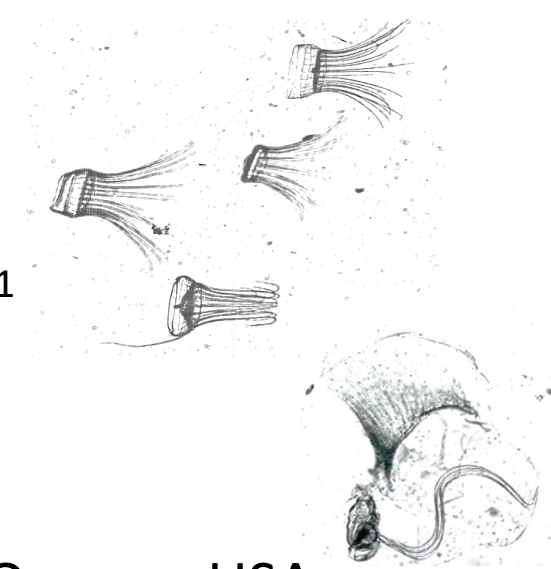


# Planktonic trophodynamics in the Northern California Current - multiyear in-situ observations derived from underwater imaging



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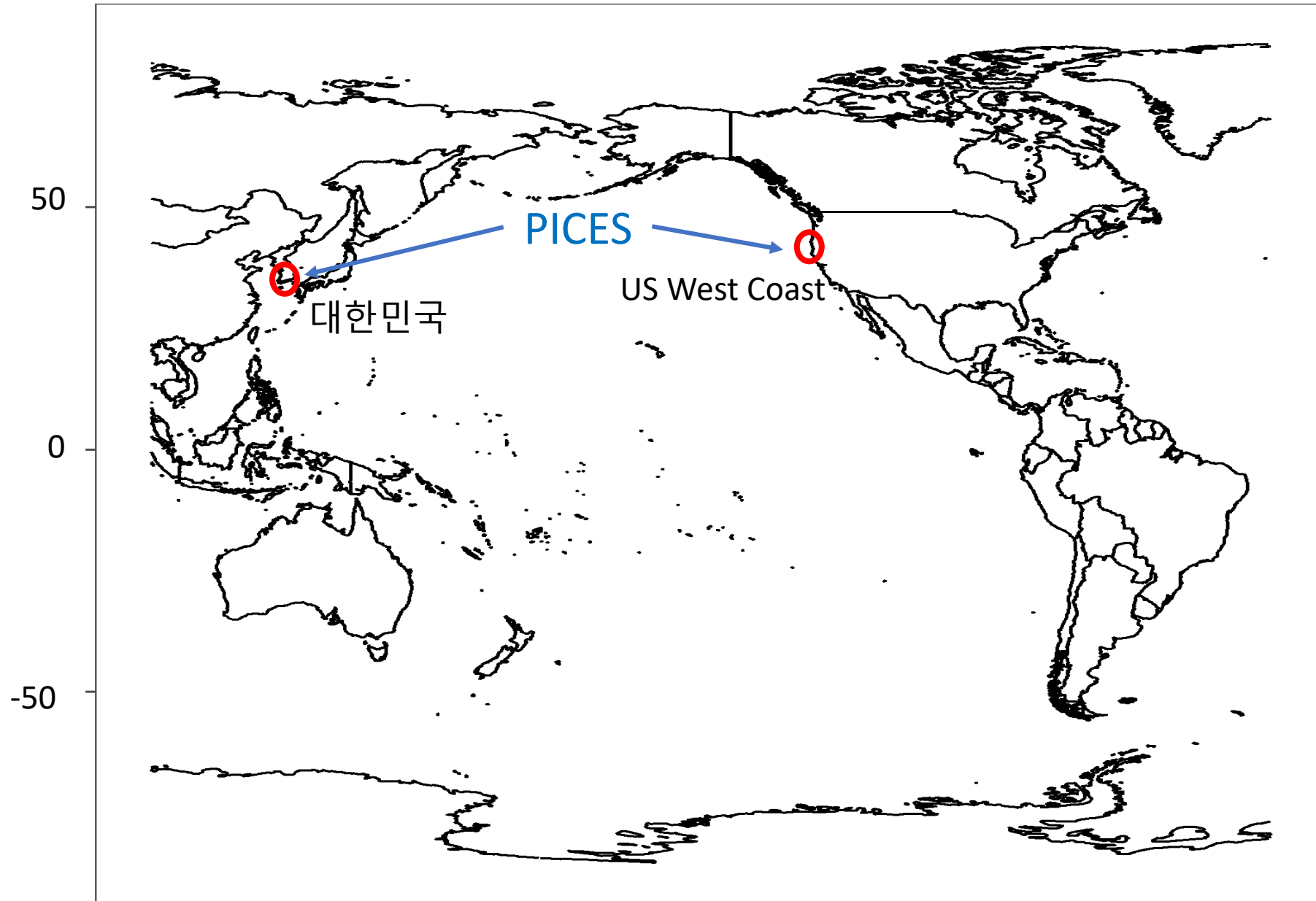
Oregon State University  
Hatfield



