



Pêches et Océans  
Canada

Fisheries and Oceans  
Canada

# Are Canadian Pacific groundfishes shifting their distribution in response to local climate velocities?

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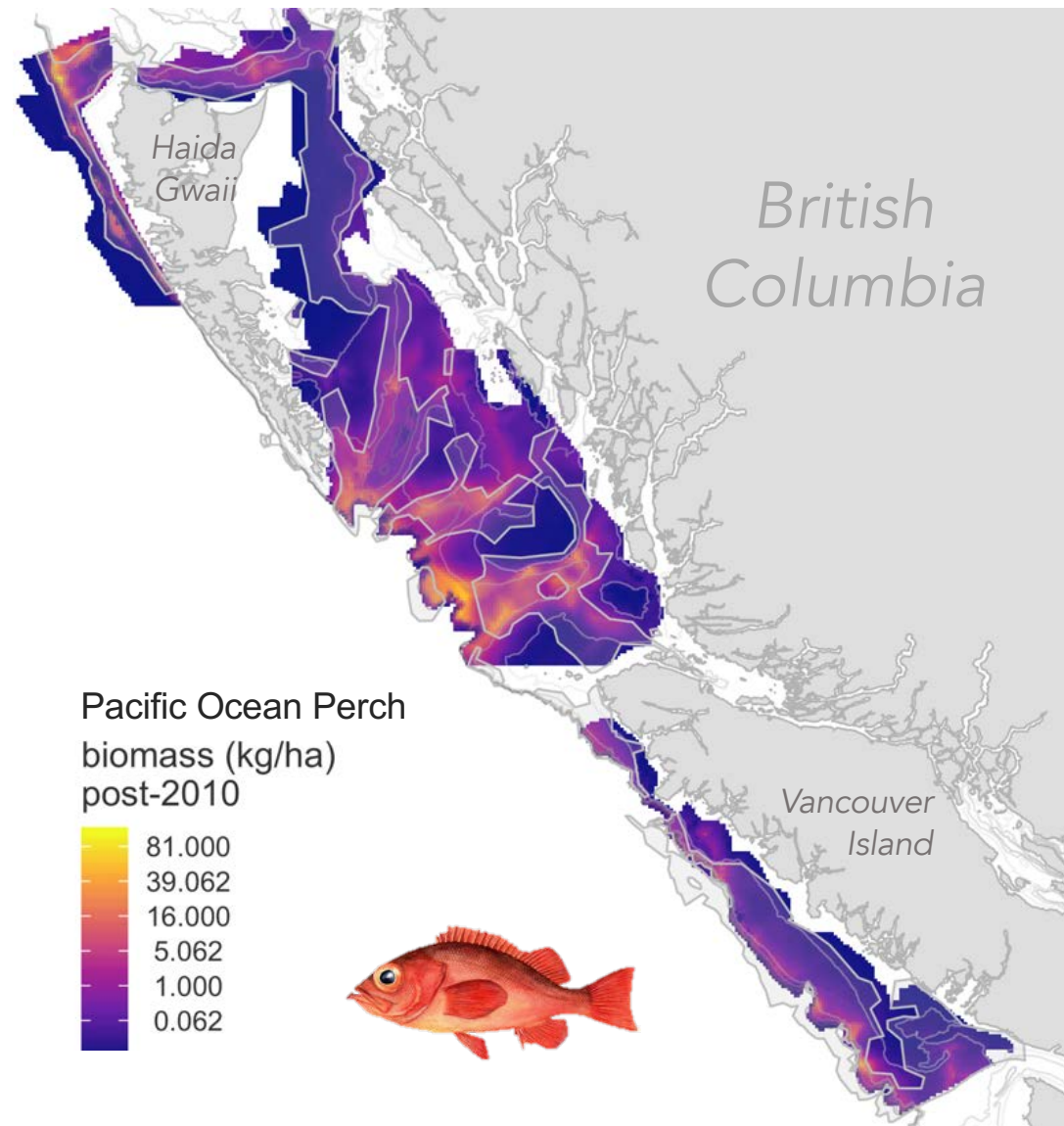
<sup>2</sup>National Oceanographic and Atmospheric Administration



# Trawl survey data

- biennial coverage of Canada's Pacific waters
  - commercial trawl footprint overlaid (in grey)
- random depth-stratified
- size, age, sex for all species caught

*species' biomass estimated using a Tweedie distribution in the R package*  
[github.com/pbs-assess/sdmTMB](https://github.com/pbs-assess/sdmTMB)



# Time scale of climate

Survey sensor-based models →

(conditions at time of survey)

