

# Detecting and forecasting community-level shifts in marine ecosystems

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# Outline

## Session 3 Understanding Population- and Ecosystem-level Shifts: From Seasonal Timing to Tipping Points

- Overview of tipping points
- Ecological thresholds
- Ecosystem state indicators
- Future directions



# What is a tipping point?



*'When incremental changes in human use or environmental conditions result in large, and sometimes abrupt, changes in ecosystem structure, function, and often, benefits to people'*

Ocean Tipping Points project |  
[oceantippingpoints.org](http://oceantippingpoints.org)



# Increasing attention on tipping points

## The quiet crossing of ocean tipping points

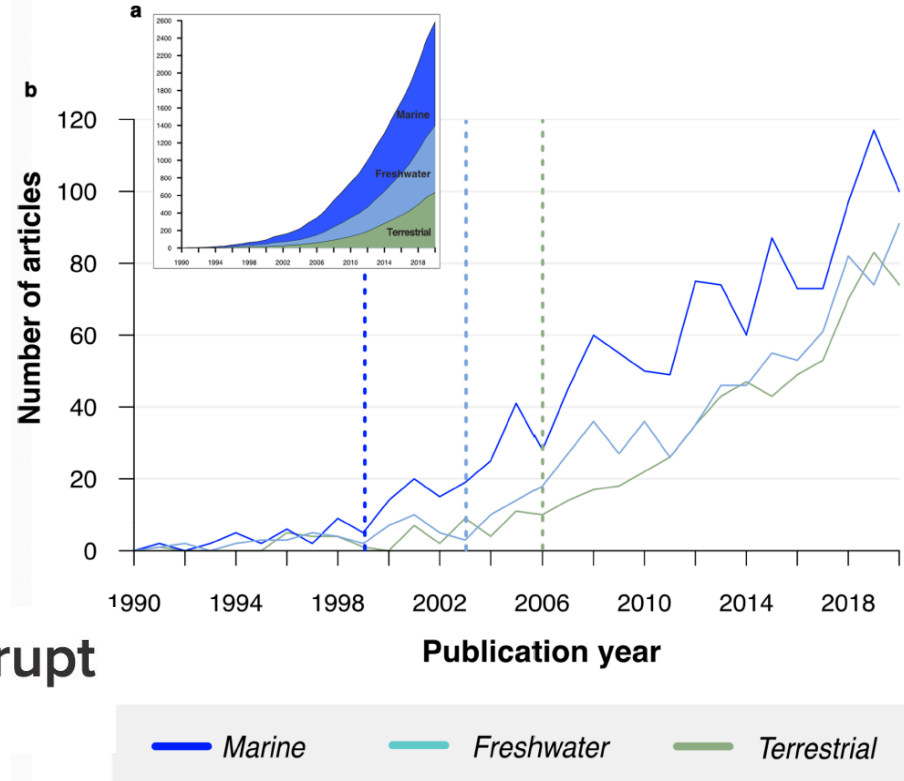
Heinze et al. PNAS 2021

## Climate tipping points – too risky to bet against

Lenton et al. Nature 2019

## Climate change, ecosystems and abrupt change: science priorities

Turner et al. Phil. Trans. R. Soc. B 2020



Carrier-Belleau et al. Limn. and Ocean. 2022

# Increasing attention on tipping points



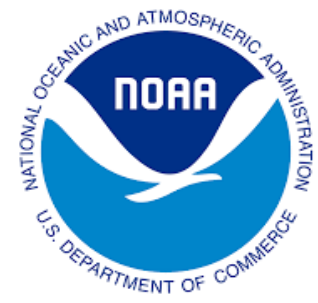
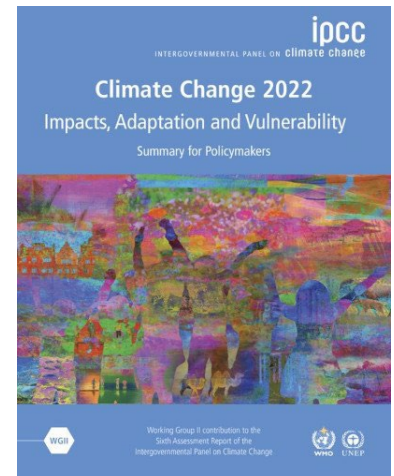
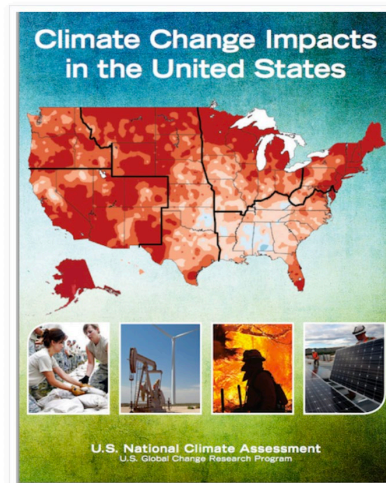
**B B C**