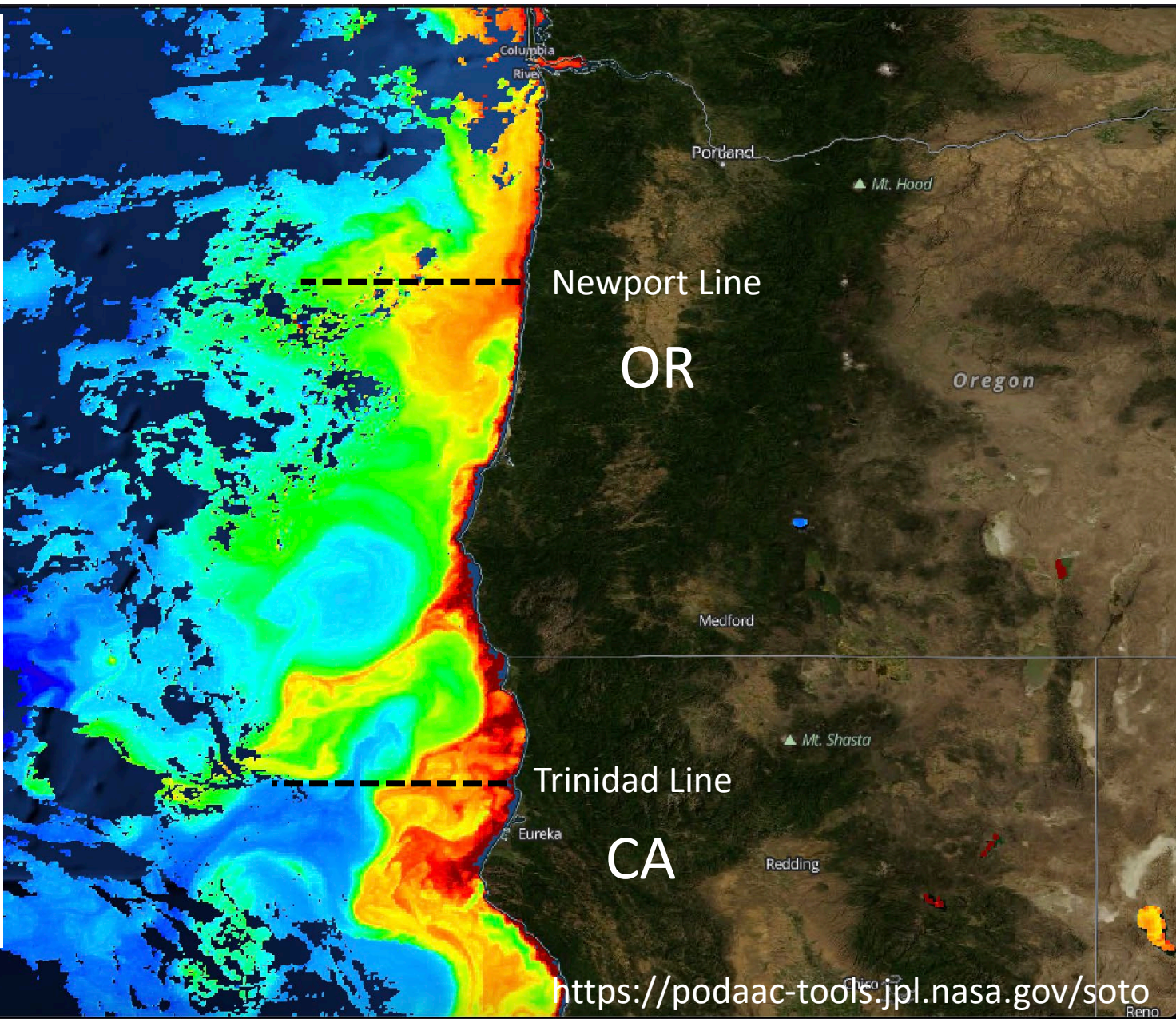
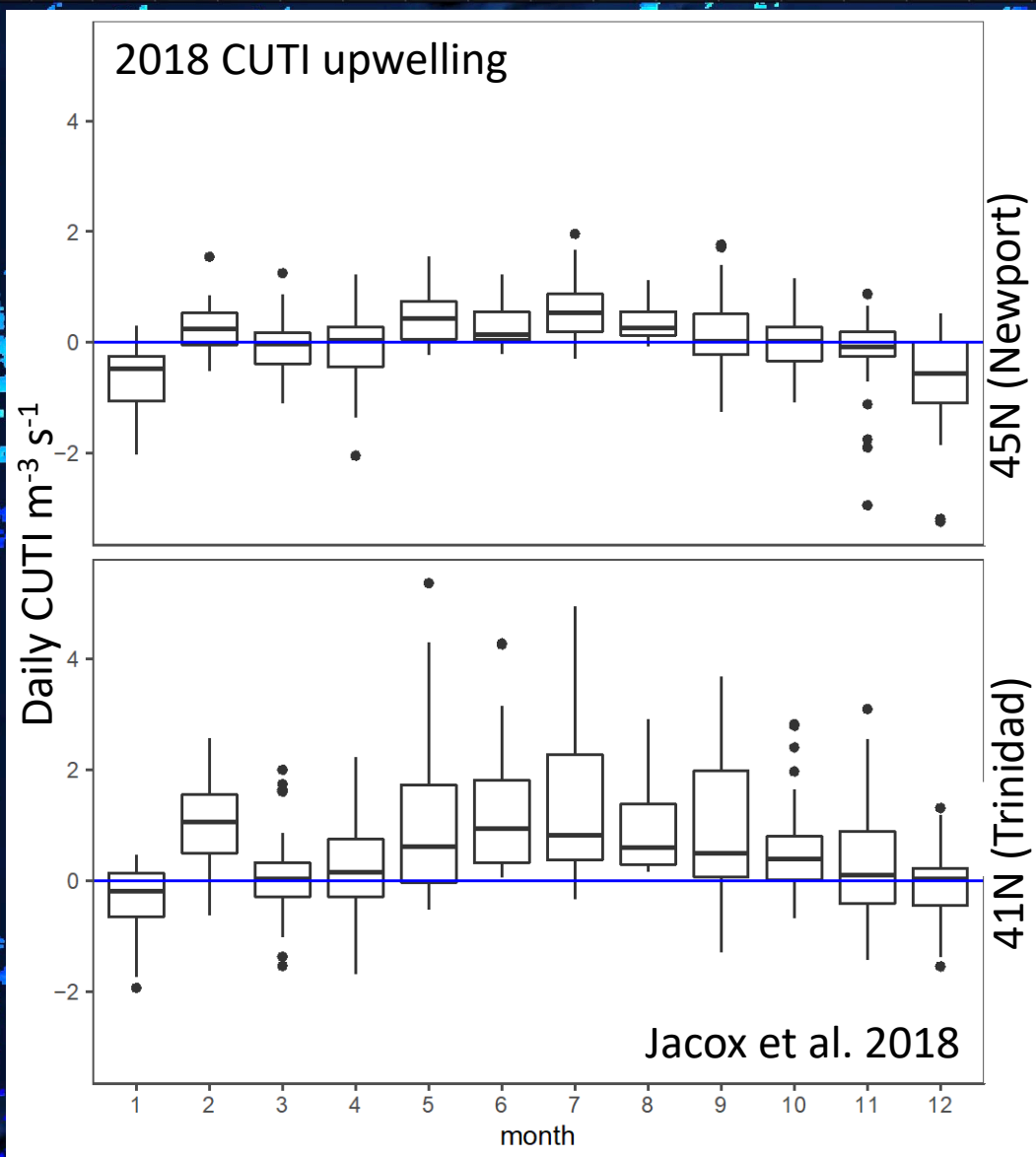
**XSEDE**

Extreme Science and Engineering  
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# The great connector



# Intermittent and continuous upwelling in the NCC

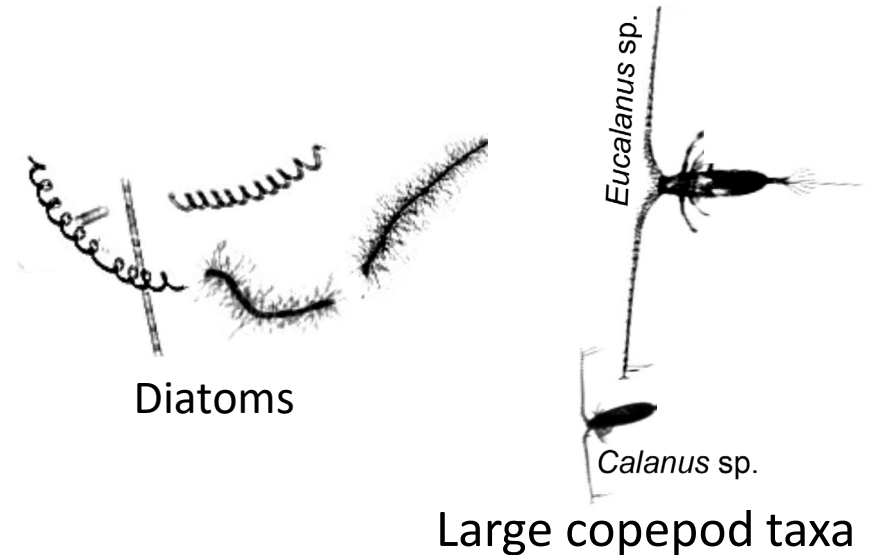


Ju1 10, 2018

Reno

## Continuous upwelling

- Short food chains starting with large diatoms
- Classic marine trophic web
- New productivity
- On avg larger plankton



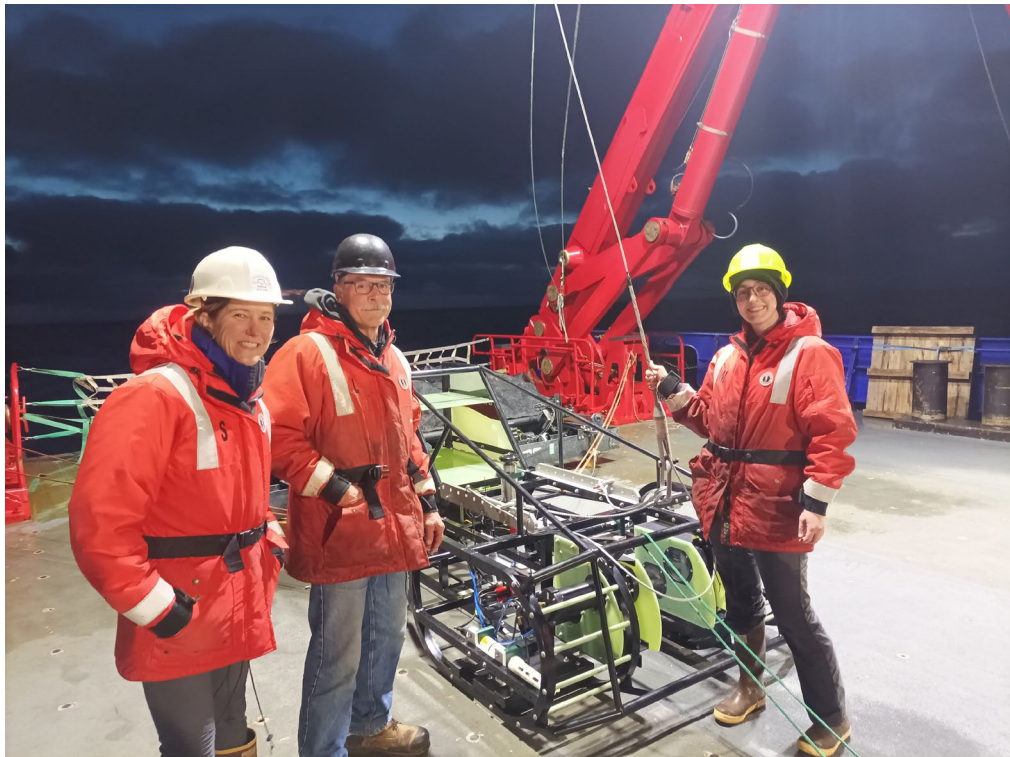
## Intermittent upwelling

- Longer food chains with smaller phytoplankton species
- Higher activity of the microbial loop
- More recycled productivity
- On avg smaller plankton