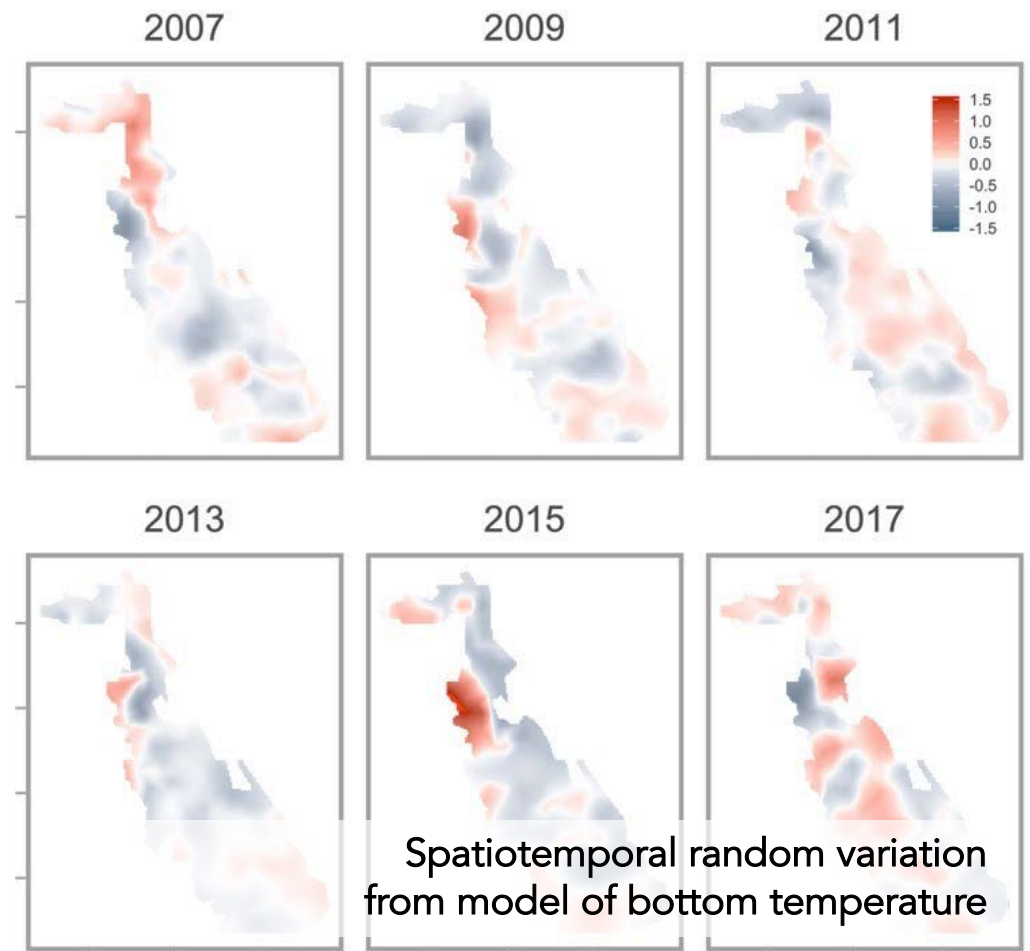
➤ movement & short-term settlement

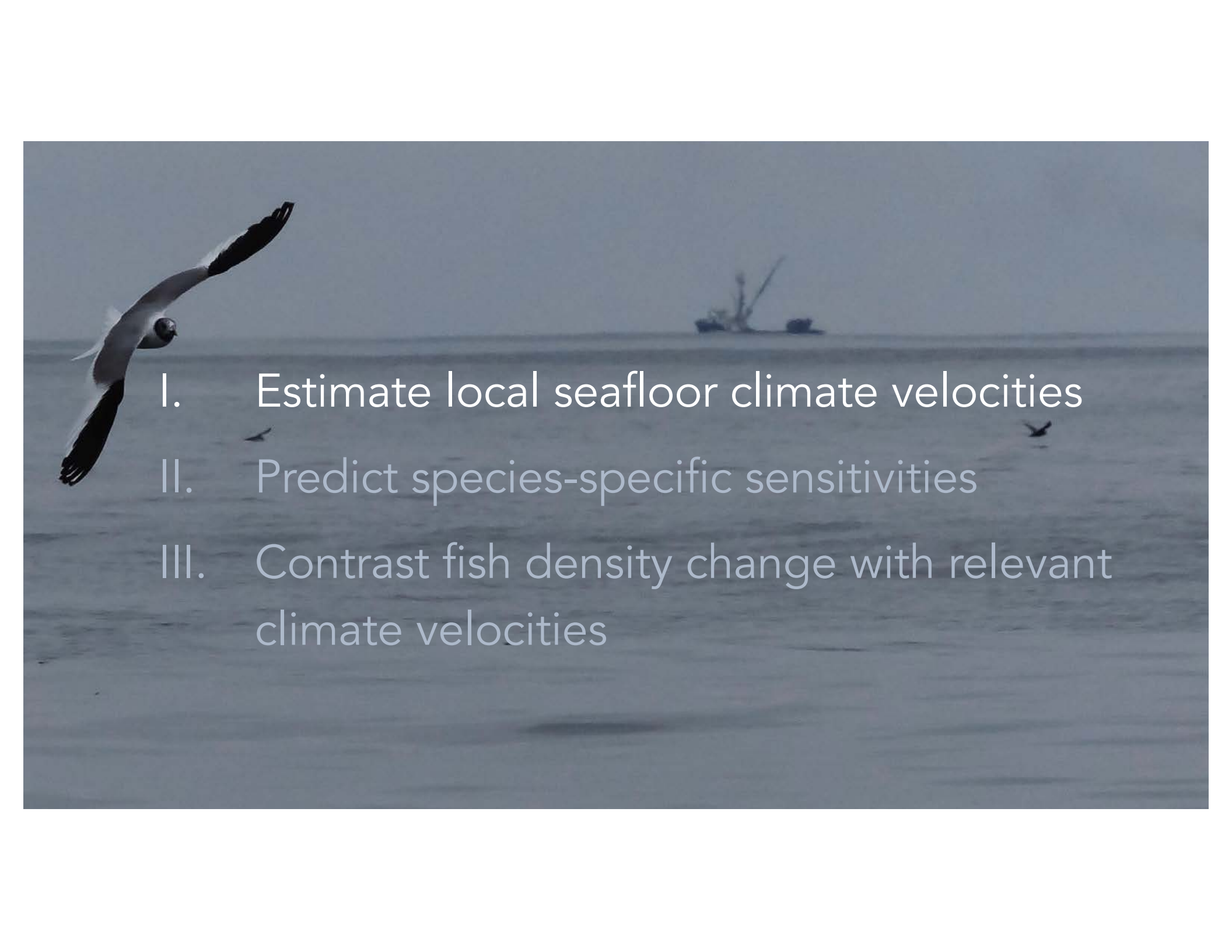
Long-term historical

(seasonal & interannual variability)

➤ survival & productivity

Future projections



- 
- I. Estimate local seafloor climate velocities
  - II. Predict species-specific sensitivities
  - III. Contrast fish density change with relevant climate velocities

# Local climate velocity

- speed and direction an organism would need to move to maintain current climate conditions

Low velocity



Little temporal change

OR

Change occurring in a heterogenous environment

Higher velocity



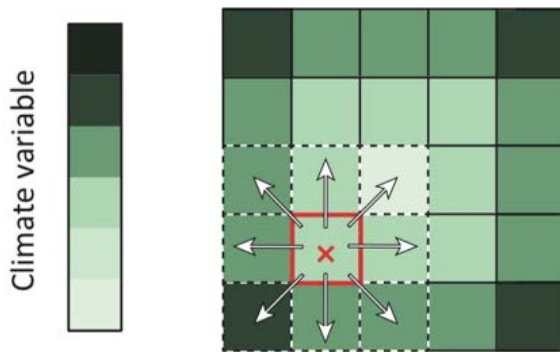
Larger change



OR

Change occurring in spatially homogenous environment

## Spatial gradient (Loarie et al. 2009)

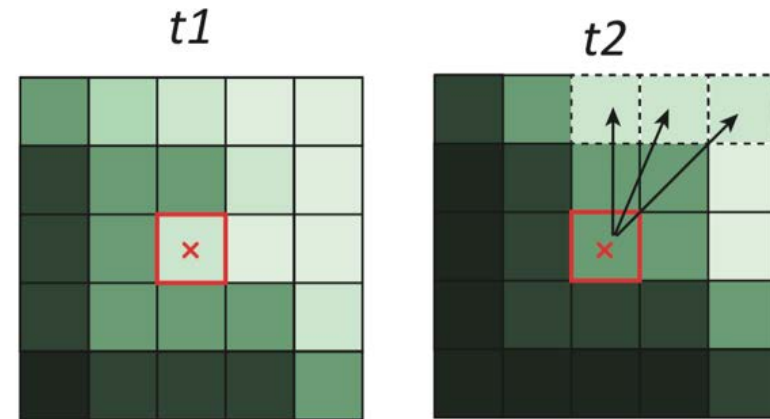
$$\frac{\text{Temporal}}{\text{Spatial}} = \frac{\text{Slope } (^{\circ}\text{C year}^{-1})}{\text{Spatial gradient } (^{\circ}\text{C km}^{-1})} = \text{km year}^{-1}$$





