyclones



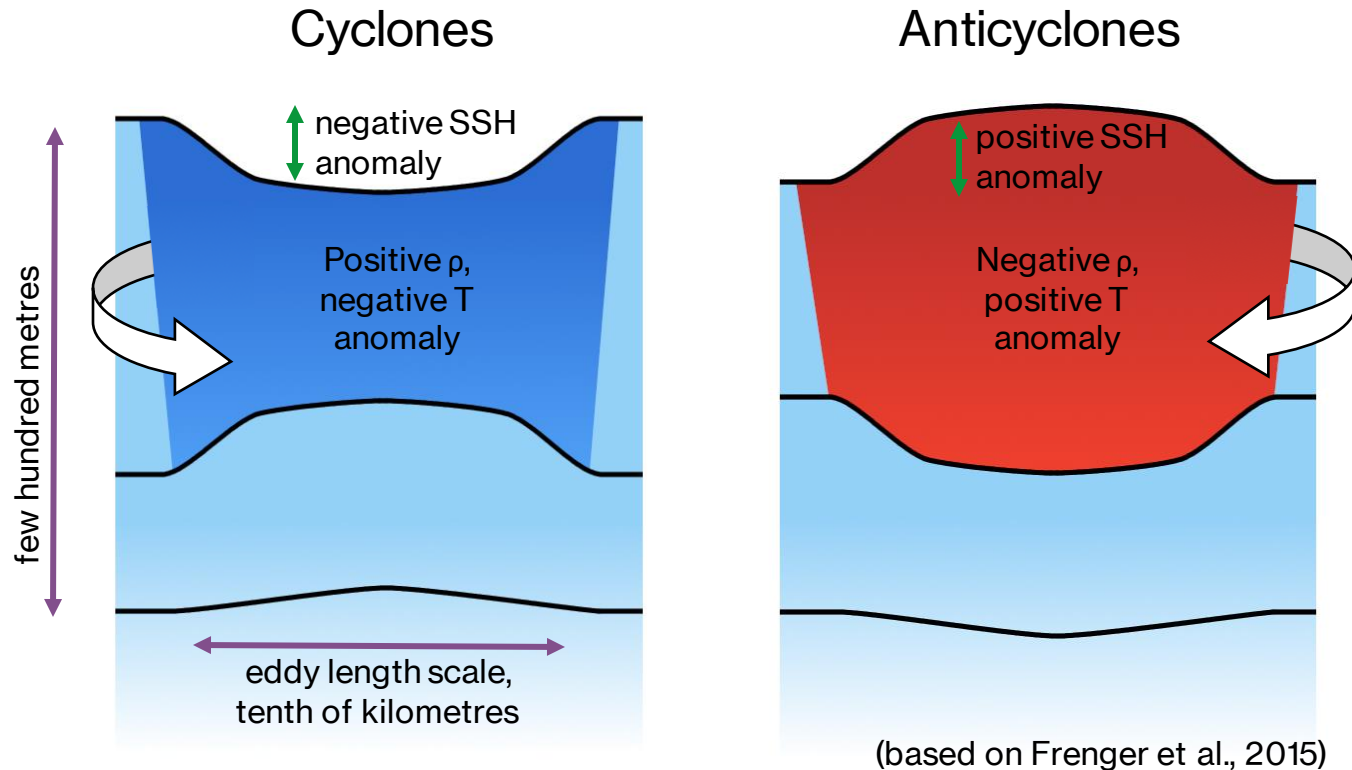
Anticyclones



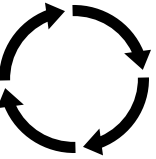
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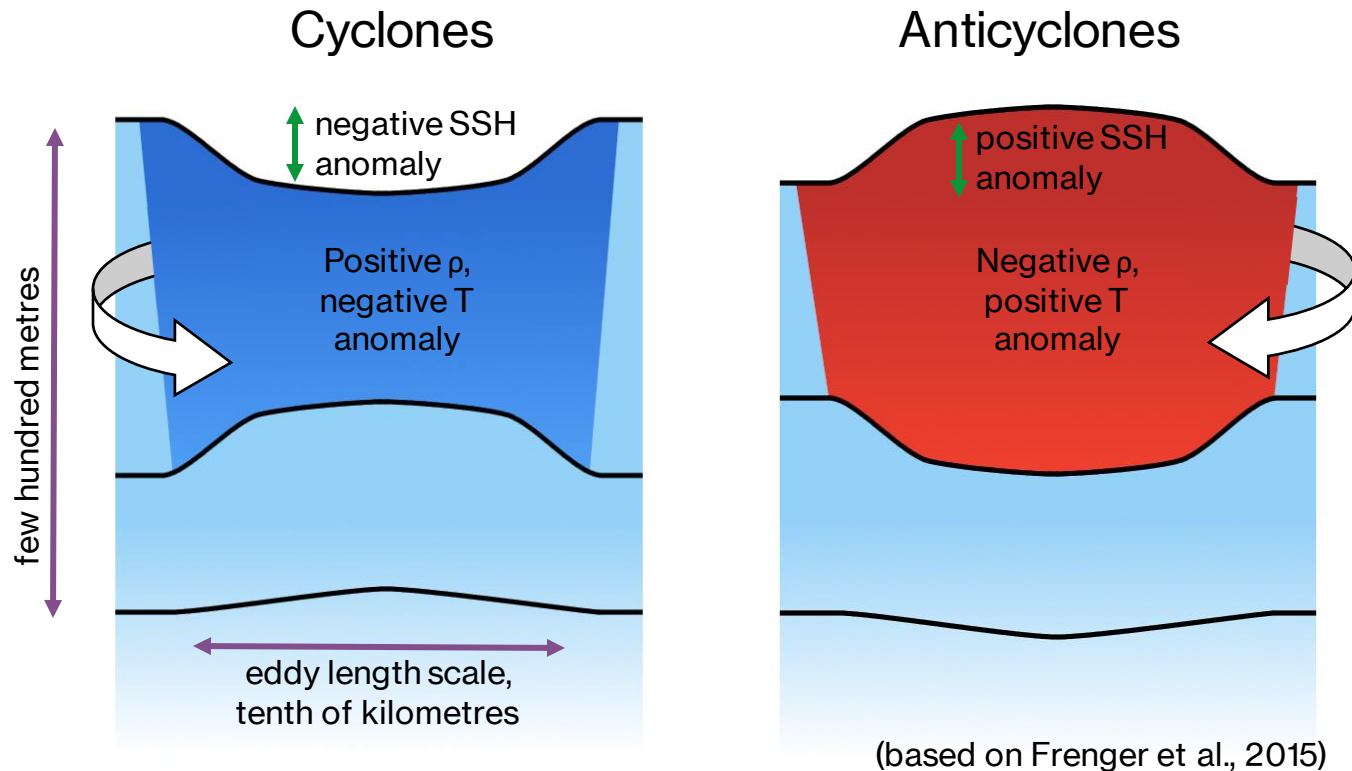
Mesoscale Eddies



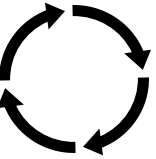
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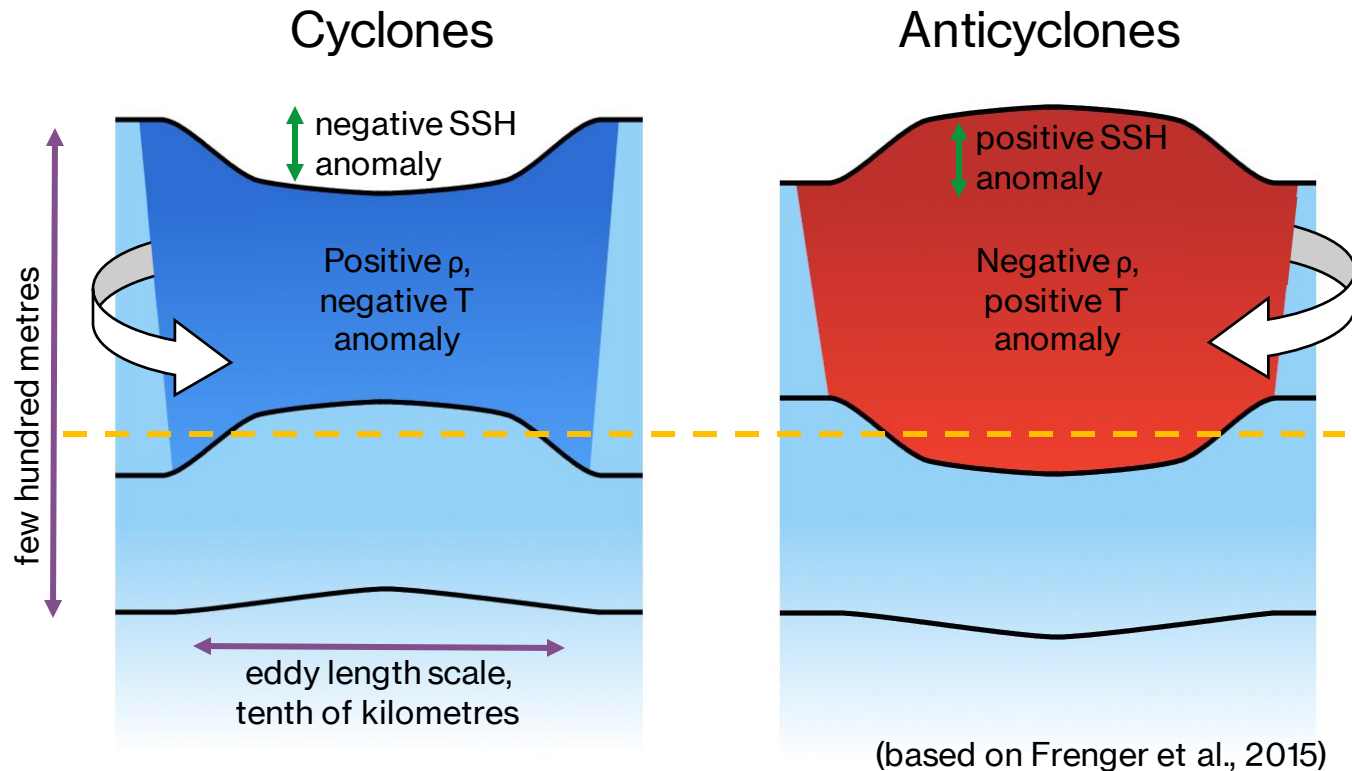
Mesoscale Eddies