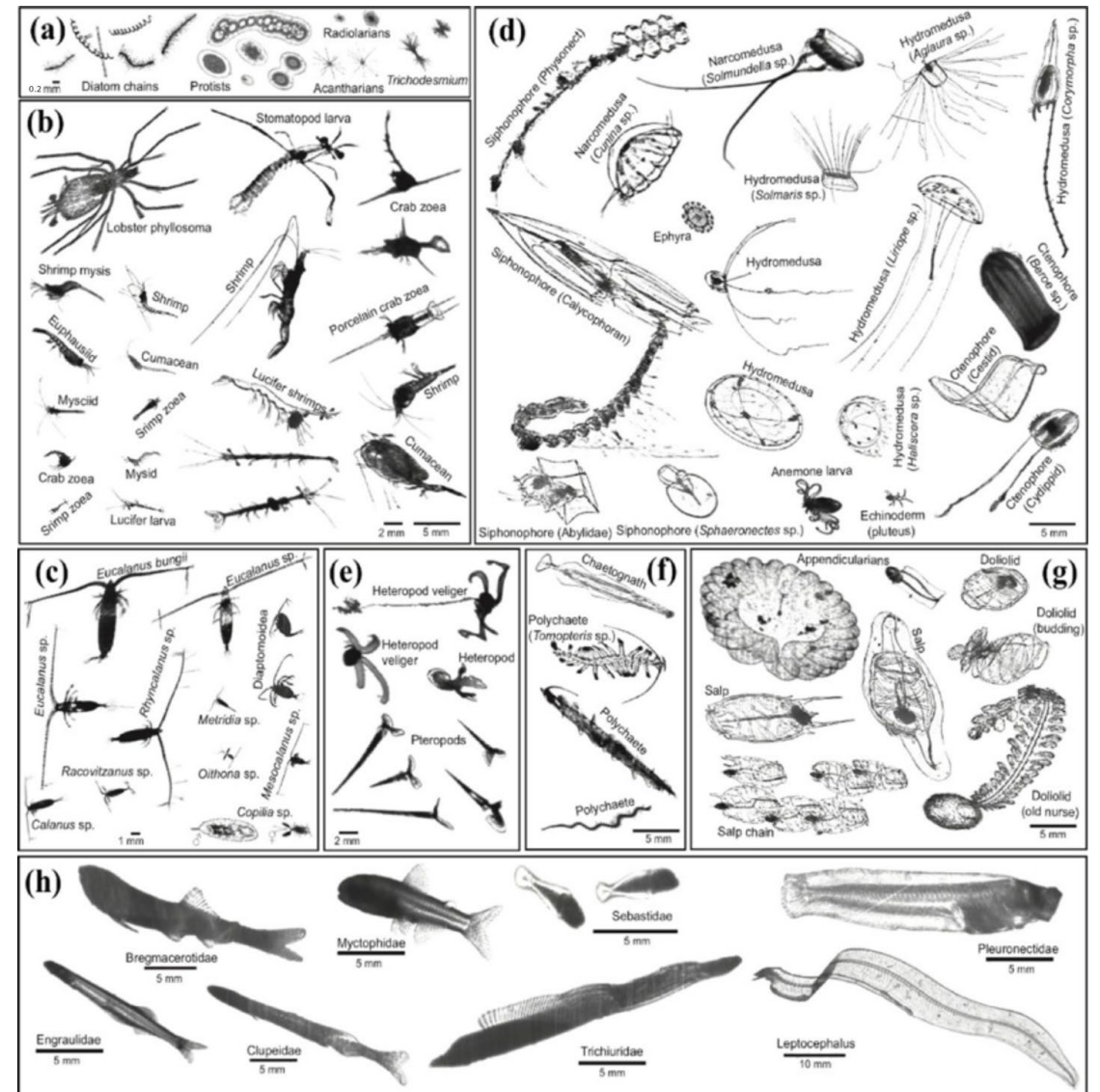


# Study the effects of continuous and intermittent upwelling on plankton communities at fine spatial scale

- In-situ imaging & machine learning



The In-situ Ichthyoplankton Imaging System (ISiIS-3)



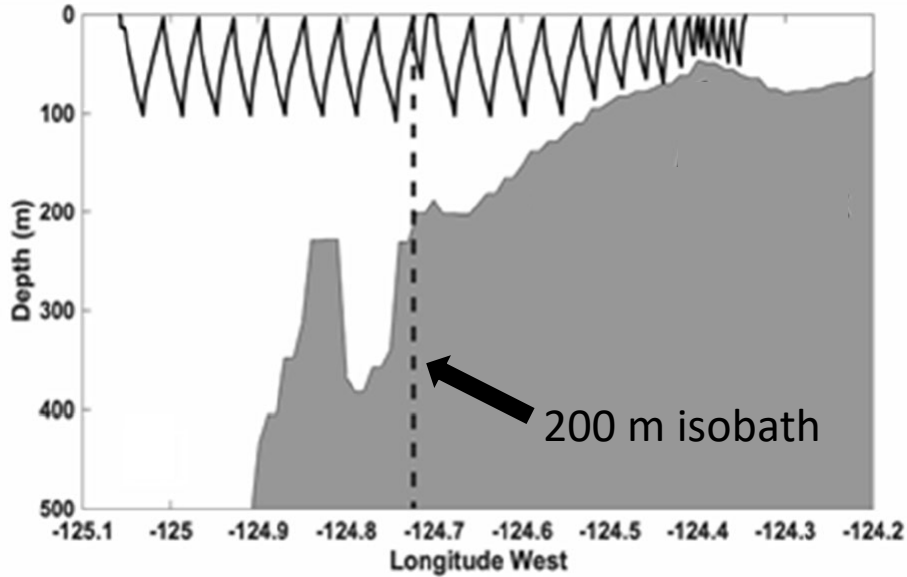
Plankton imaged by ISiIS. 160+ classes in sCNN pipeline