 Focal cell  
 3x3 Neighborhood of cells

## Analog-distance (e.g. Hamann et al. 2015)

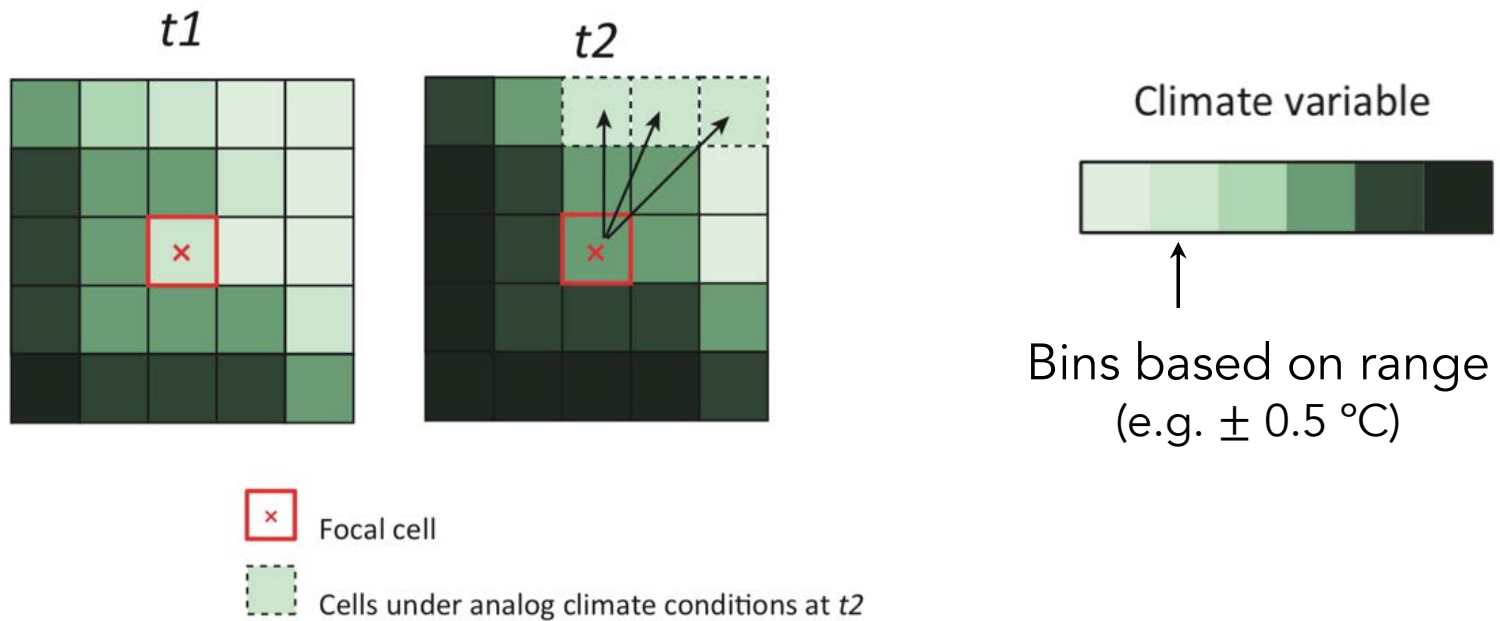
$$\frac{\text{Distance between climate analog (km)}}{\Delta \text{ Time year(s)}} = \text{km year}^{-1}$$



 Focal cell  
 Cells under analog climate conditions at t2

(Brito-Morales et al. 2018 in Trends in Ecol & Evol)

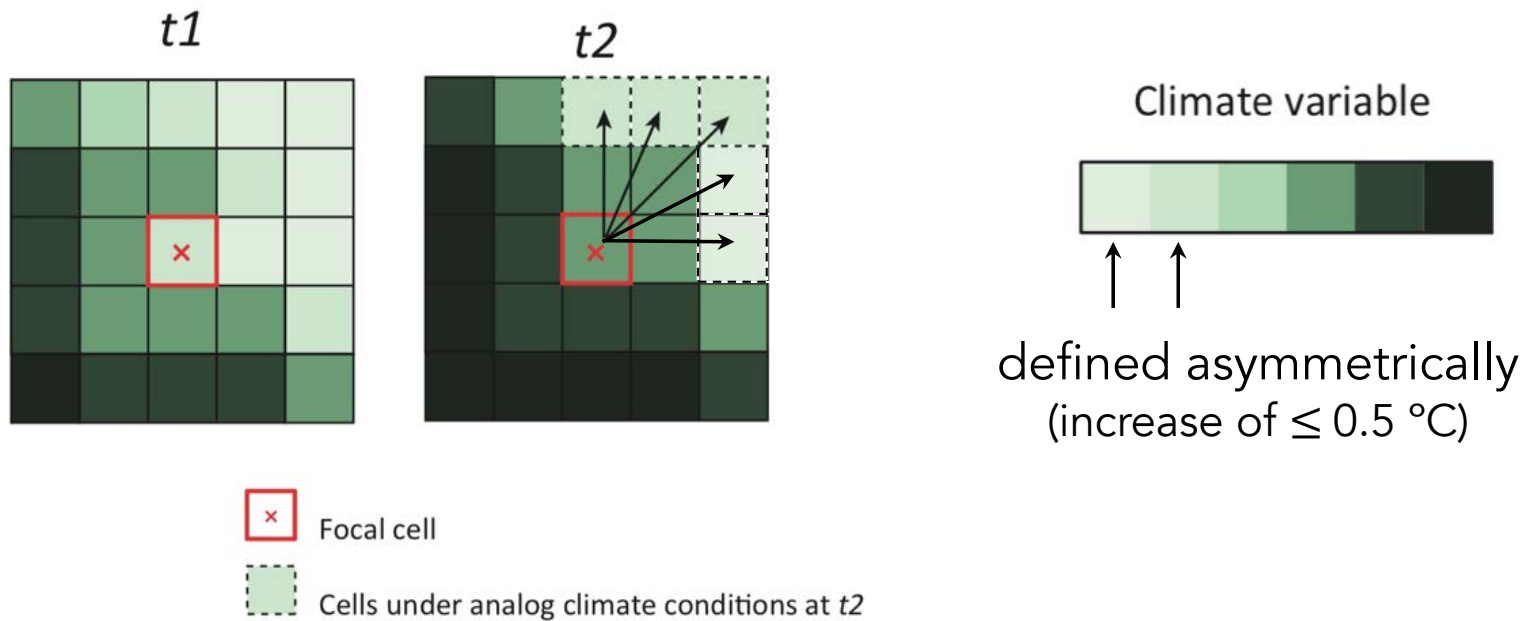
# Defining analogous climate: choose a threshold



Range can be subjectively chosen or derived from past climate variability.



# Defining analogous climate: *asymmetrical* threshold



Still must choose a maximum threshold that defines "analogous" climate.