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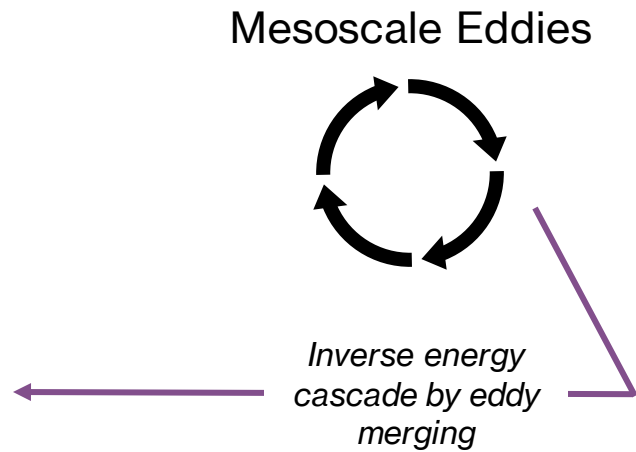


Mesoscale Eddies

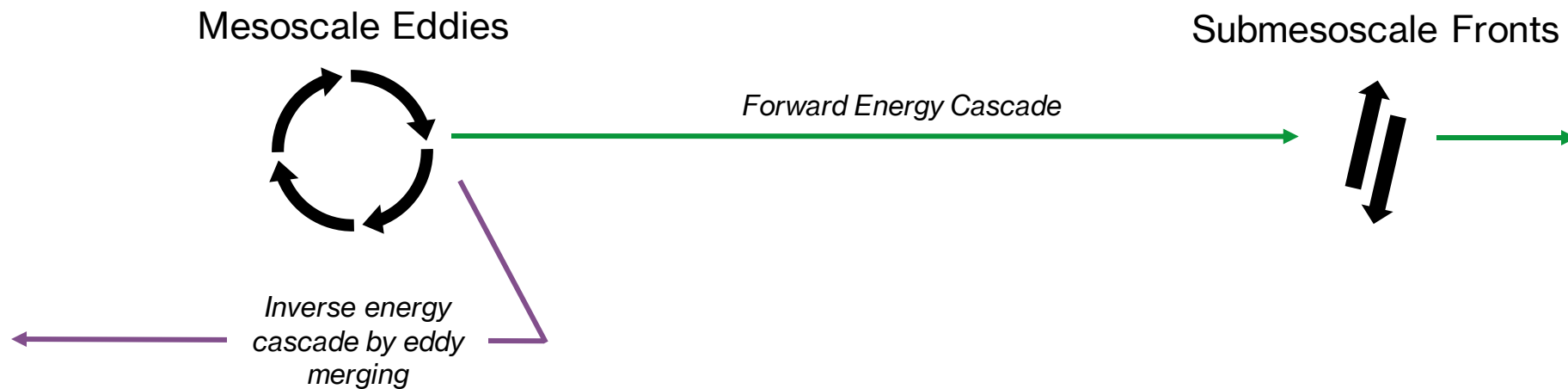


- radius 20 km - 200 km, several months lifetime
- tracking by SSH anomaly
- trap fluids and transport biogeochemical tracers
- interactions with wind stress or other eddies can induce strong vertical velocities
- displacement of isopycnals allows for fluxes into/out of euphotic zone and alters mixed layer depth

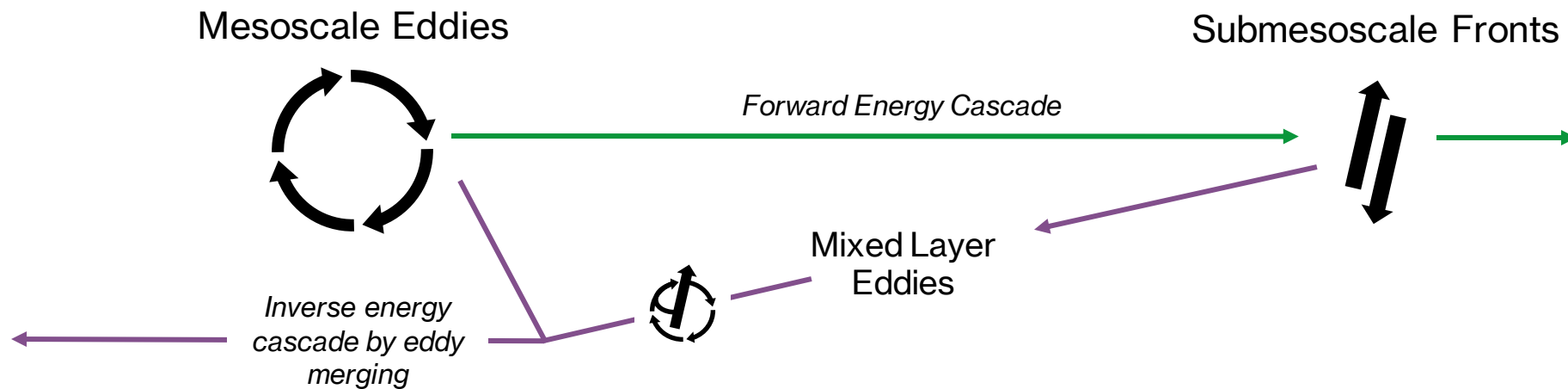
Mesoscale Eddies: Energy Cascade



Mesoscale Eddies: Energy Cascade



Mesoscale Eddies: Energy Cascade



Energy Cascade: Submesoscale Contribution

Schubert et al., 2020

- inverse energy cascade is fueled by eddies with radius down to 17 km

Our work

- eddies < 20 km much better resolved in HR model

Energy Cascade: Submesoscale Contribution

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Energy Cascade: Submesoscale Contribution

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Energy Cascade: Submesoscale Contribution

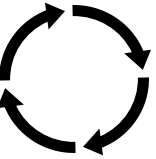
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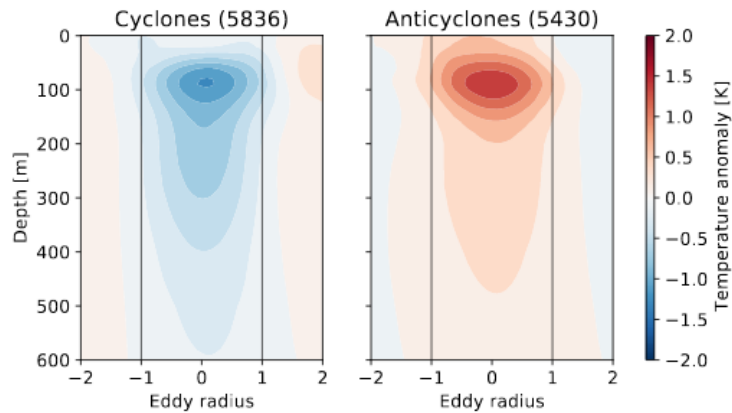
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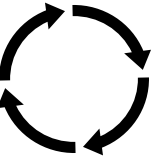
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Submesoscale fronts energize mesoscale eddies

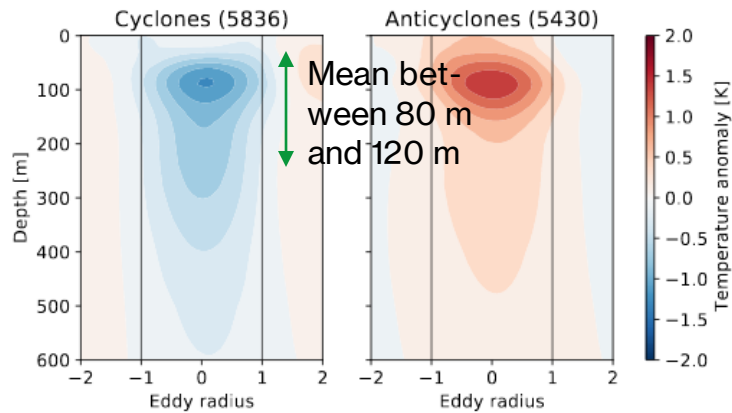


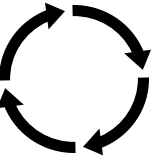
Mesoscale Eddies: Impact on Density Anomaly



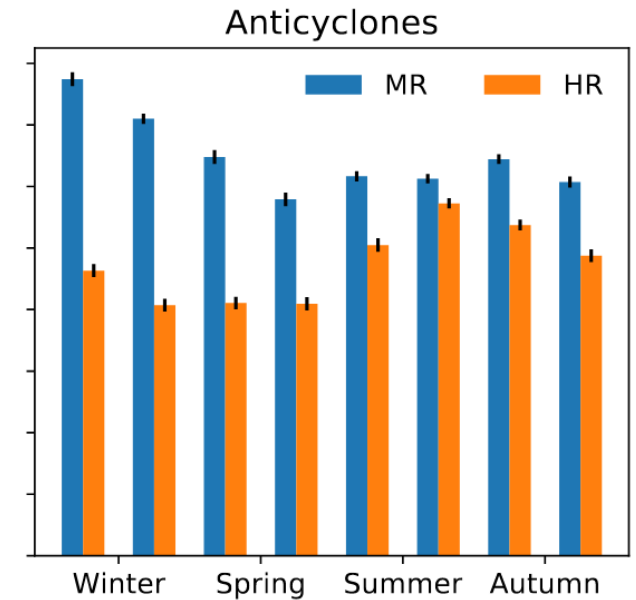
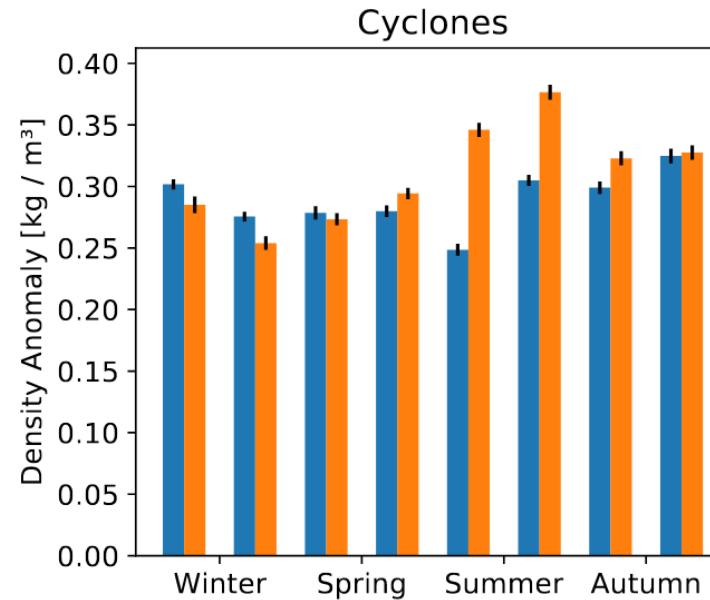
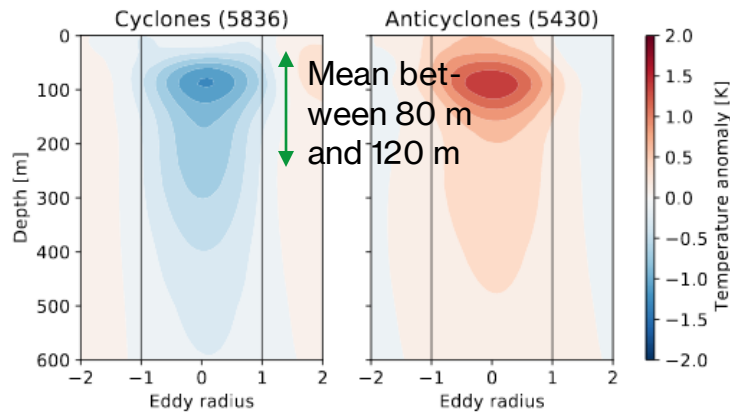