# MEsoZooplankton in the Northern CALifornia Current (MEZCAL)

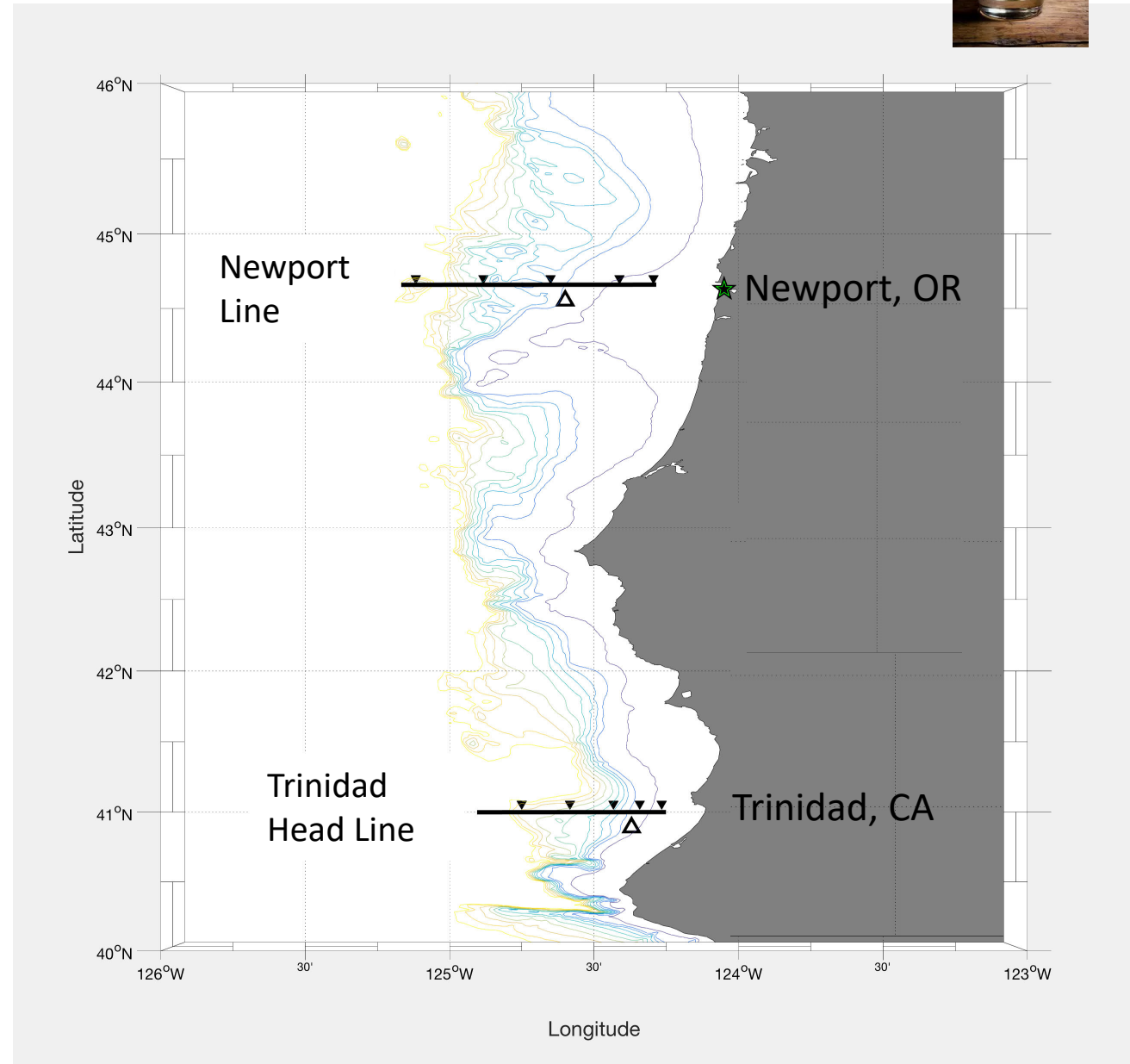


- 30 transects (50-75 km) in winter (Feb) and summer (July) 2018 and 2019



## sCNN processing

- >1.2 billion images collected and classified (Luo et al. 2018, Schmid et al. 2021)

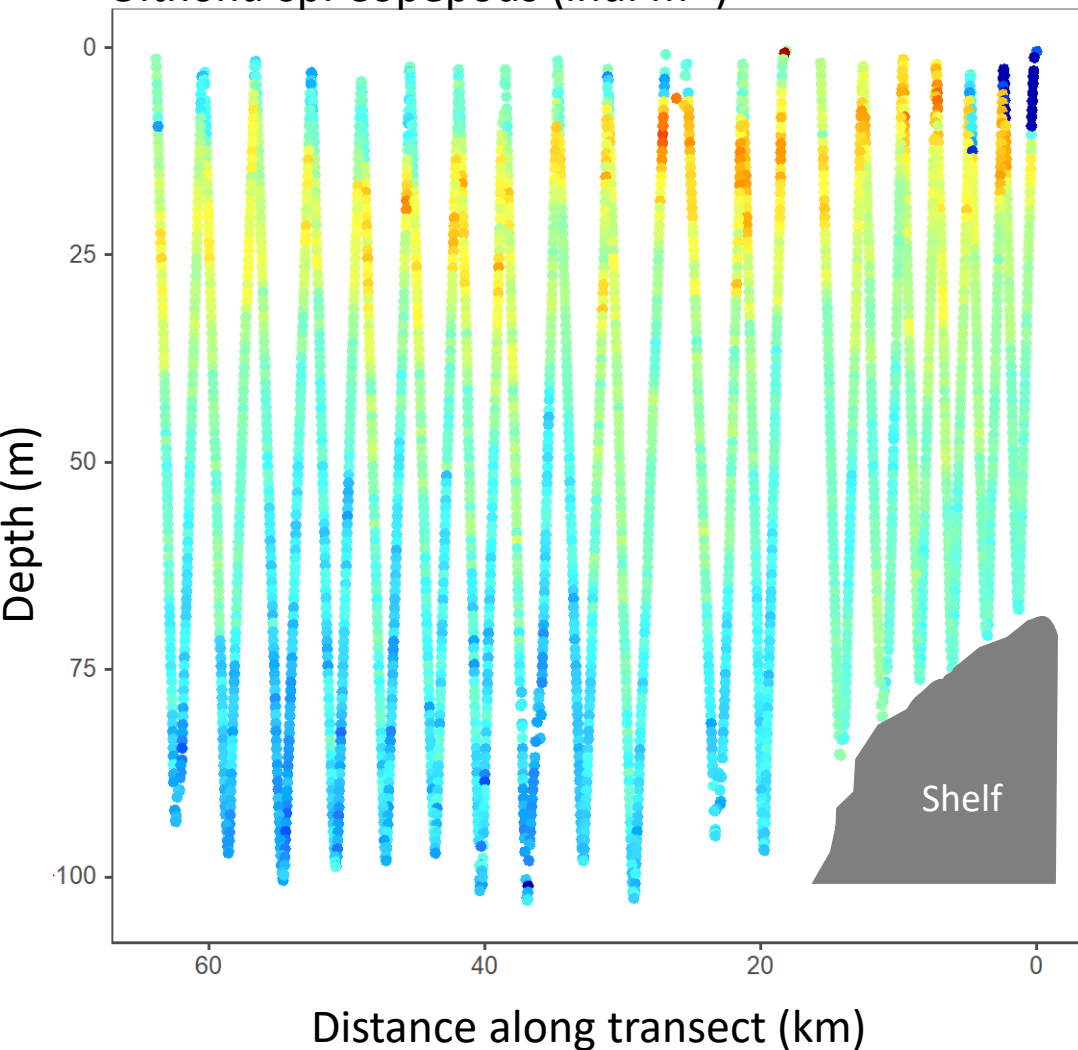


# Hypotheses

- a) Plankton co-occurrence, as a proxy for community structure, is affected by upwelling strength – that effect varies between continuous and intermittent upwelling regions
  
- b) In intermittent upwelling, taxa associated with the microbial loop play an important role in forming taxa co-occurrence

# High spatial resolution plankton distributions (< 1m scale)

*Oithona* sp. Copepods (ind. m<sup>-3</sup>)



# Community structure



How can the plankton community as a whole be analyzed while keeping high spatial resolution information? (1950 vertical profiles)