2014-2016

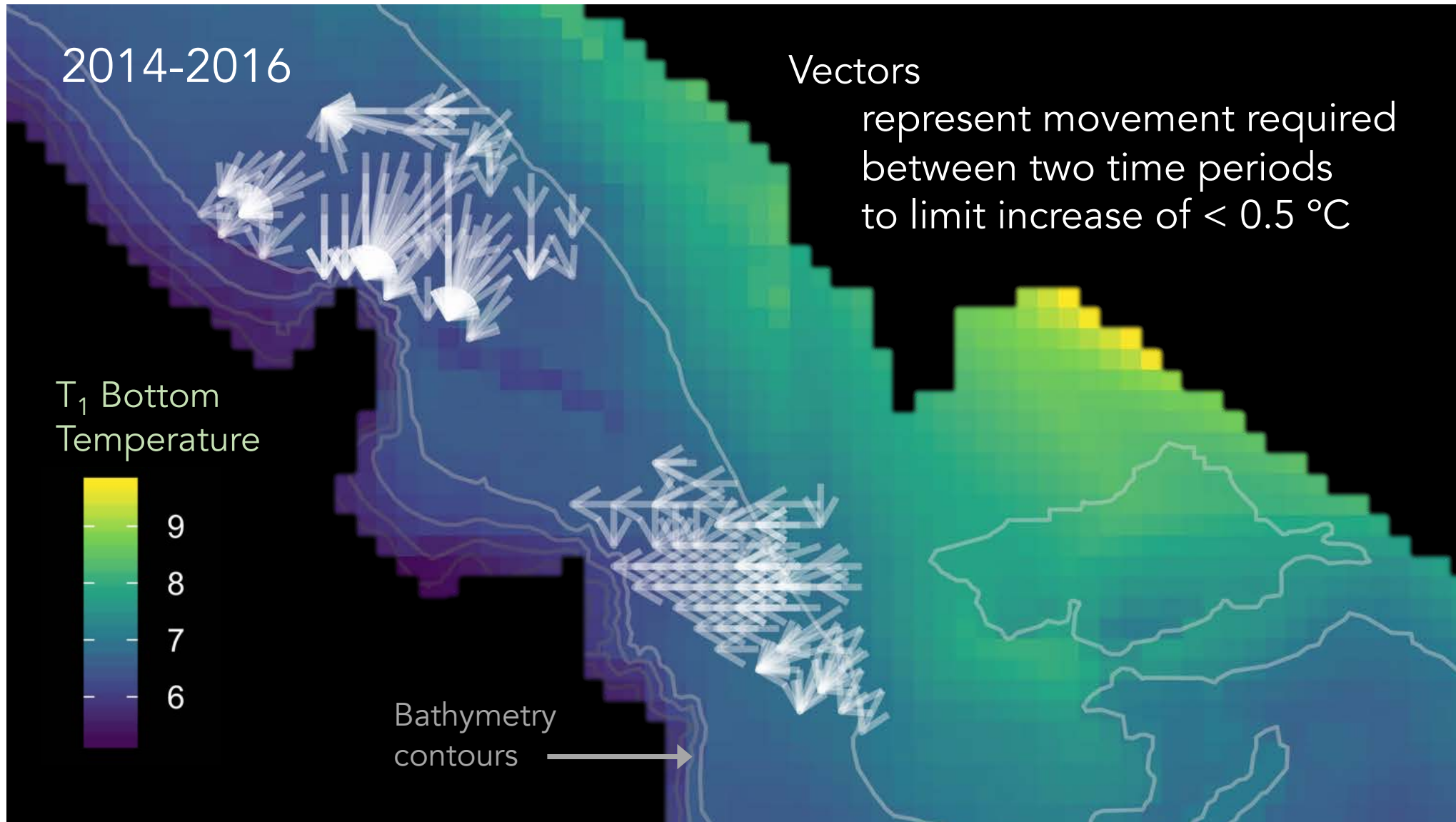
Vectors

represent movement required  
between two time periods  
to limit increase of  $< 0.5\text{ }^{\circ}\text{C}$

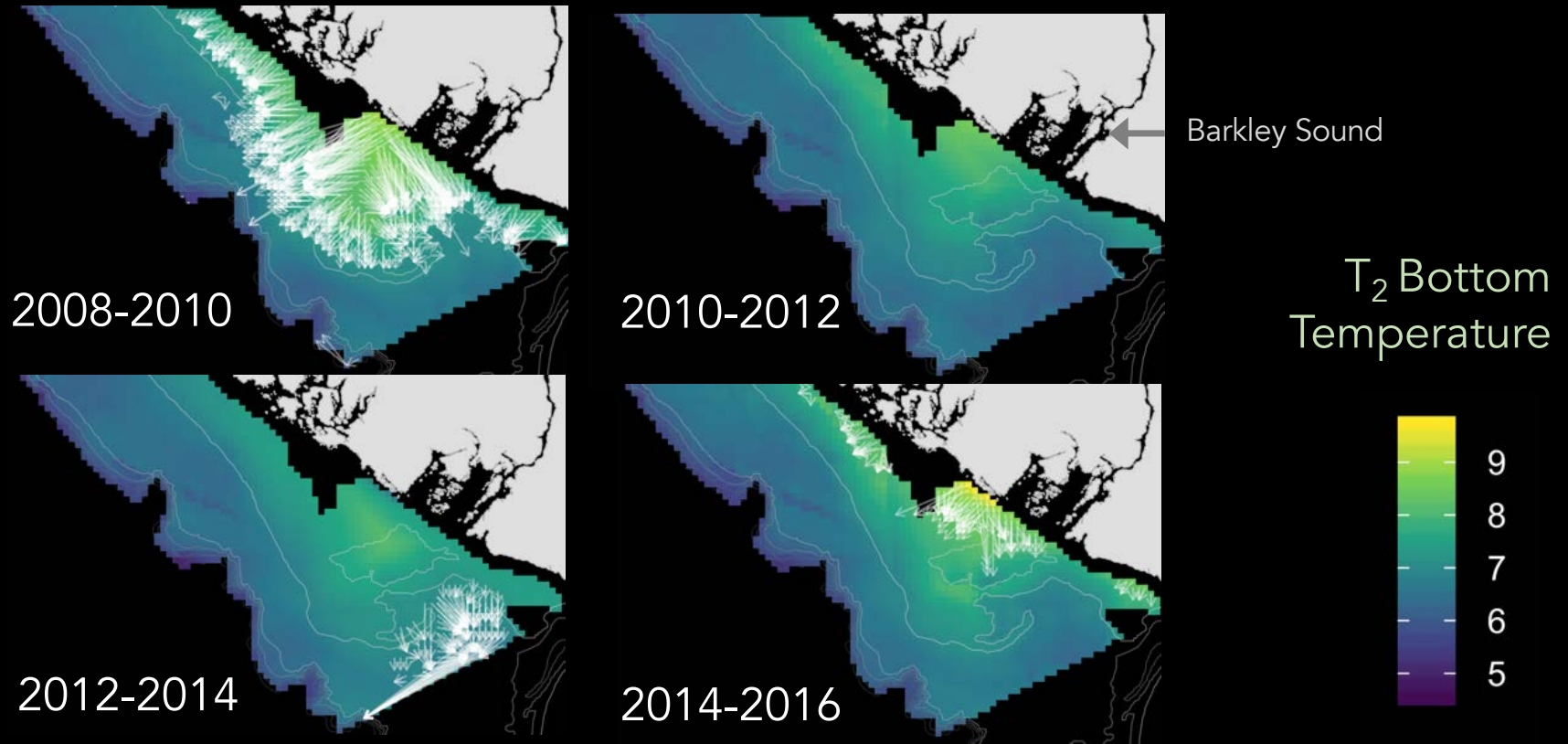
$T_1$  Bottom  
Temperature



Bathymetry  
contours 



# All 0.5 °C vectors for portion of west coast Vancouver Island



Velocities can be left general

OR

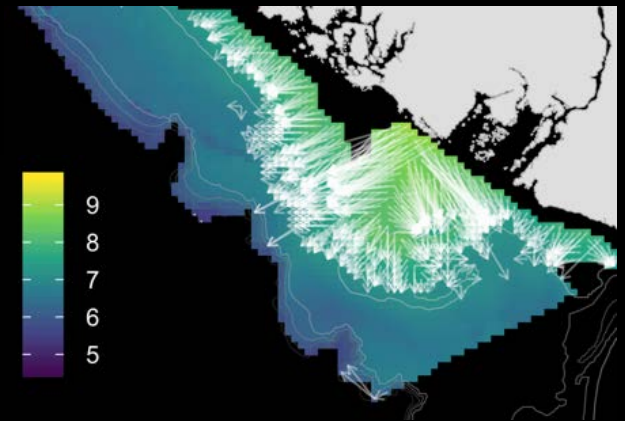
Informed by species characteristics

- limit vector lengths to max dispersal distances
- filter based on species occurrence/abundance
- define analogous climate based on physiological response curves