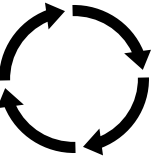
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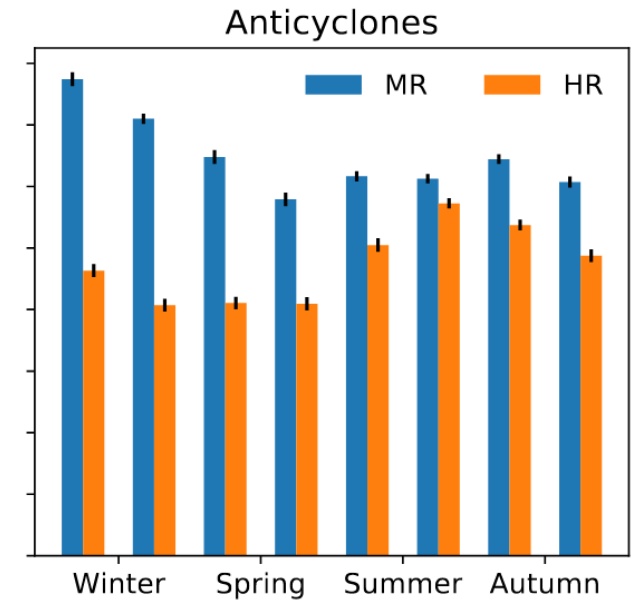
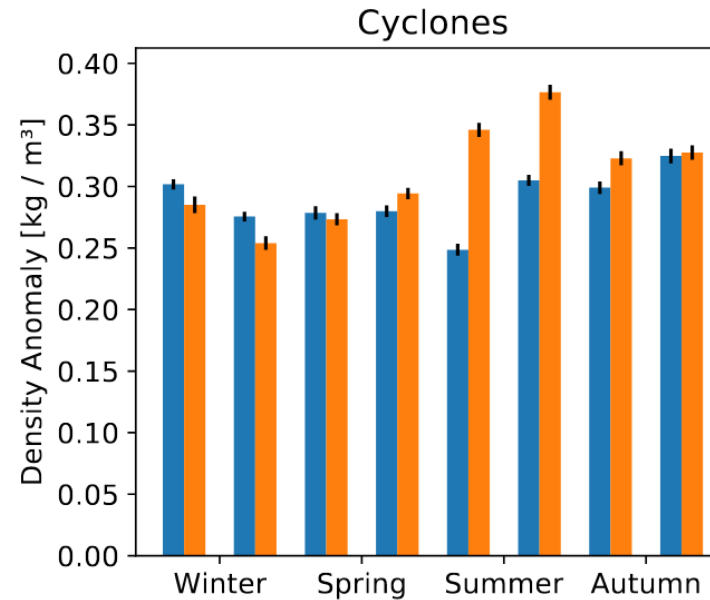
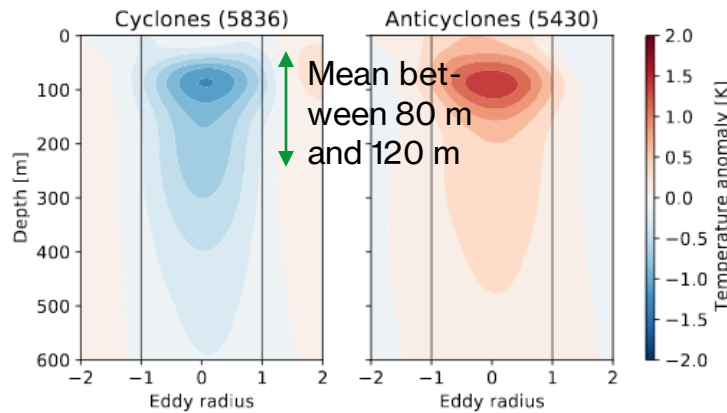


Mesoscale Eddies: Impact on Density Anomaly

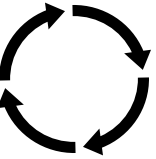




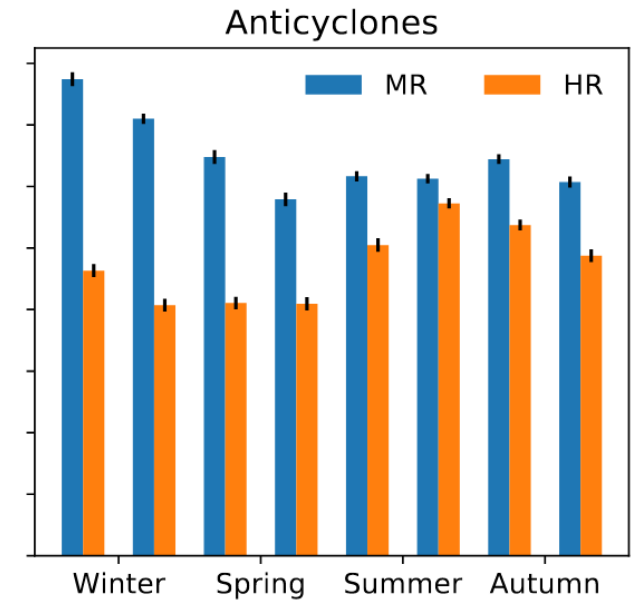
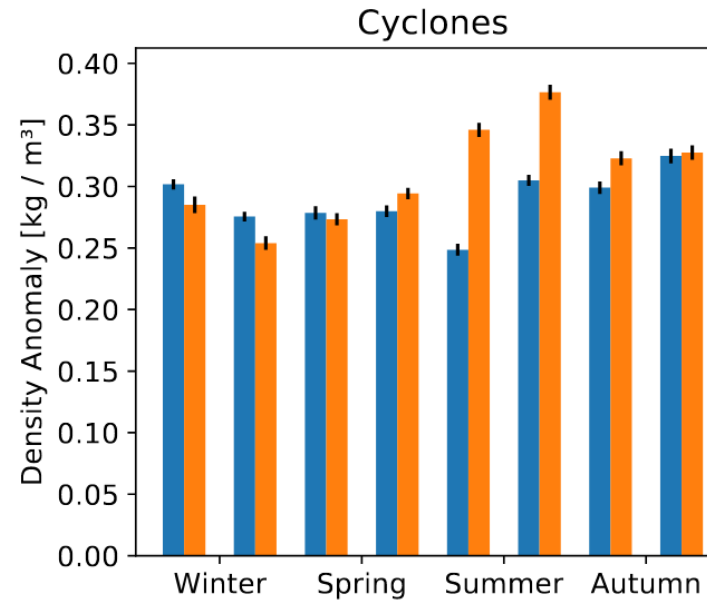
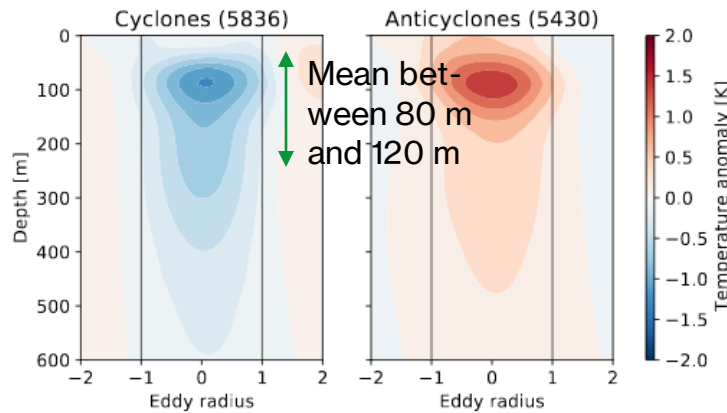
Mesoscale Eddies: Impact on Density Anomaly



- cyclones are only little affected

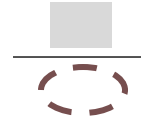
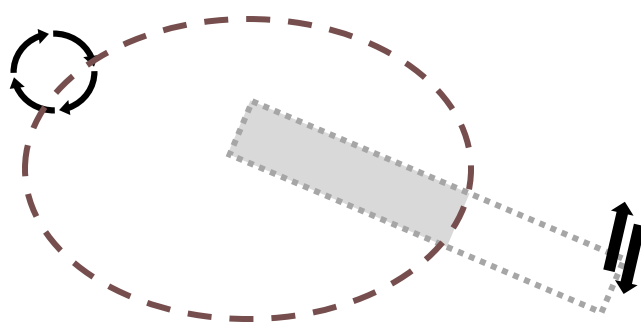
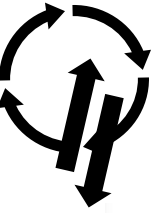


Mesoscale Eddies: Impact on Density Anomaly



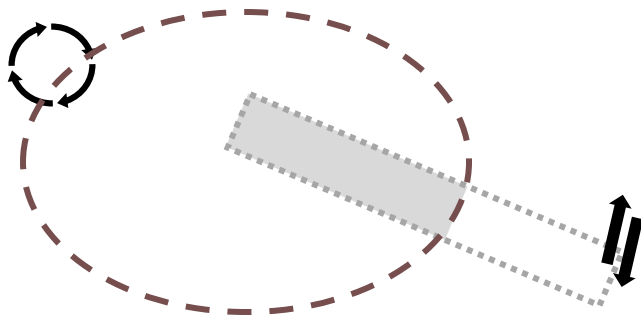
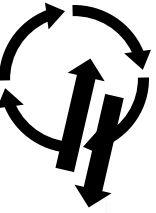
- cyclones are only little affected
- anticyclones are strongly damped during winter and spring by ~40 %


Mesoscale Eddies: Intersection with Fronts



Coverage of mesoscale eddies by submesoscale fronts
at 25 m depth from January to March