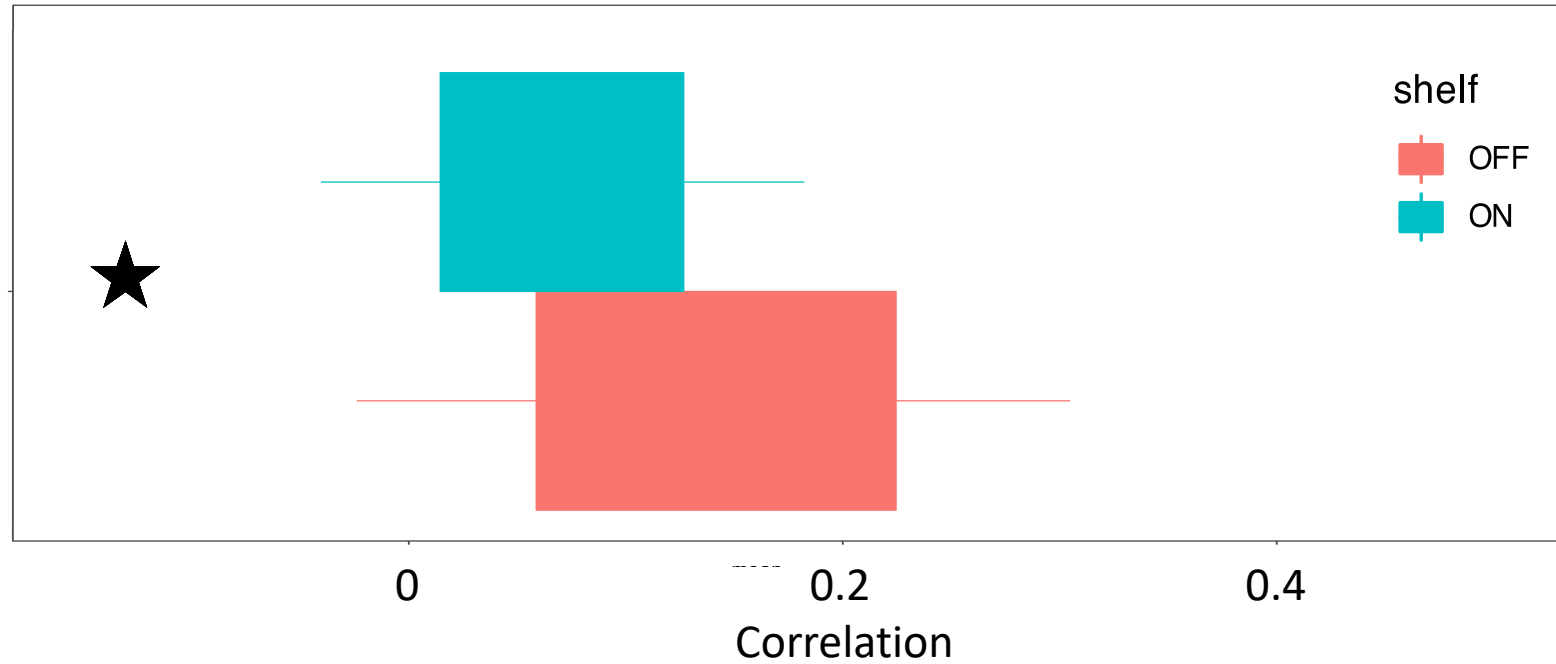


## The big picture

-> Combine all Newport (NH) transects, and all Trinidad Head (TR) transects

-> Stratify by on-shelf and off-shelf (200m depth)

*Oithona* sp.  
at NH Line



★ = significant difference ( $p \leq 0.05$ )

2018

Winter

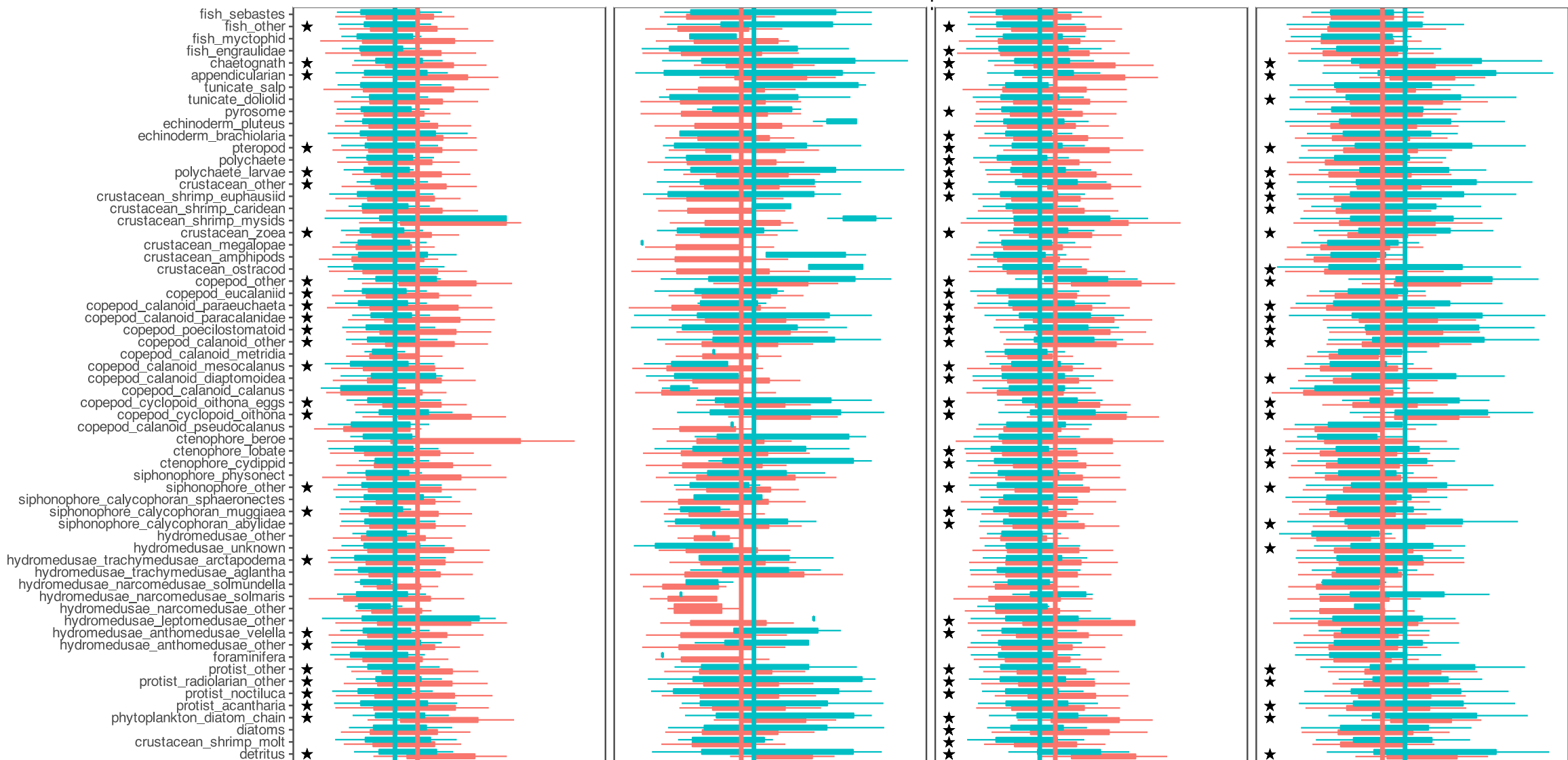
Summer

NH

TR

NH

TR



shelf  
OFF  
ON

Correlation

★ = significant difference (p ≤ 0.05)