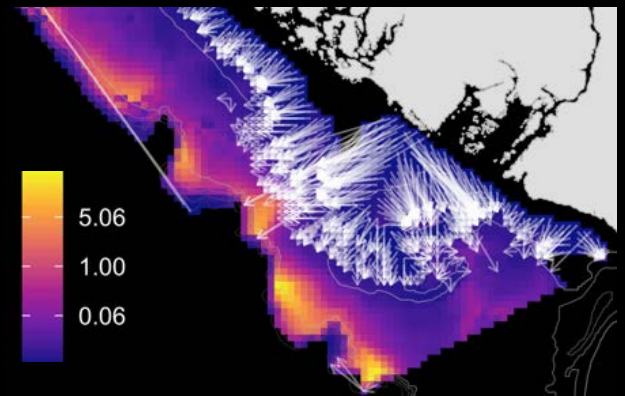



2008 Pacific Ocean Perch biomass (kg/ha)

2010 Bottom Temperature



2008-2010 vectors



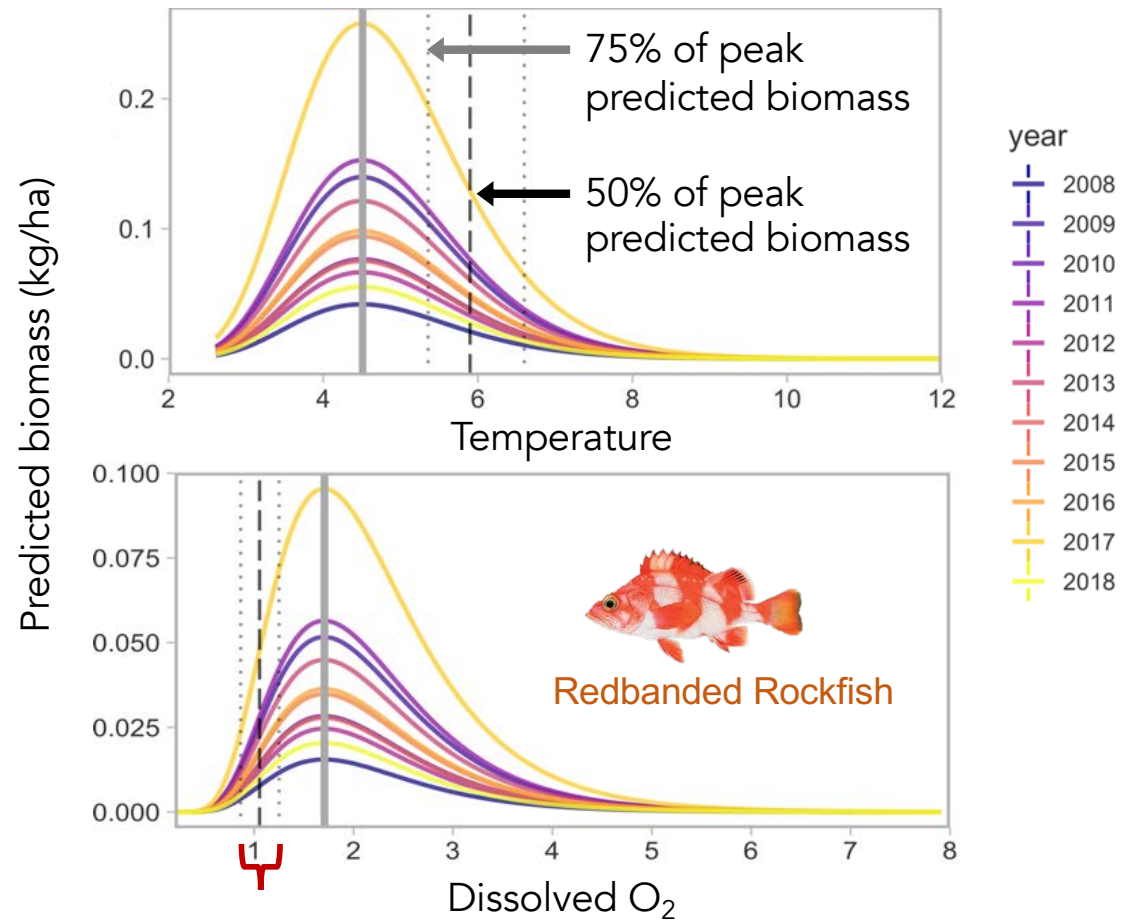
- 
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# Species-specific sensitivities

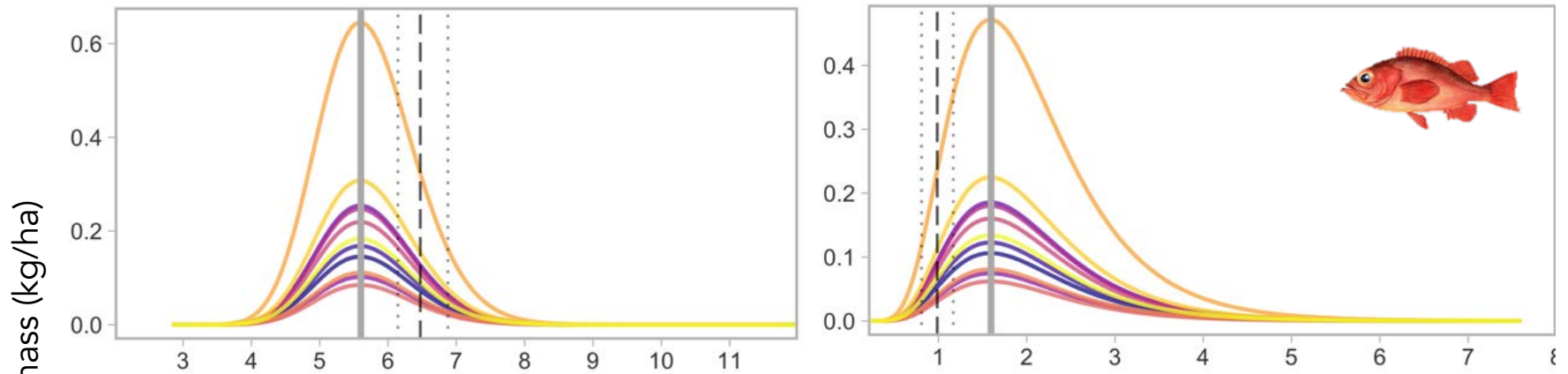
We built species distribution models with quadratic effects of temperature, DO and depth