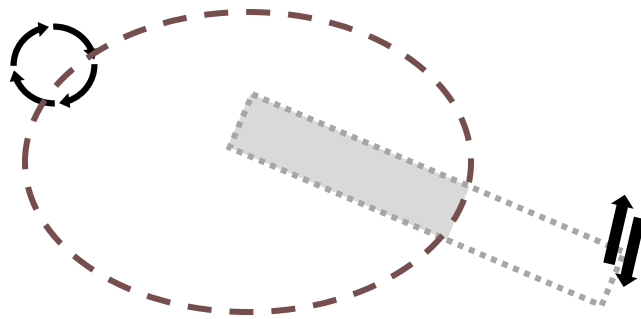
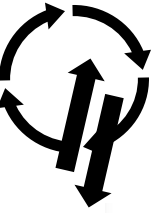
Mesoscale Eddies: Intersection with Fronts




 Coverage of mesoscale eddies by submesoscale fronts at 25 m depth from January to March

	Cyclones	Anticyclones
MR	7.0 %	11.7 %
HR	8.3 %	20.0 %

Mesoscale Eddies: Intersection with Fronts

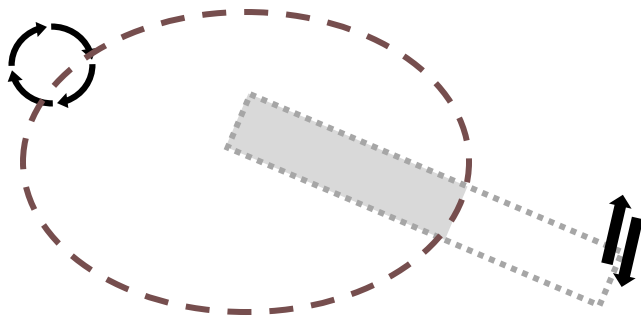
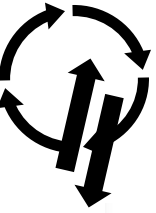



 Coverage of mesoscale eddies by submesoscale fronts at 25 m depth from January to March

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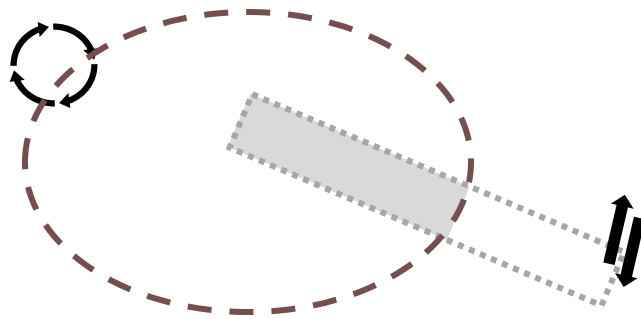
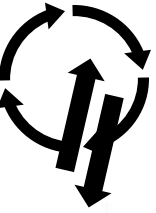



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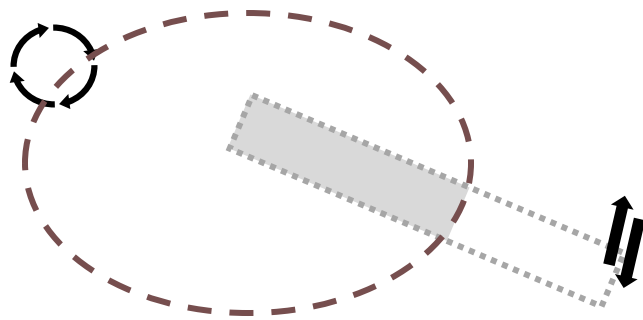
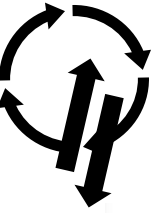


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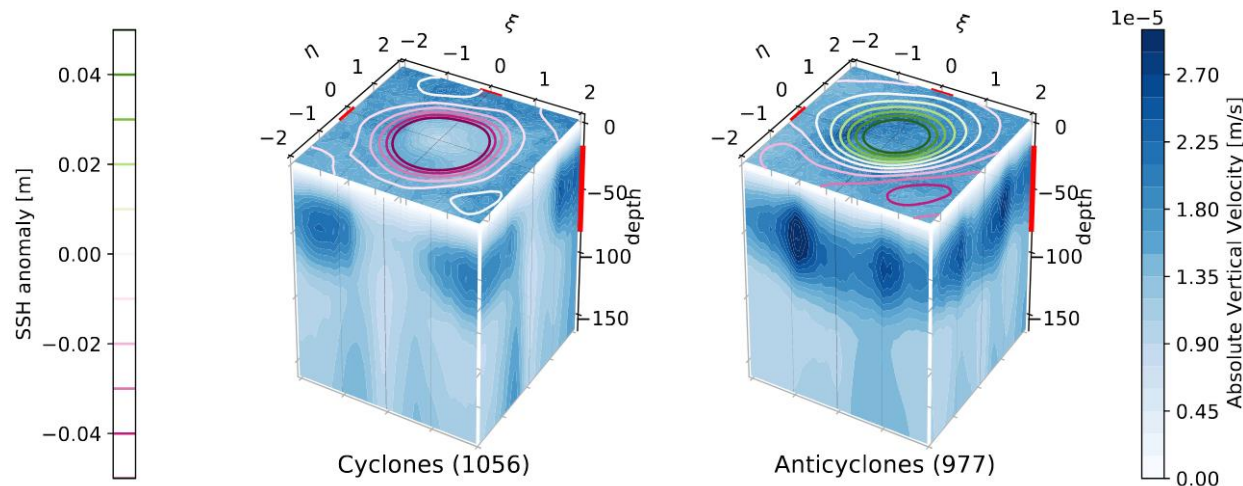
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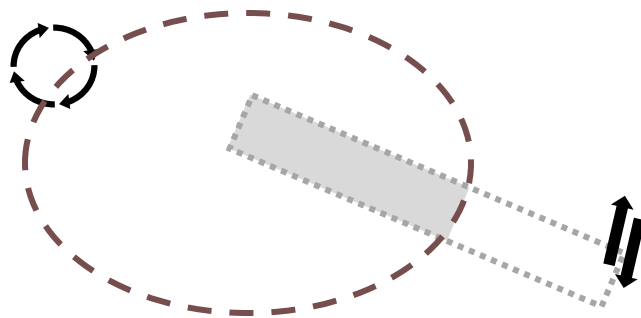
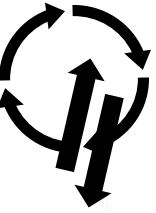
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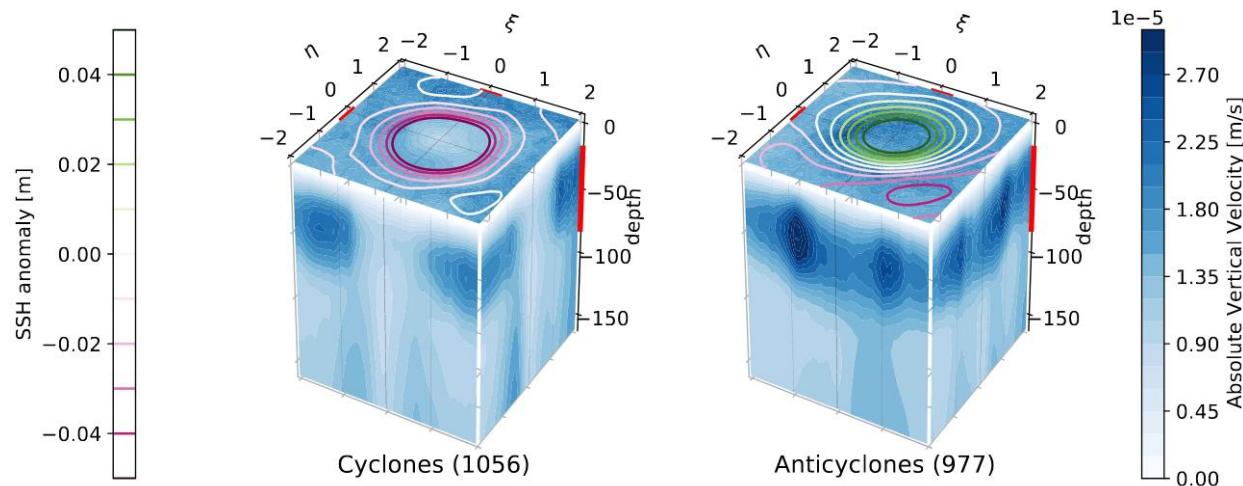
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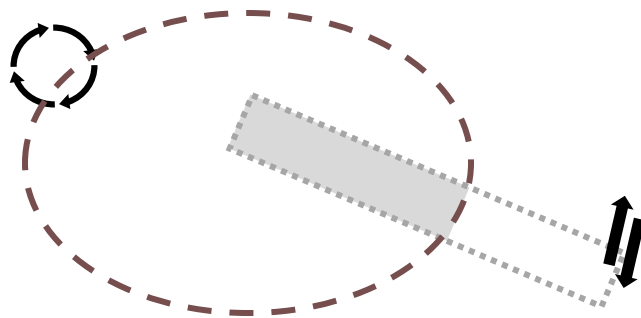
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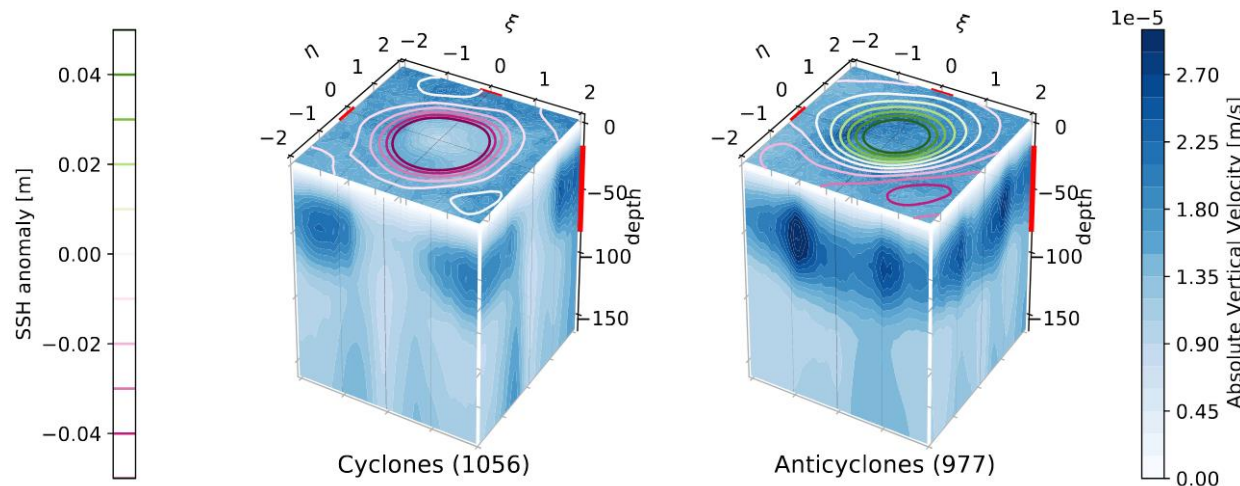
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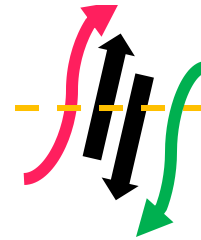
(Thomas et al., 2013; Brannigan et al., 2017; Su et al., 2018; Klein et al., 2019)