2019

Winter

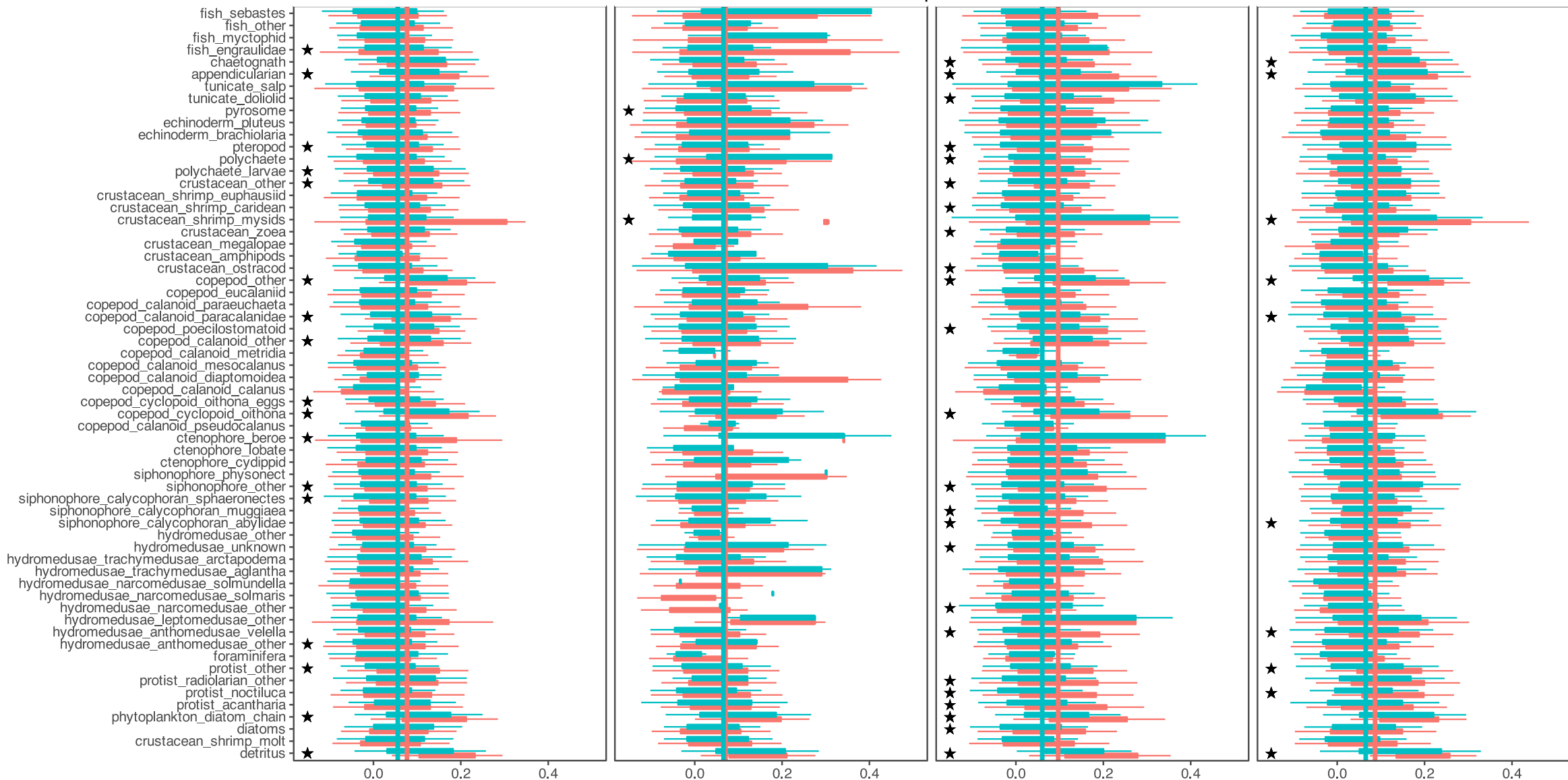
Summer

NH

TR

NH

TR

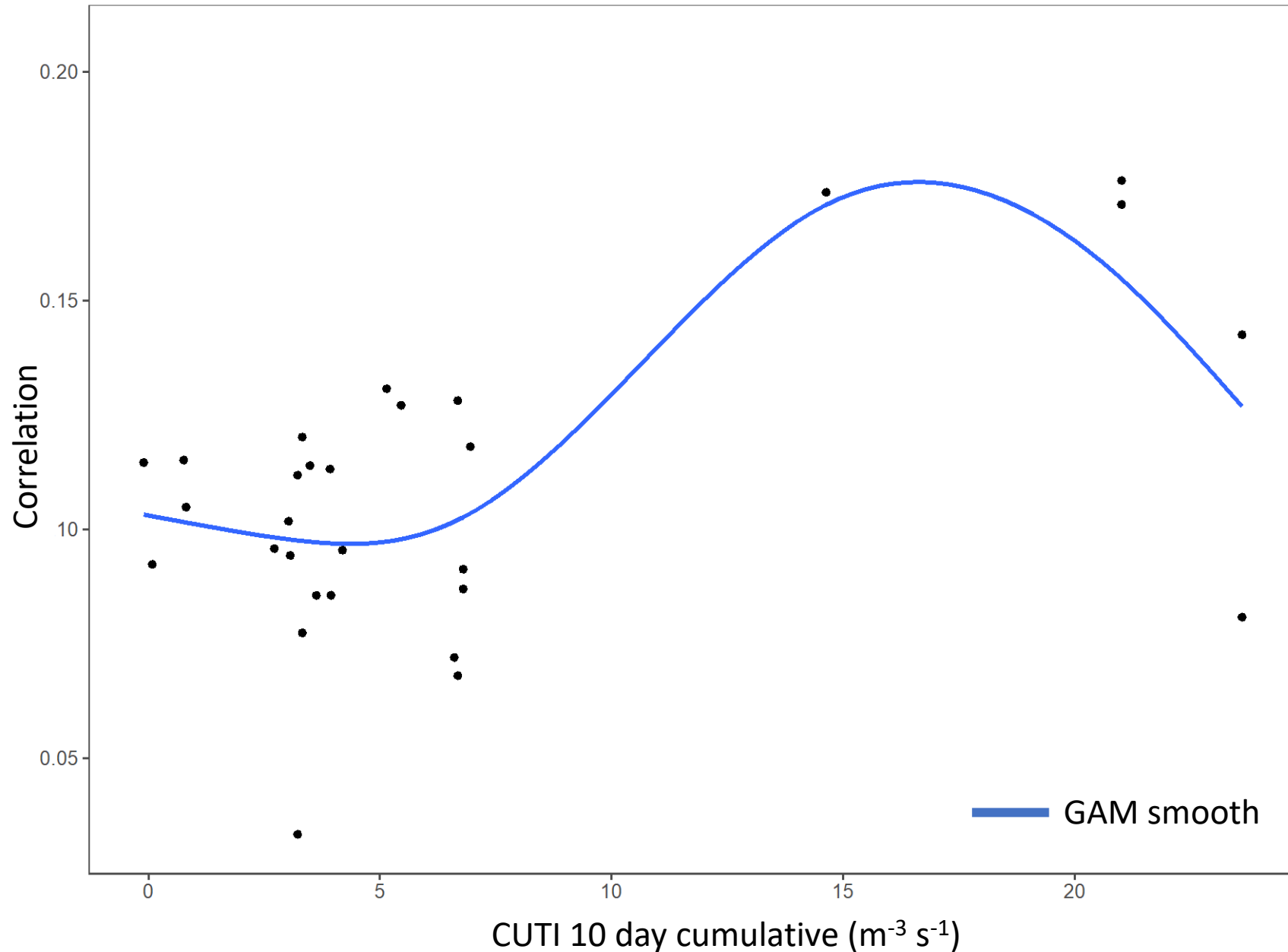


shelf  
OFF  
ON

Correlation

★ = significant difference (p ≤ 0.05)

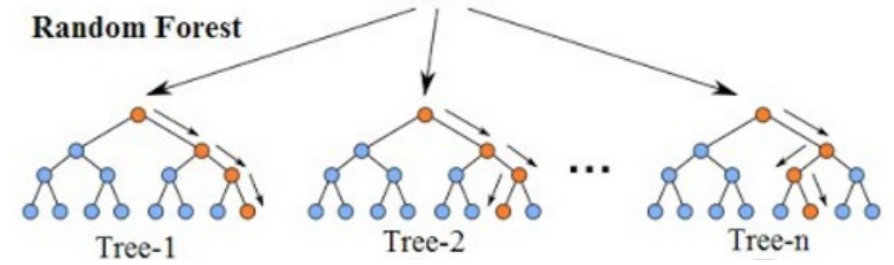
# How does upwelling relate to co-occurrences?