Filter for only vectors crossing 50% threshold

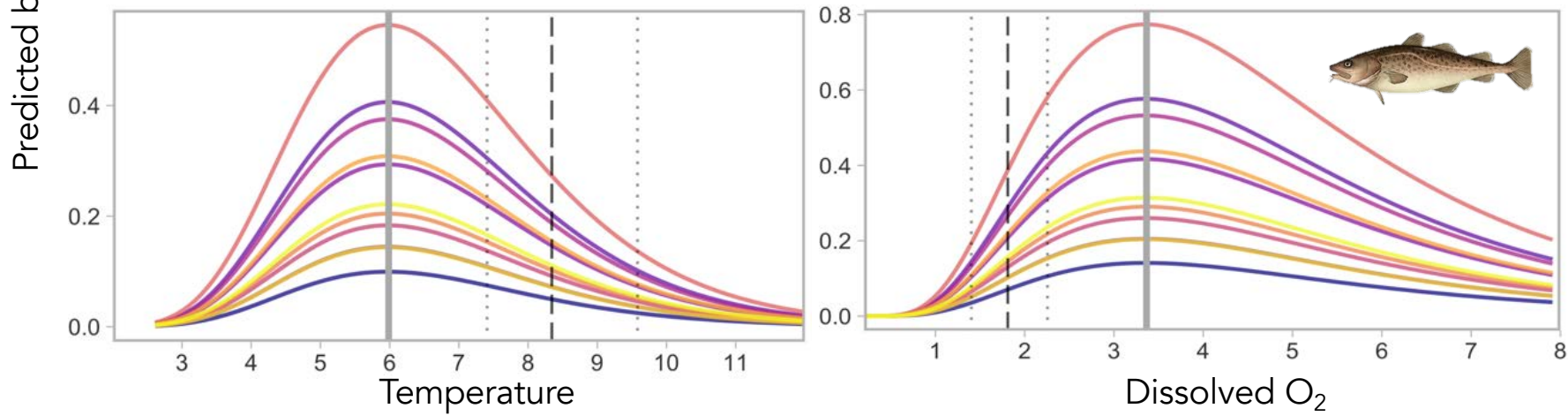
Can also create vectors of change based on breadth of curve  
(eg. 75% threshold - 25% threshold)



Pacific Ocean Perch



Pacific Cod



# Species-specific vectors

Pacific Cod biomass in 2008 + vectors illustrate movement that limits temperature increase to  $< 0.5\text{ }^{\circ}\text{C}$  in 2010

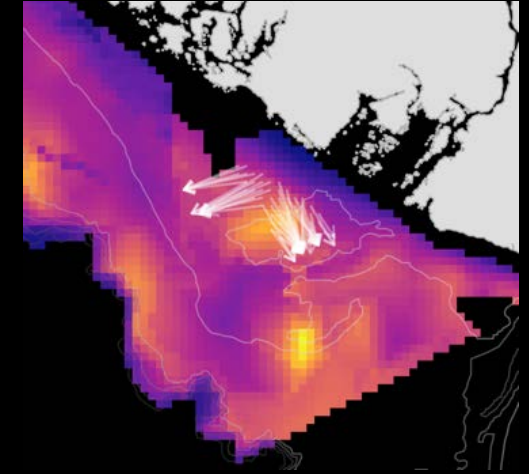
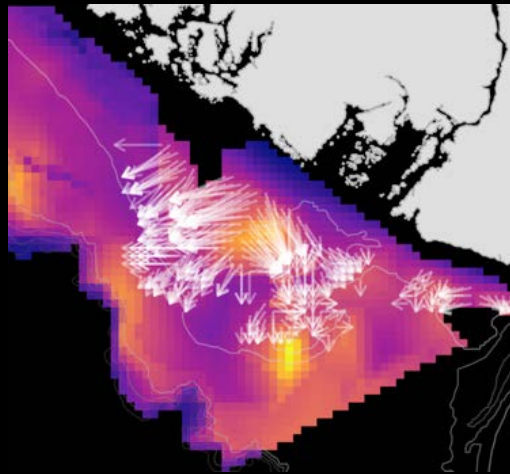
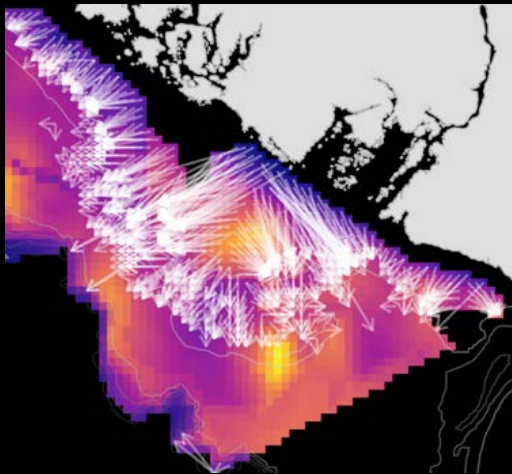
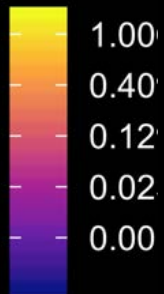


all vectors

vectors accounting for 95% of biomass

vectors exceeding sensitivity threshold

Kg/ha



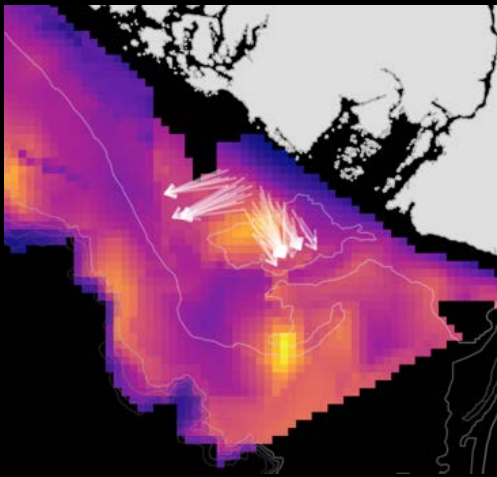
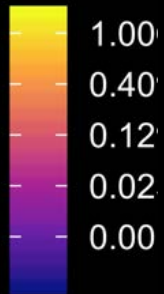


# Species-specific vectors

Pacific Cod biomass in 2008 + vectors that limit temperature increase to  $< 0.5$  °C in 2010