Biological Productivity

Submesoscale Impacts on Biological Productivity

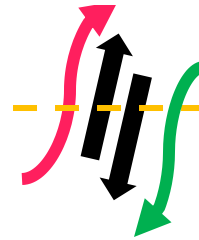
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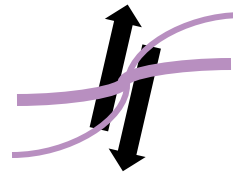
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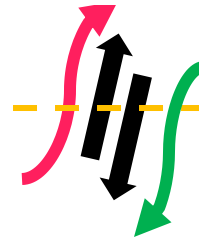
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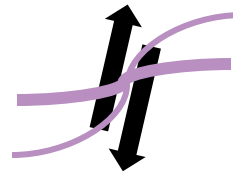
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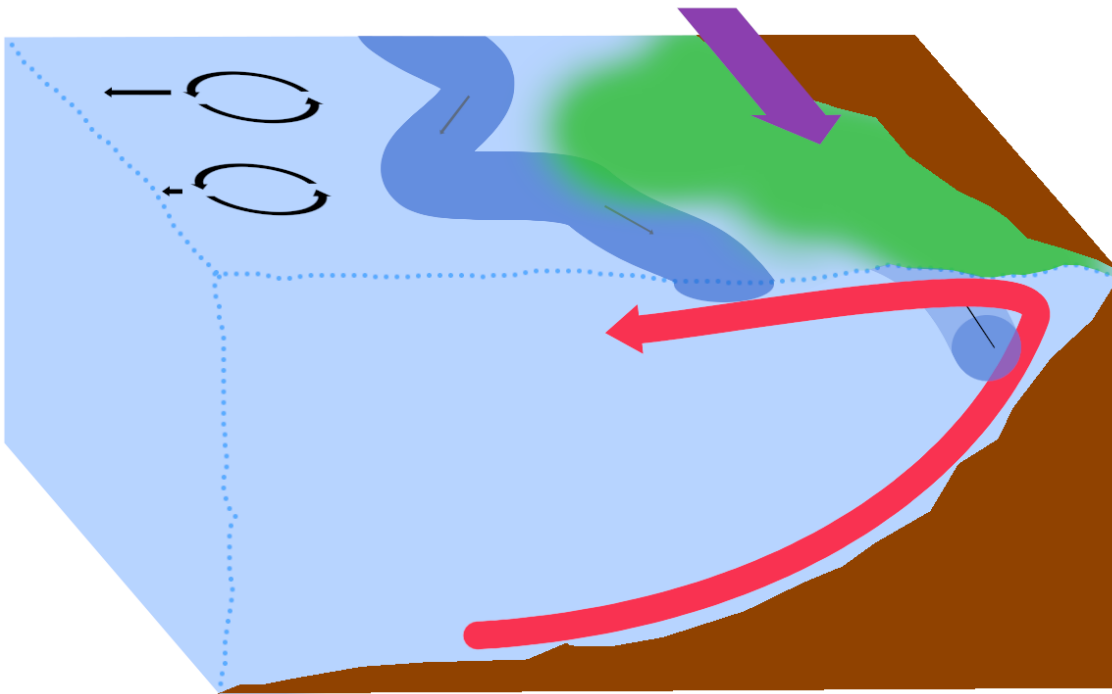
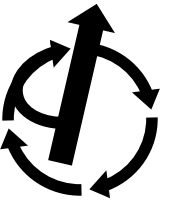


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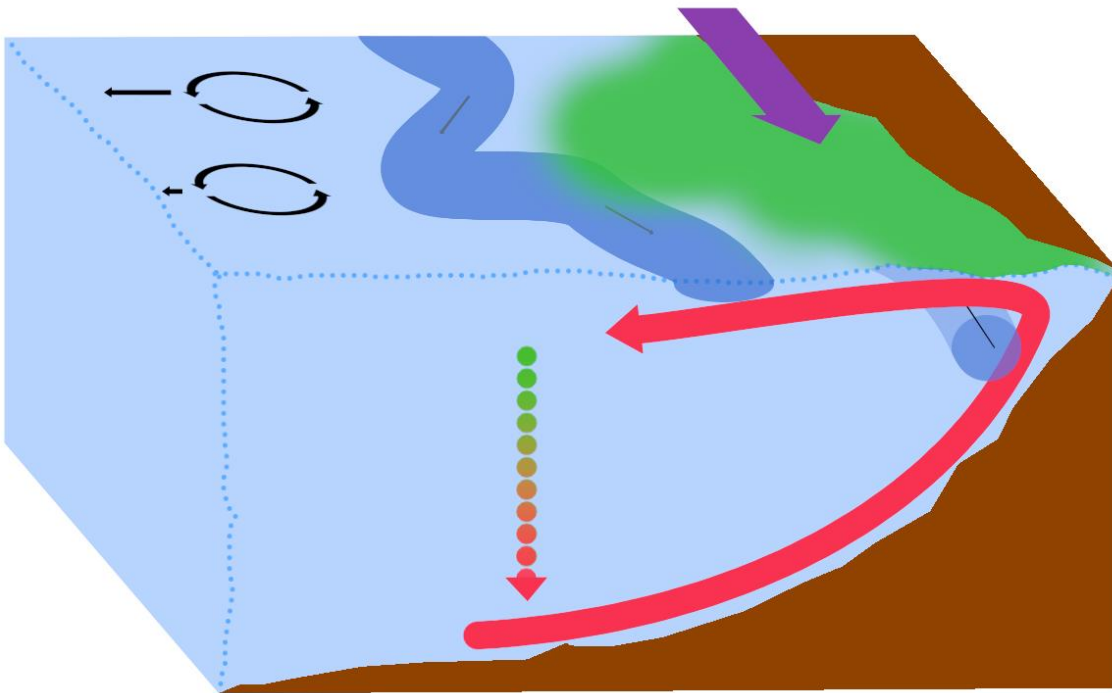
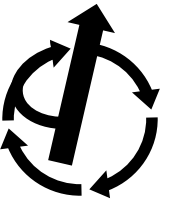