- 10 day cumulative CUTI values (Spitz & Allen 2005)
- Decreased effect at high CUTI possibly due to missing relaxation periods (Legendre and Le Fèvre 1989, Kudela and Dugdale 2000)

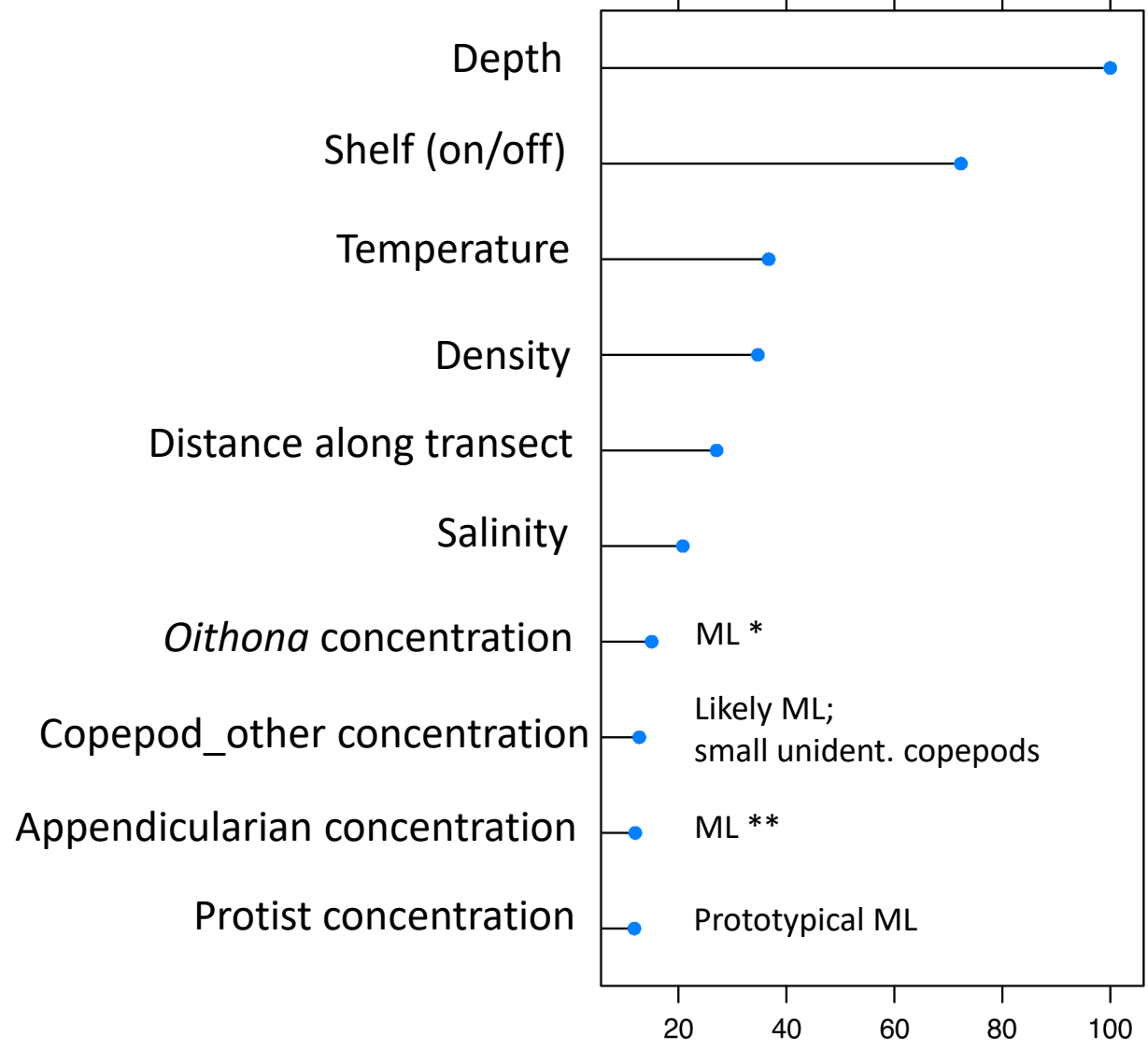
# Modeling taxa correlations/co-occurrences via Random Forests

- Spatially explicit on the scale of  $< 1\text{m}$
- 84 predictors that capture abiotic and biotic signal
  - a) Taxa concentrations
  - b) ISIS sensors (e.g., Chl  $a$ , Oxygen, Temperature, density)
  - c) Derived variables (e.g., mixed layer depth, Brunt-Vaisala frequency, geostrophic dynamic height anomaly)



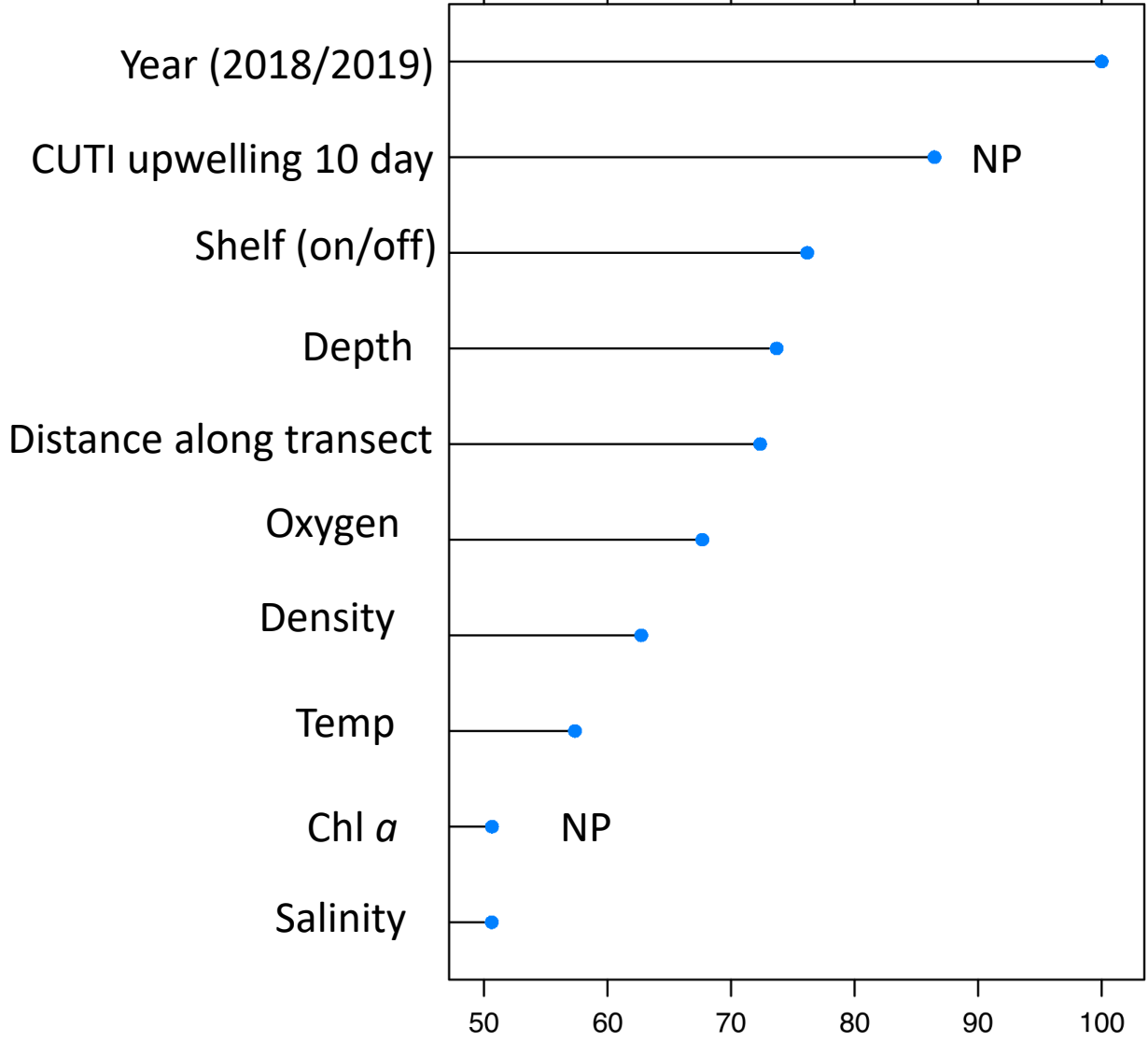
Microbial loop (ML)  
New production (NP)