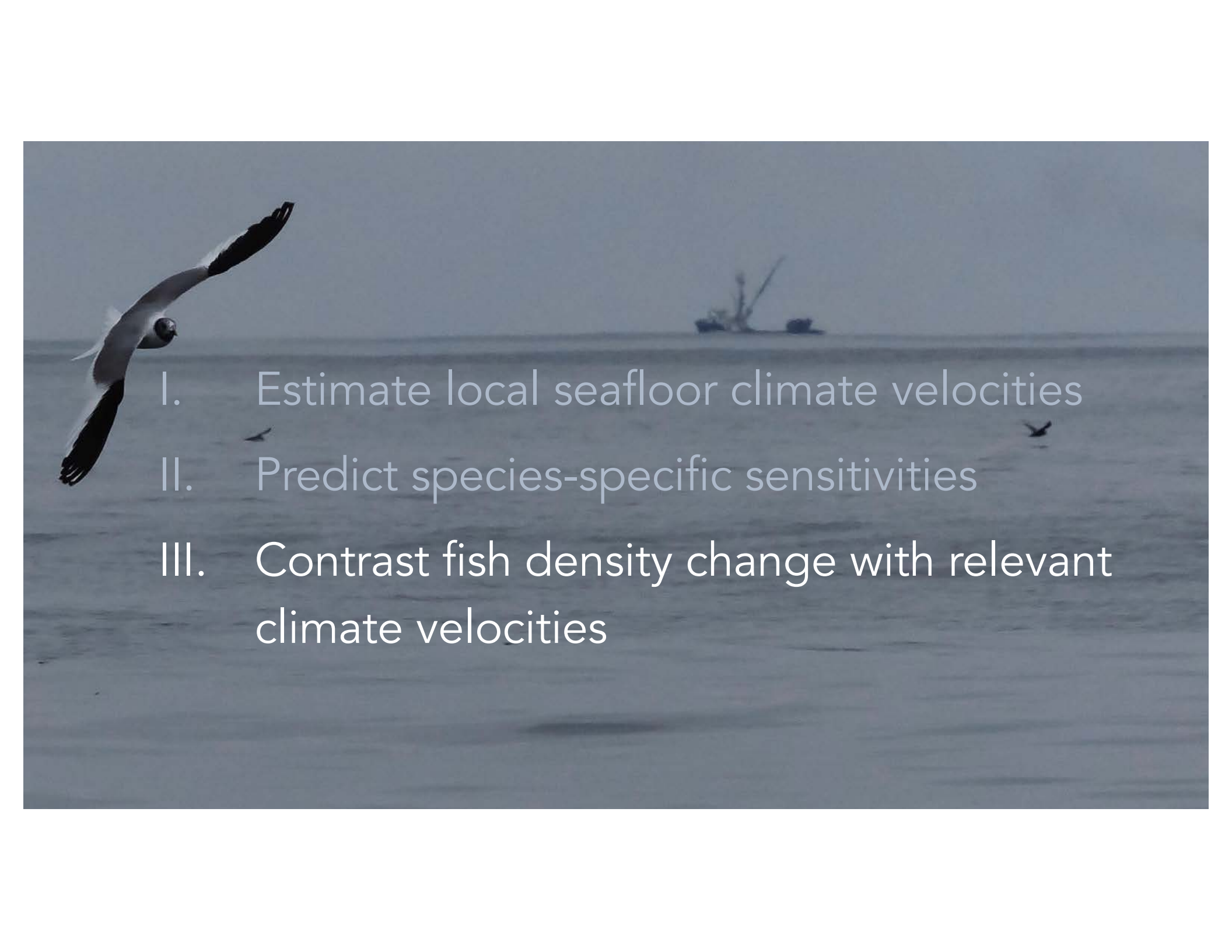
Kg/ha



Climate Pressure Score:

biomass weighted  
sum of vector lengths

e.g. Pacific Cod 2010 score = 0.5

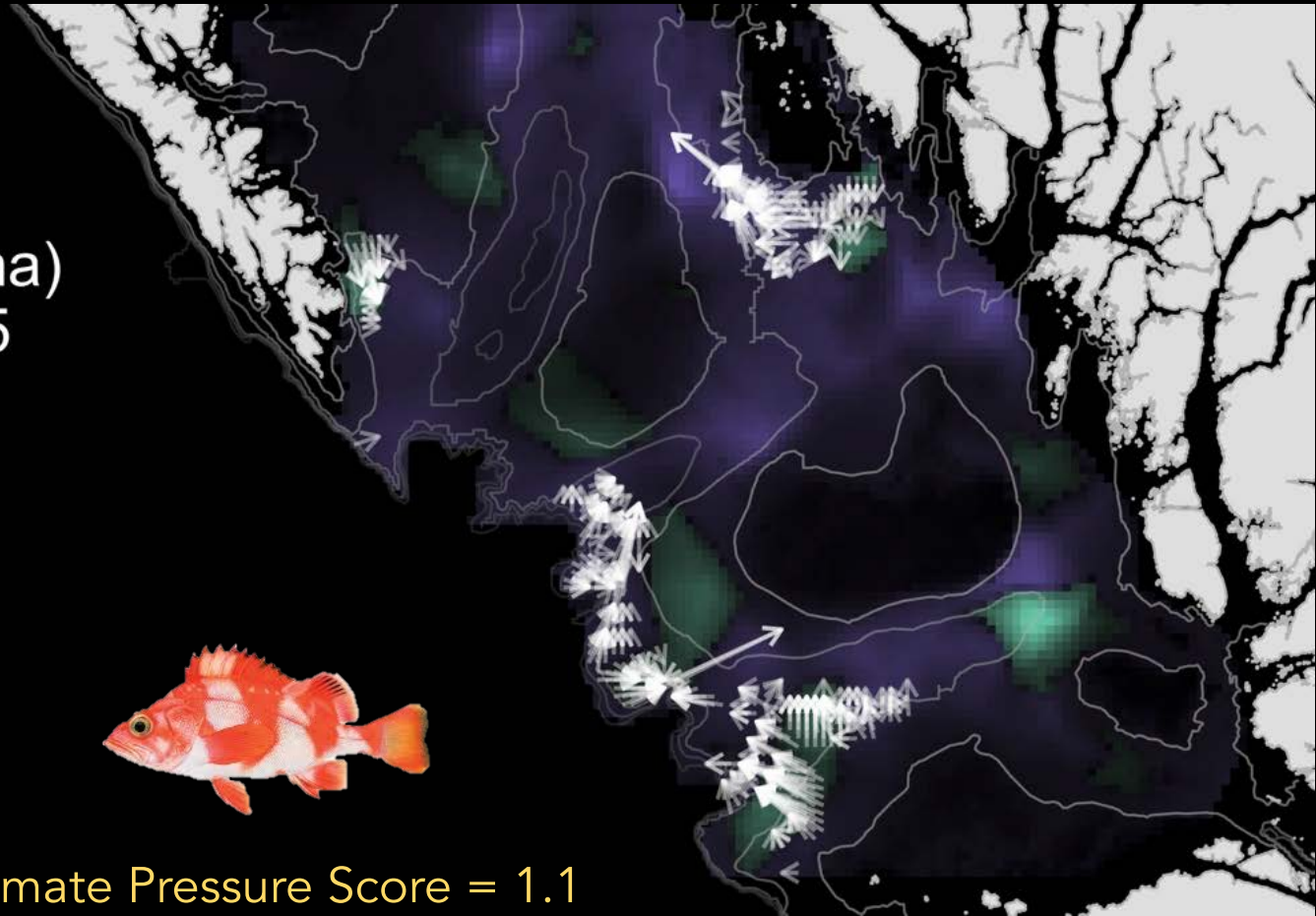
- 
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Biomass  
change (kg/ha)  
2013 to 2015

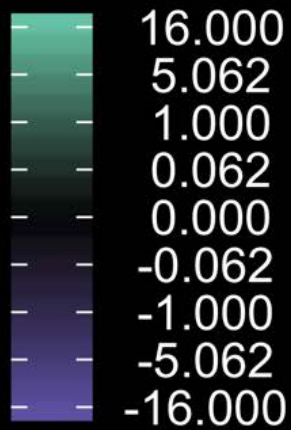


Climate Pressure Score = 1.1

vectors illustrating movement to limit increase in temperature to  $< 0.5\text{ }^{\circ}\text{C}$