e.g. eddy quenching

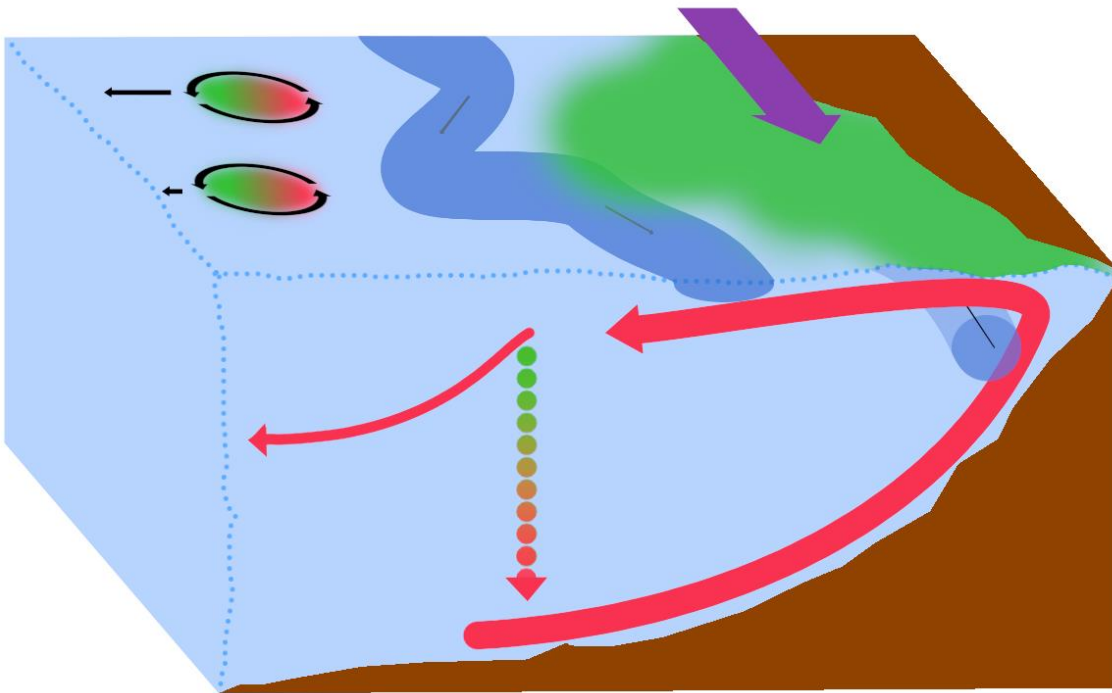
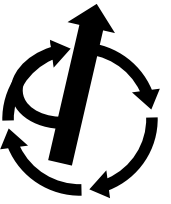
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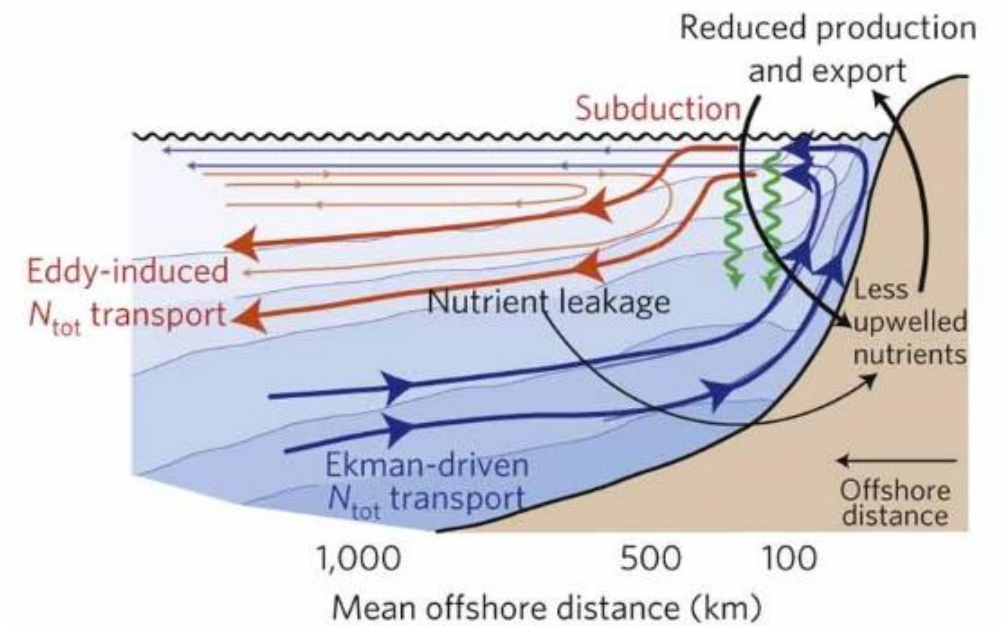
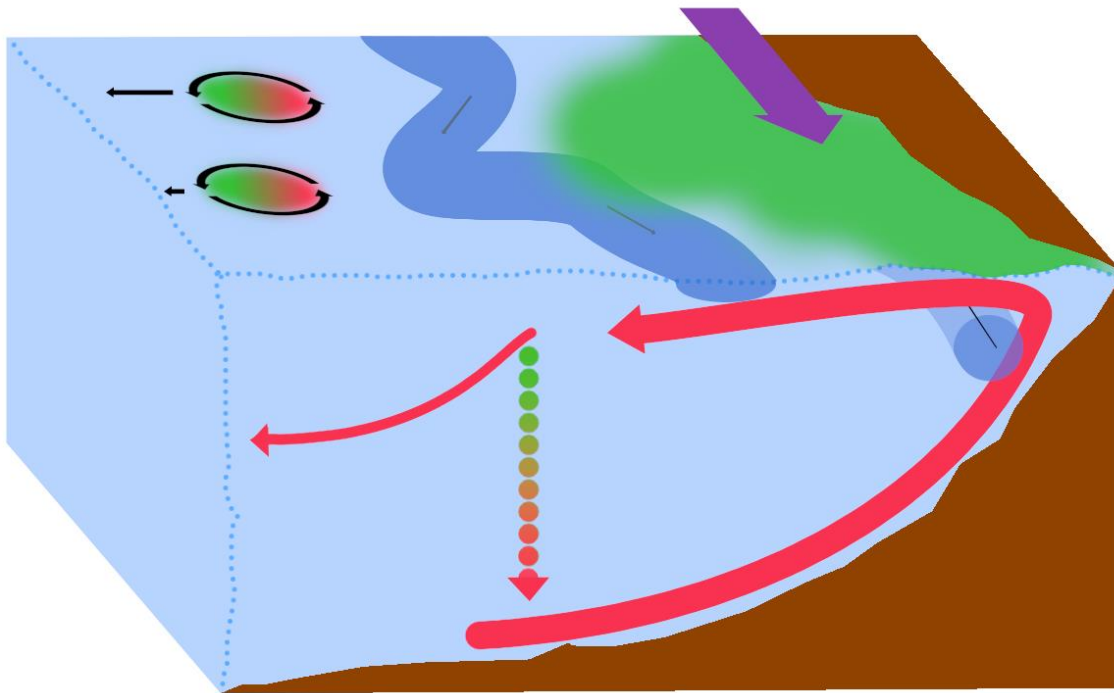
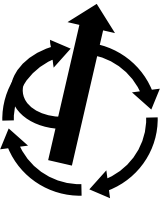
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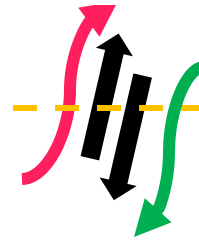
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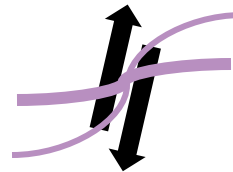
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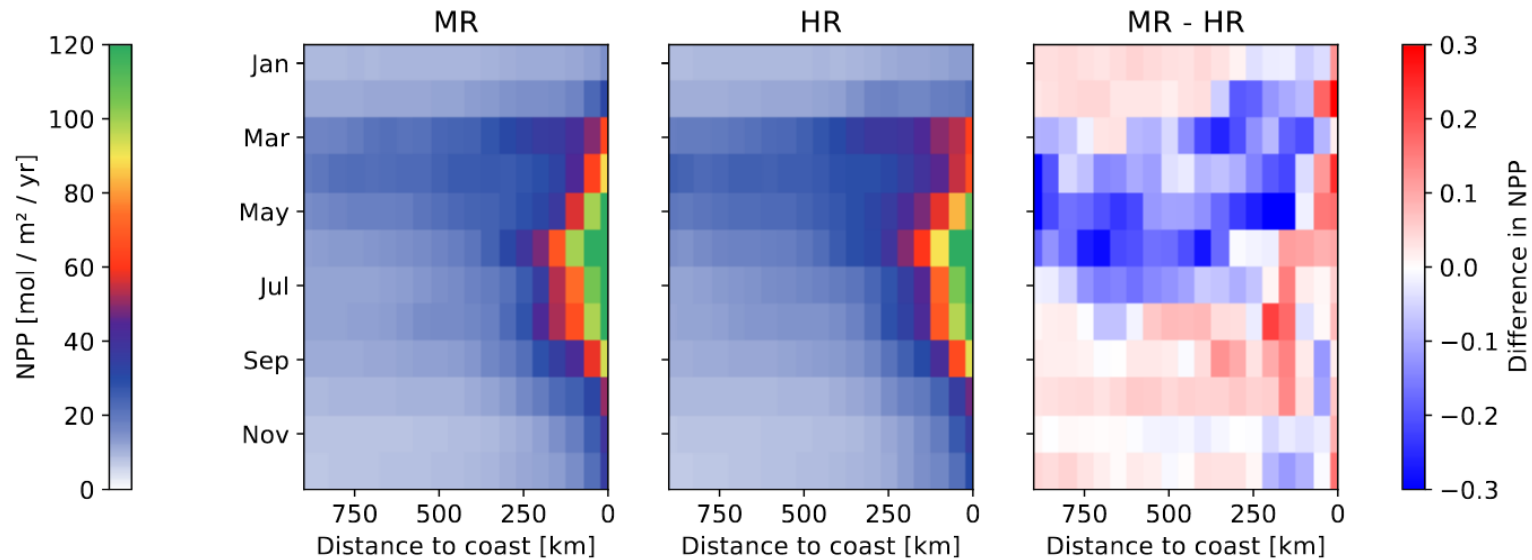


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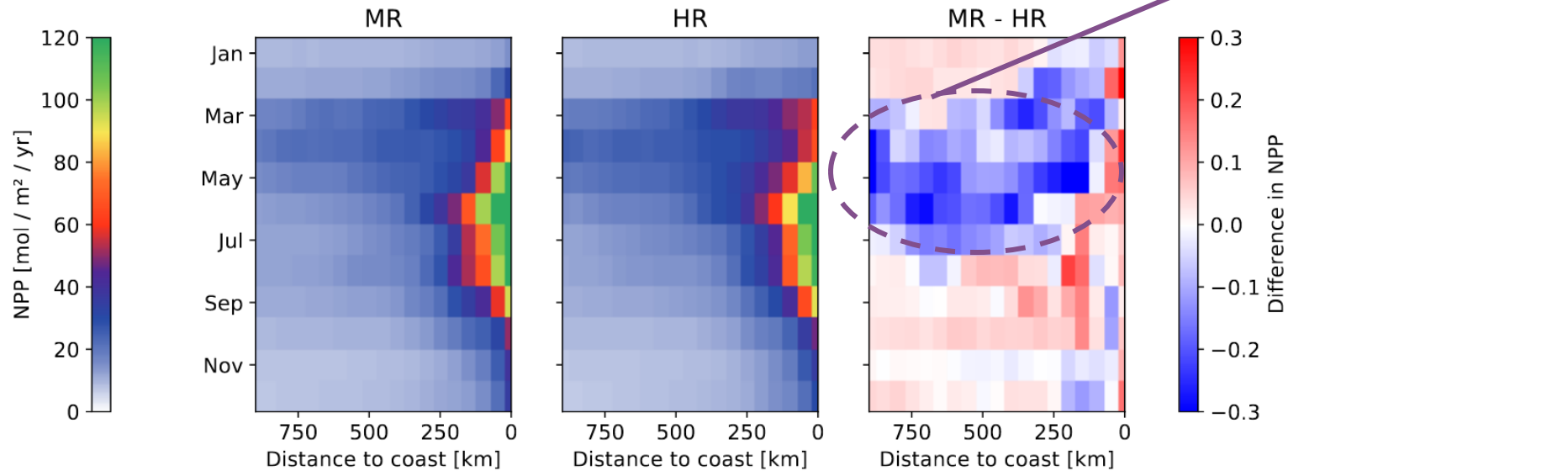