Random Forest model for NH Line  
-42% variance explained



Scaled permutation importance

Random Forest model for TR Line  
-43% variance explained



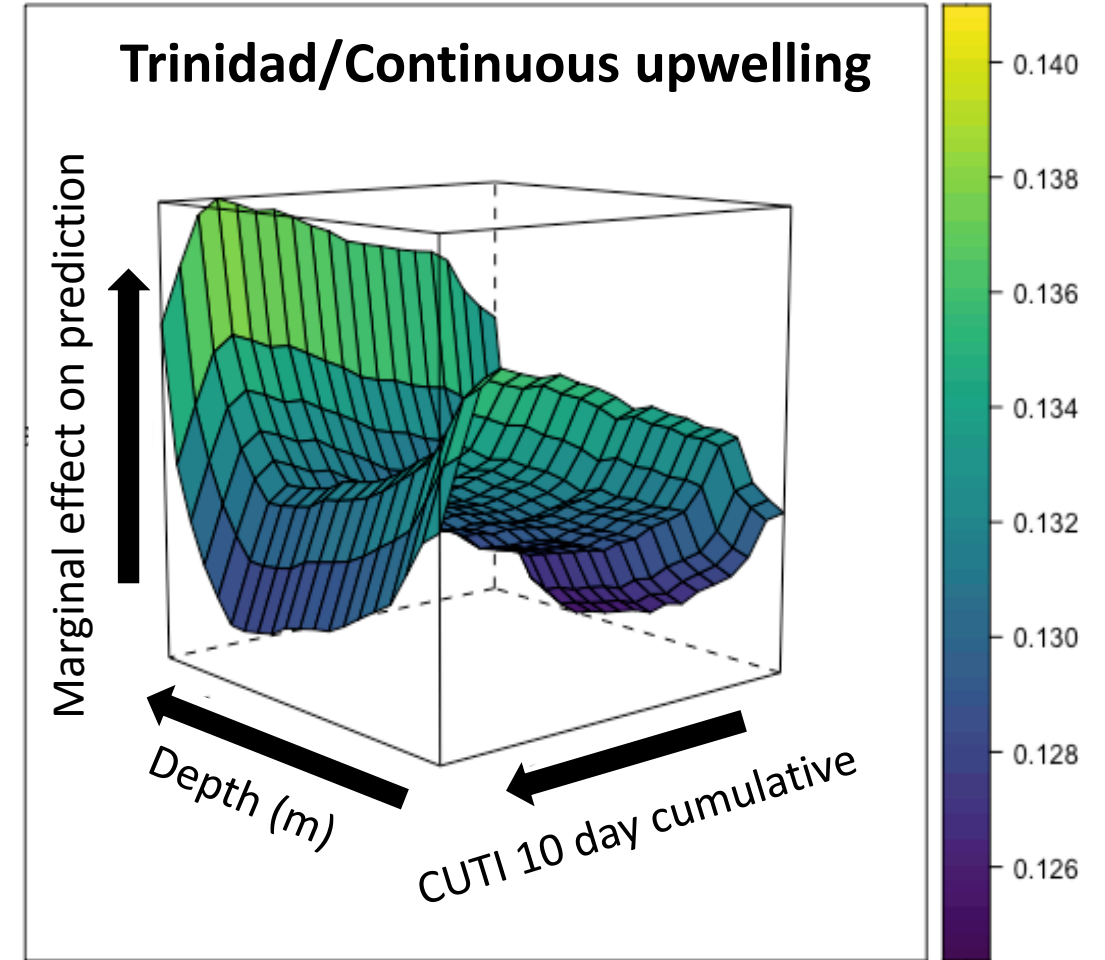
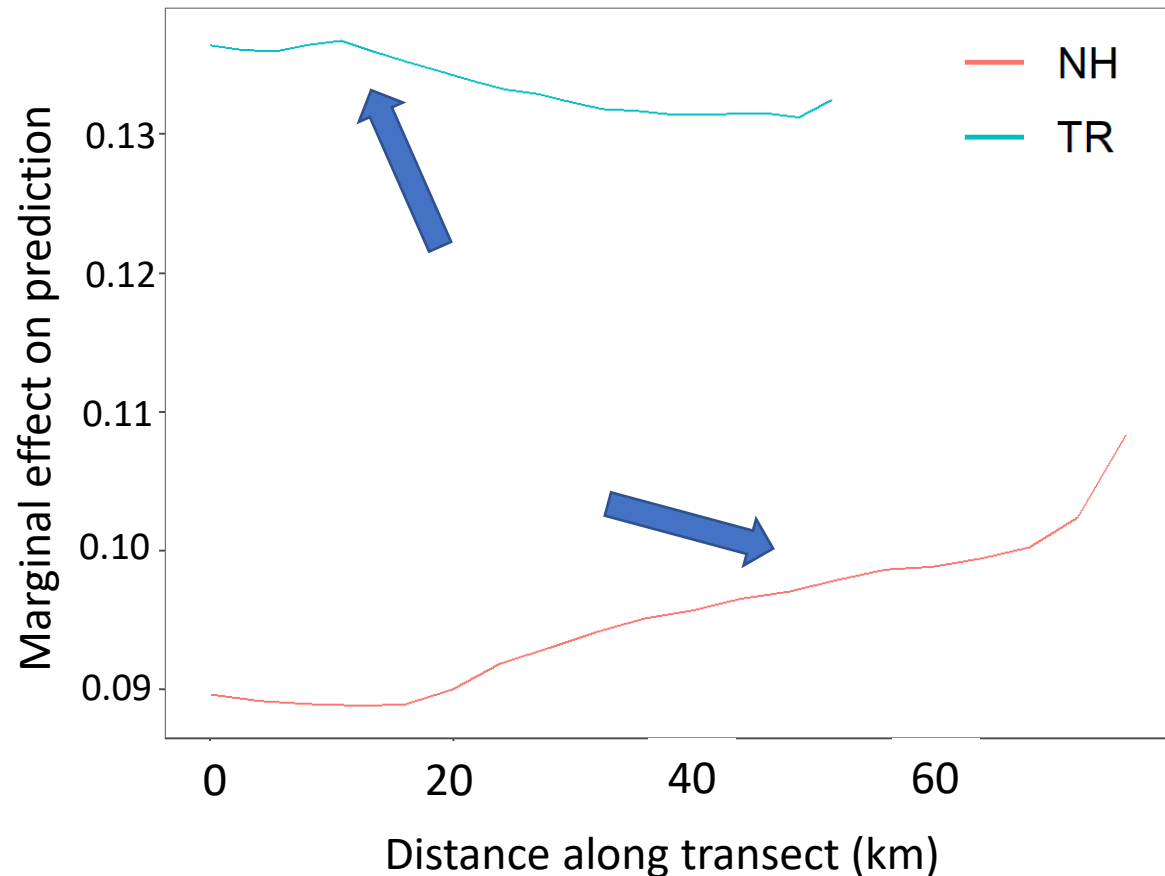
Scaled permutation importance

\* Gonzalez et al. 1994, Nishibe et al. 2010

\*\* Gorsky and Fenaux 1998, Sutherland and Thompson 2021

# Detailed effects of variables on co-occurrences

- Partial dependence plots show the (non-linear) effects of predictors on the dependent variable




- Increase with CUTI, stronger effect shallow and deep, but drop-off at highest CUTI

## Summary

- Correlation and co-occurrence as a proxy for community structure
- Distinct differences in on-shelf and off-shelf co-occurrences between intermittent and continuous upwelling regions
- Co-occurrences in intermittent upwelling were partially driven by variables attributed to the **microbial loop**, while in continuous upwelling important variables included those partial to **new production**



## Conclusions

- Upwelling directly affects species co-occurrence, and more so in a continuous upwelling and narrow shelf system
- Climate change includes intensification of upwelling favorable winds (Poza Buil et al. 2021) in the NCC -> Potential for microbial loop system  new production system. Nuanced effects on (the drivers of) species co-occurrences are likely

# Acknowledgements

- Captains & crews of R/V *Sikuliaq*, R/V *Sally Ride* & R/V *Atlantis*
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- NSF XSEDE staff at the San Diego & Pittsburgh supercomputing centers
- Kelsey Swieca for help with building the sCNN training library



Oregon State University  
Hatfield



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