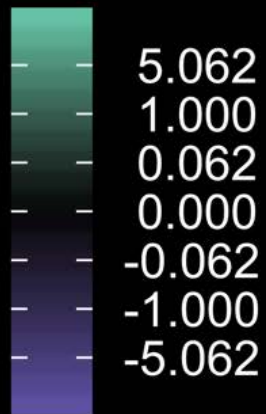
Biomass  
change (kg/ha)  
2013 to 2015



Climate Pressure Score = 0.8

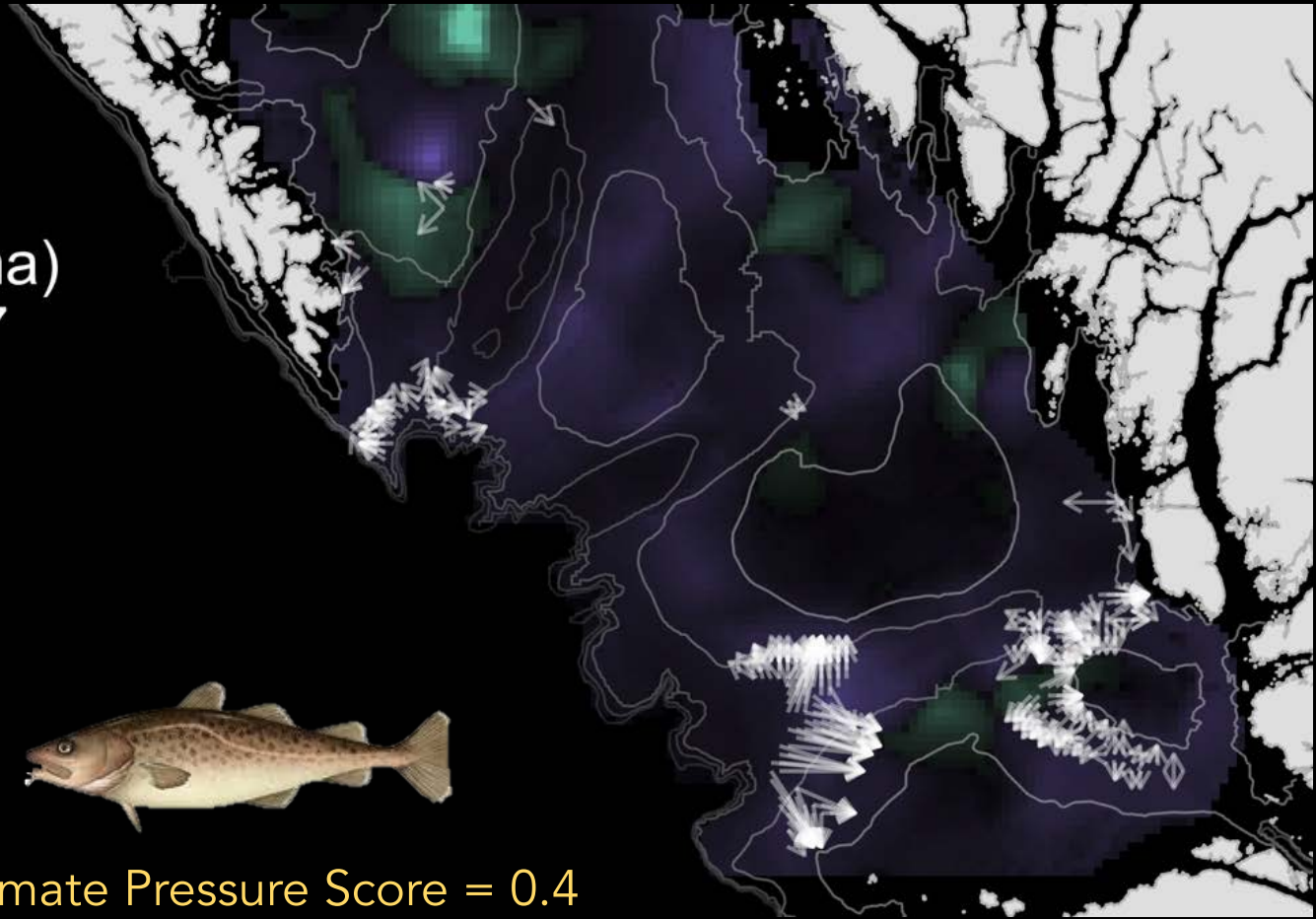
vectors illustrating movement to limit increase in temperature to  $< 0.5\text{ }^{\circ}\text{C}$

Biomass  
change (kg/ha)  
2015 to 2017



Climate Pressure Score = 0.4

vectors illustrating movement to limit decline in DO to  $< 0.2$  ml/L



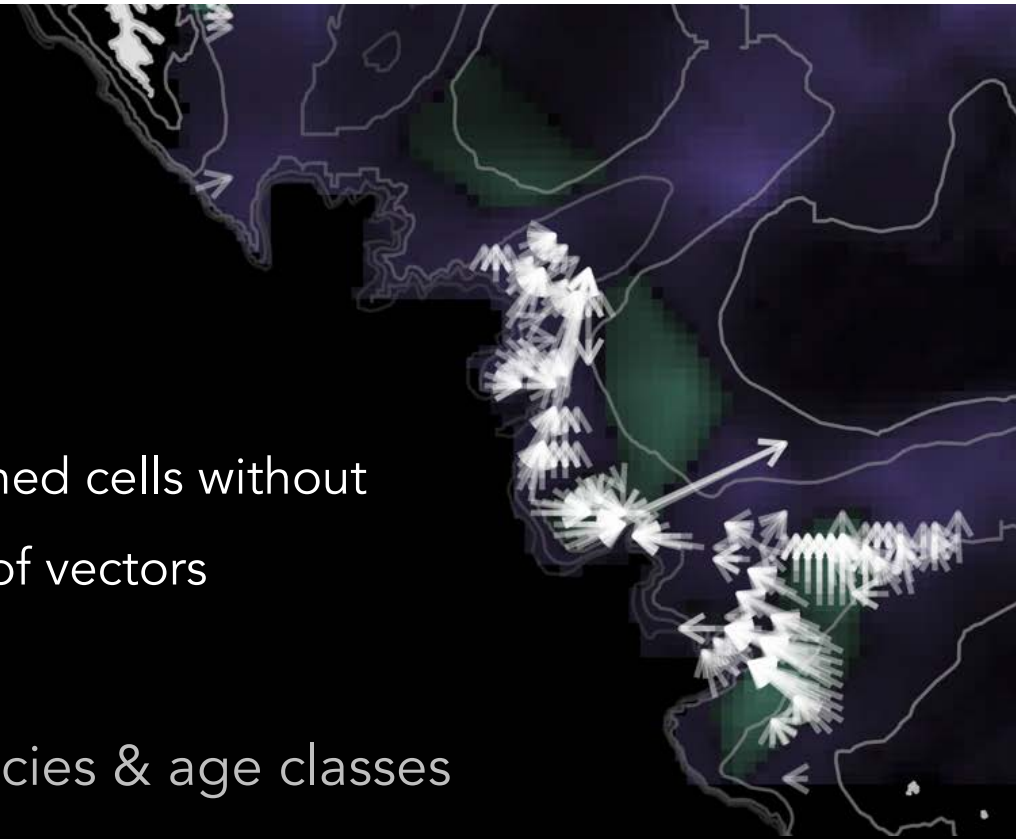
## Statistical approach...

Biomass change ~

- cells with vectors vs. matched cells without
- cells at the heads vs. tails of vectors

Meta-analysis across years, species & age classes

So far we don't see consistent patterns... why?





## Next steps

Expand temporal scale of climate

→ ROMS estimates of seasonal variability

Refine thresholds

→ GAMMs, priors, other ideas?

→ scale change threshold to response curve breadth



Many hands!



Thank you!



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