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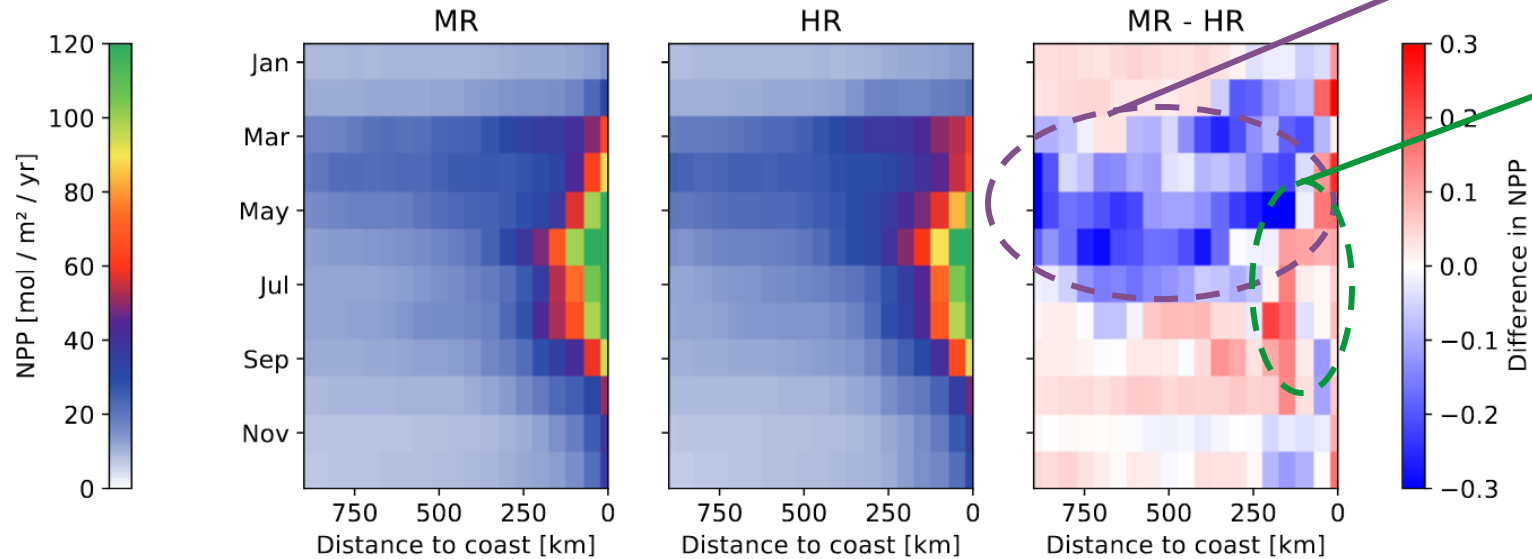
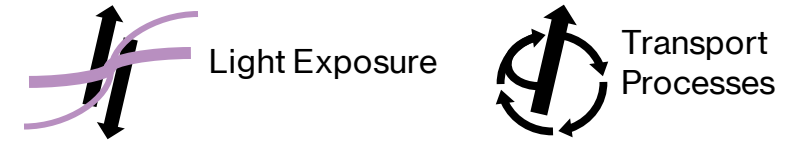
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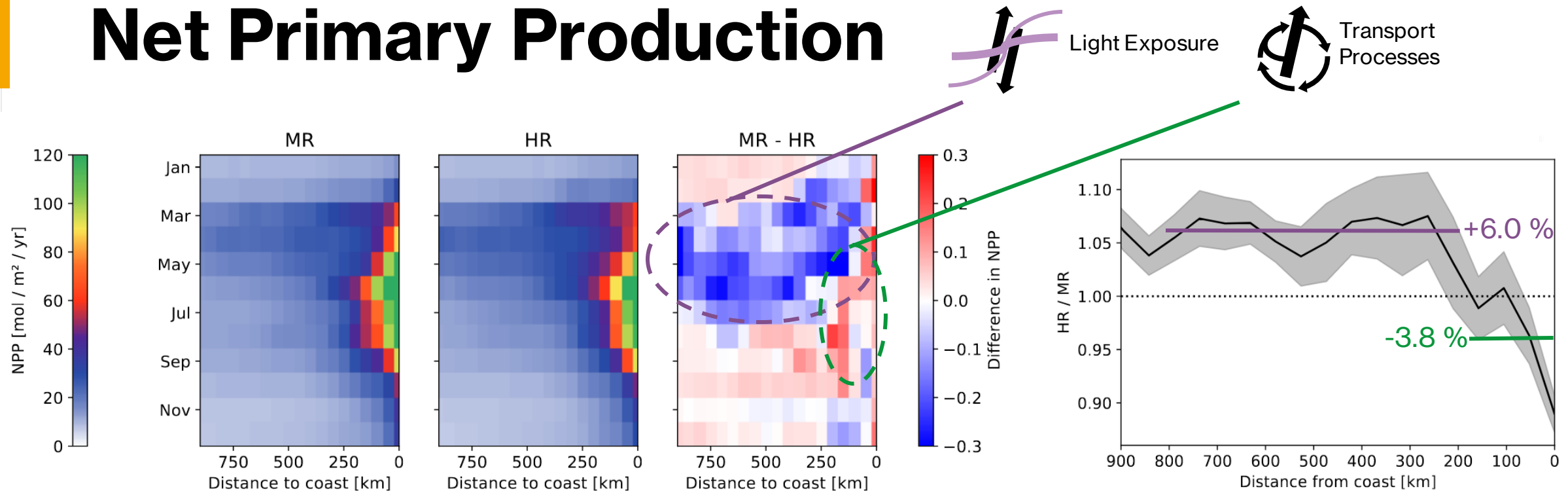
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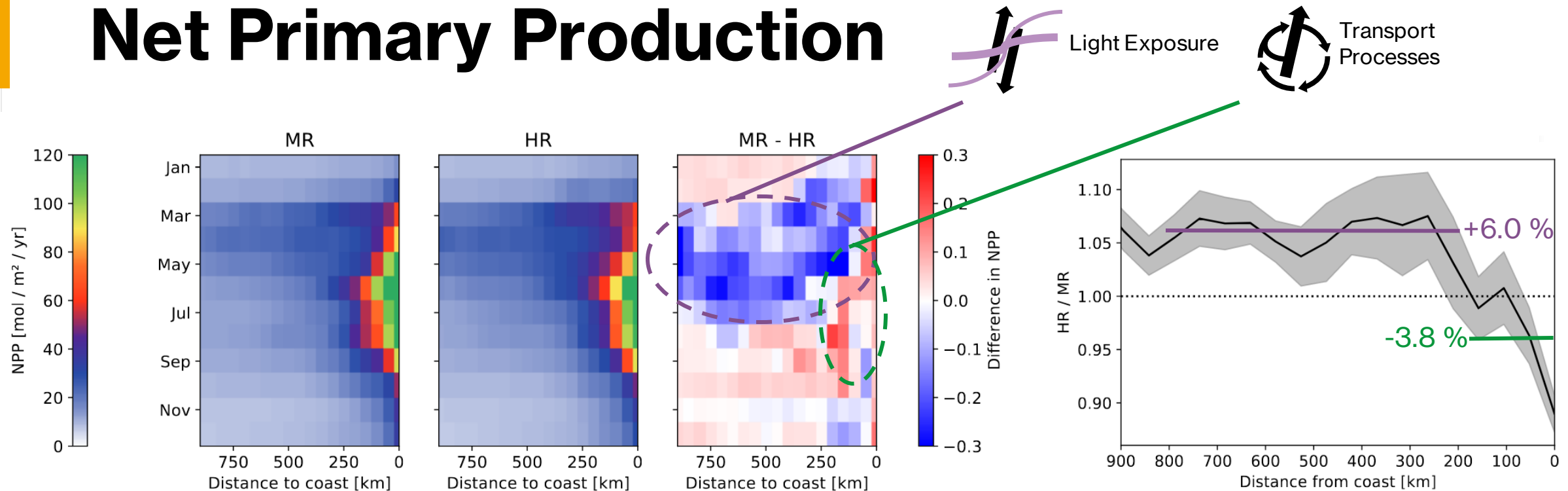
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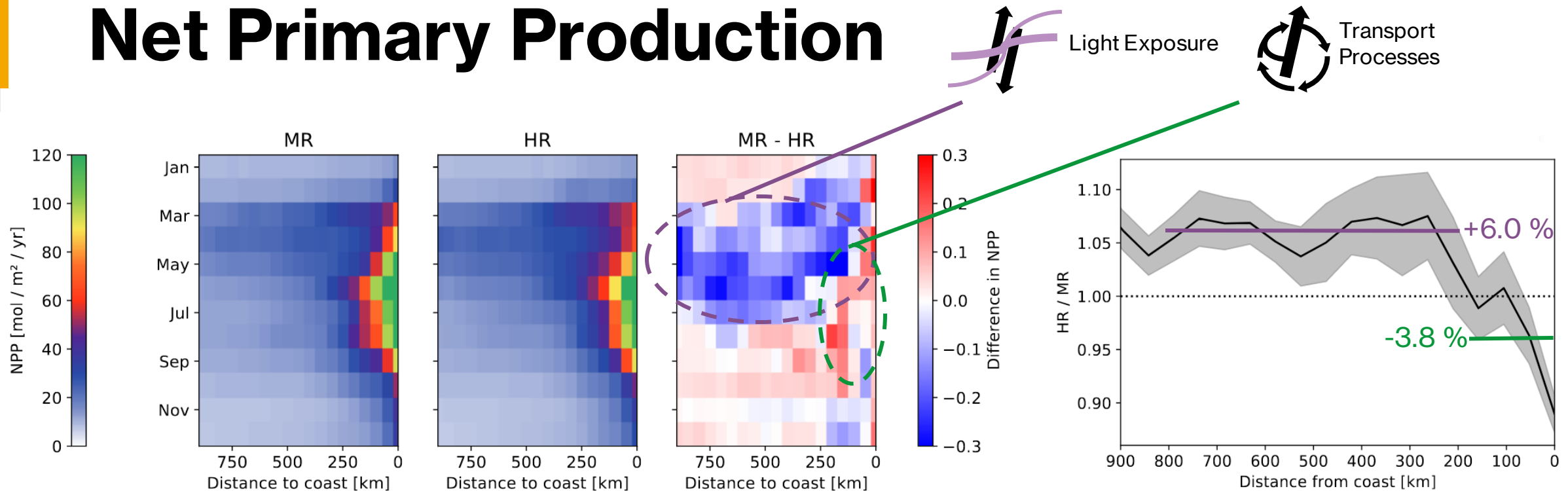
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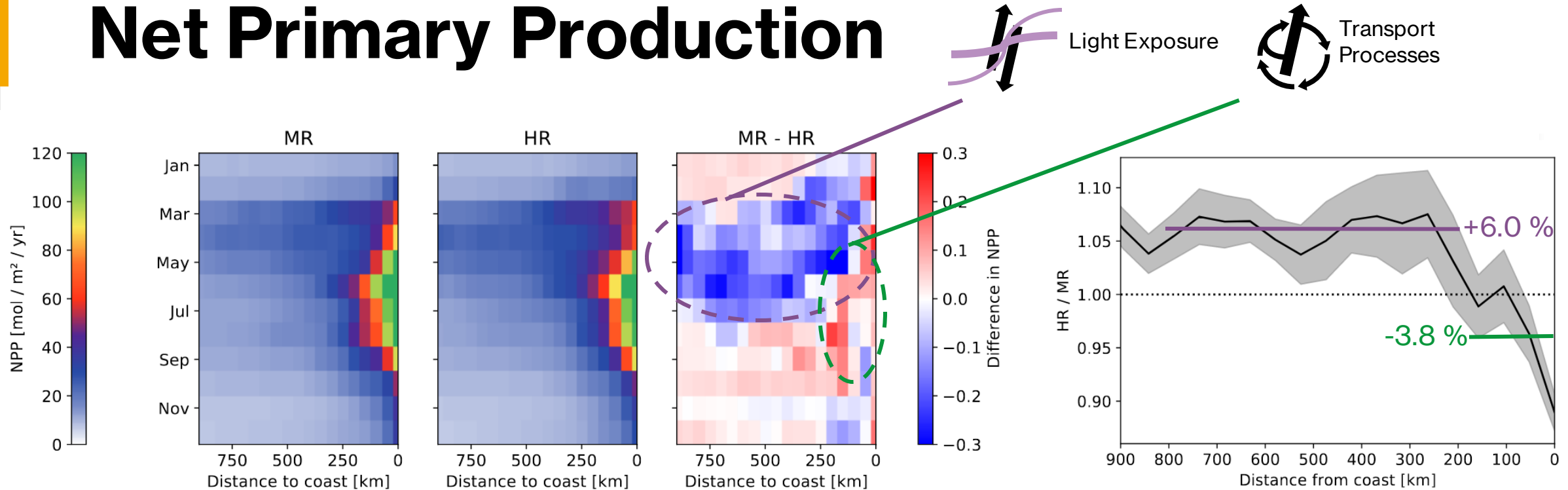


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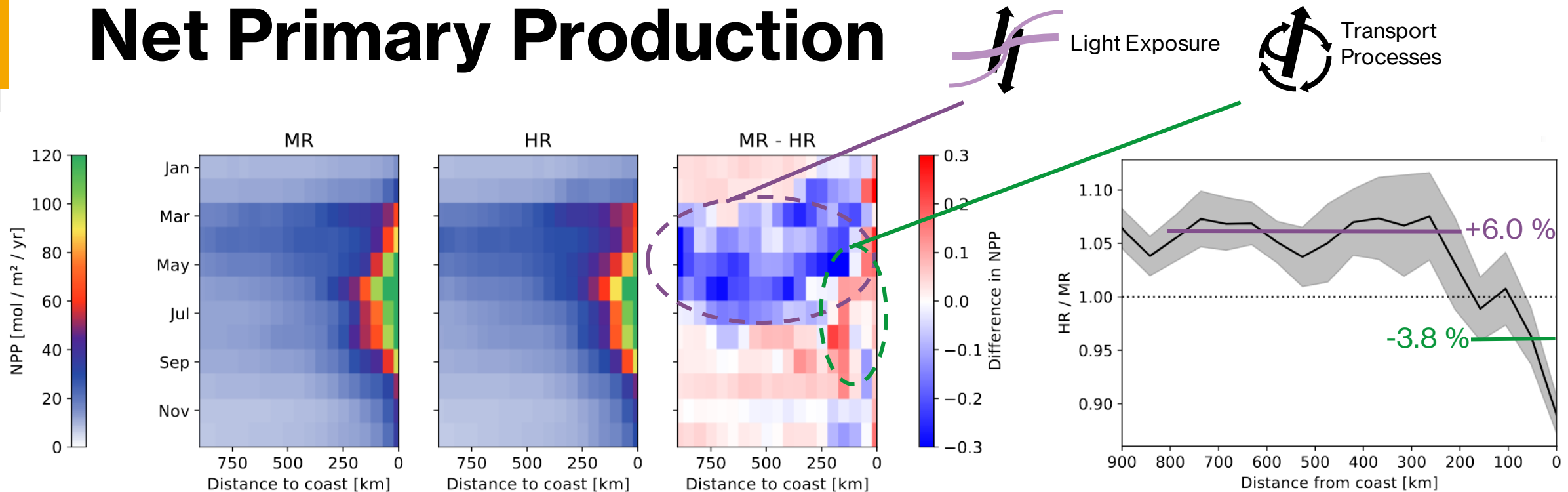
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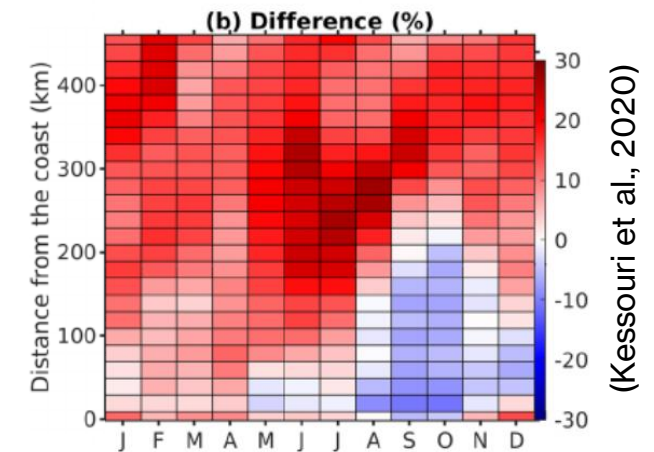


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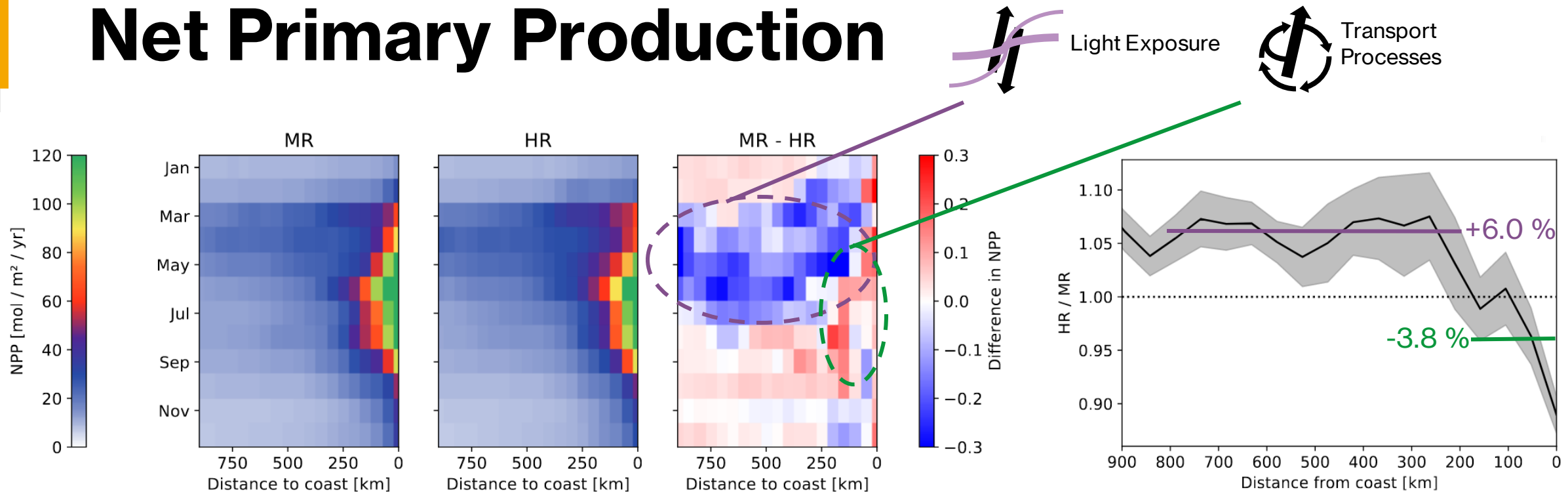


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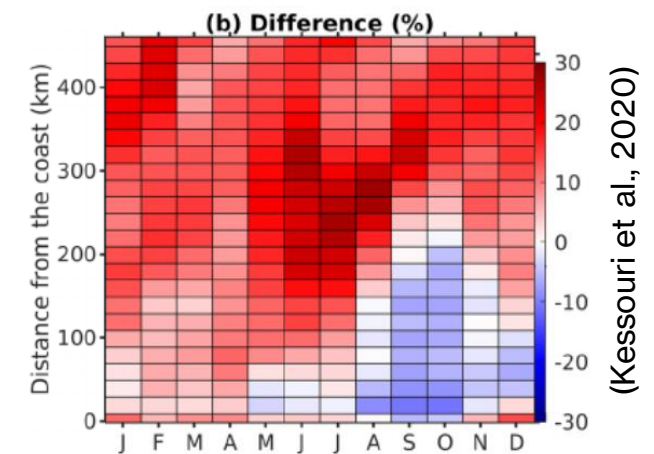
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Resolving submesoscale motions broadens the productive band



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Thesis and source code:

<https://github.com/max-simon/master-thesis>

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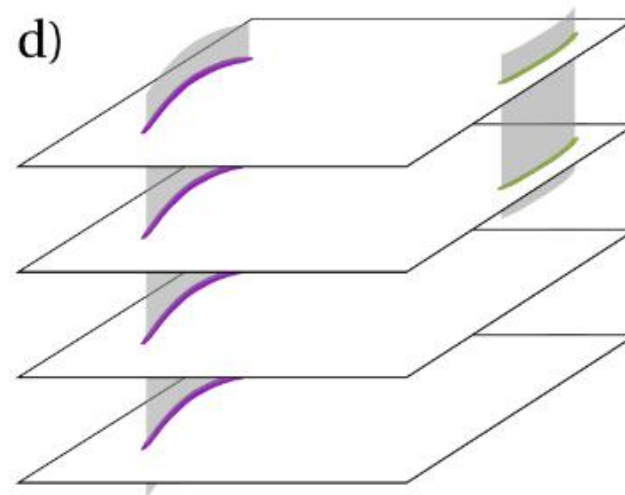
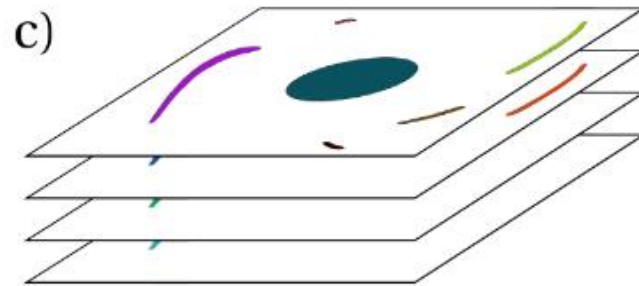
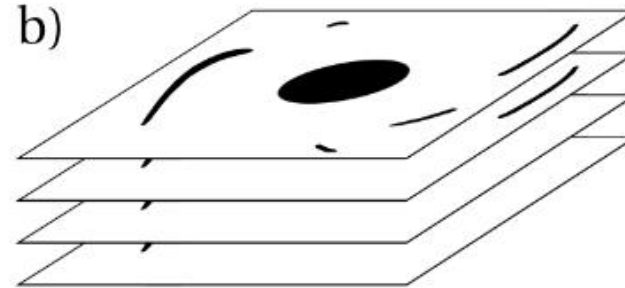
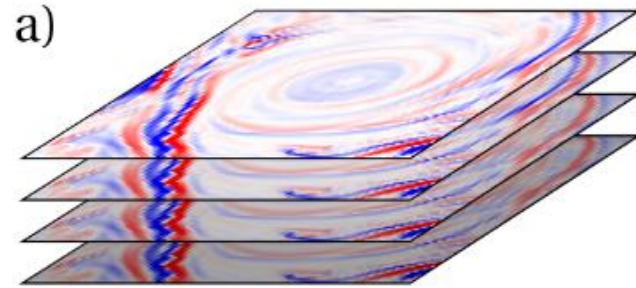
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Submesoscale Fronts: Detection Algorithm



1. Calculate an adaptive threshold for every depth level (Gaussian filter, average). Threshold vertical velocities.
2. Perform 2D connected component on every depth level, filter out noise and too circular structures.
3. Perform 3D connected component, filter out too shallow fronts.