**Climate change: Six tipping points 'likely' to be crossed**

**The New York Times**

***Failure to Slow Warming Will Set Off Climate 'Tipping Points,' Scientists Say***

# Increasing attention on tipping points





**Kelp forests**

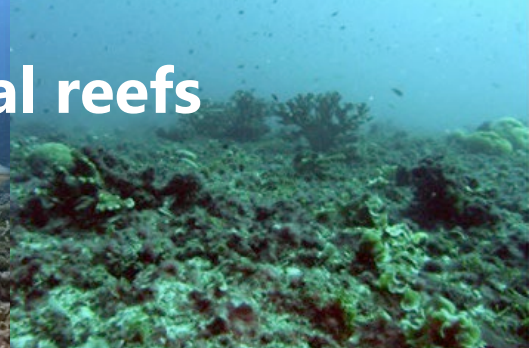
© UC Regents / LTER



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**Coral reefs**



**Oyster reefs**

SCDNR



**Sand dunes**

© Dave Ingram



**Seagrass**

© Orthia Marine



**Pelagic systems**

© UC Regents / LTER



**Mud flats**

**Saltmarshes**

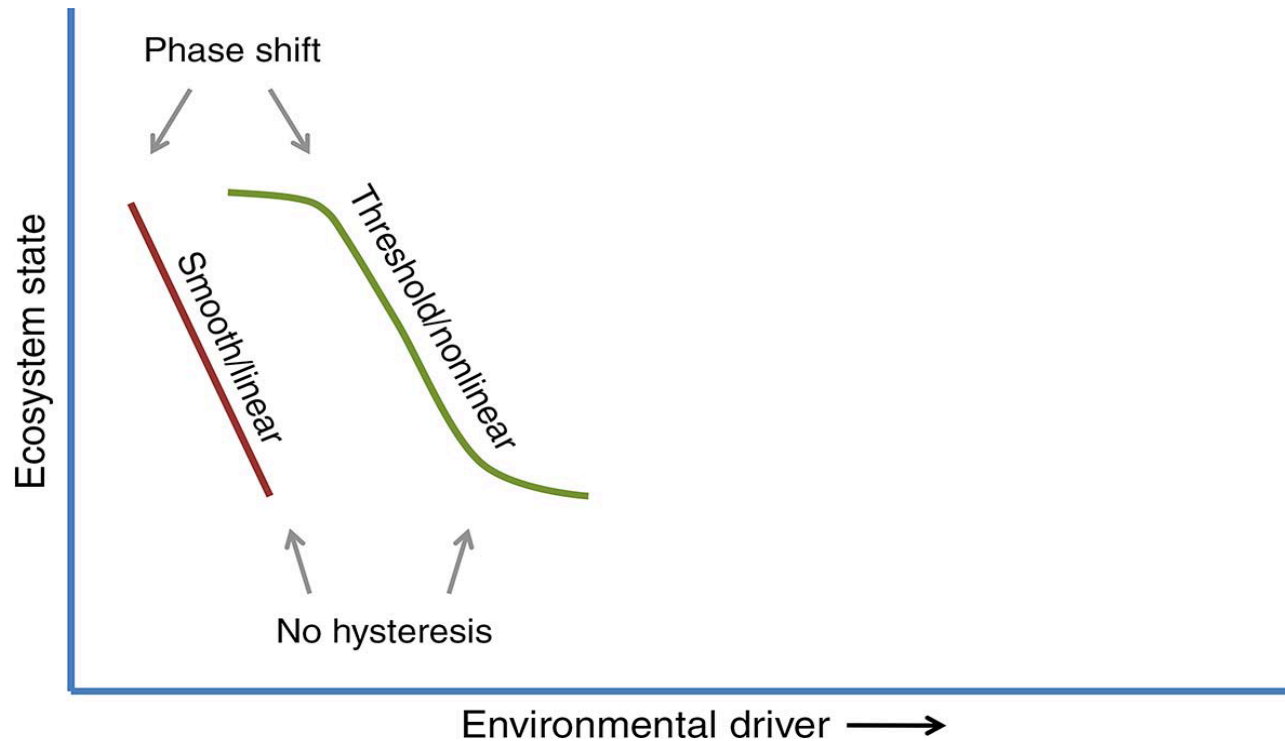


**Rocky intertidal**



**Estuaries**

# Tipping points can occur in multiple forms

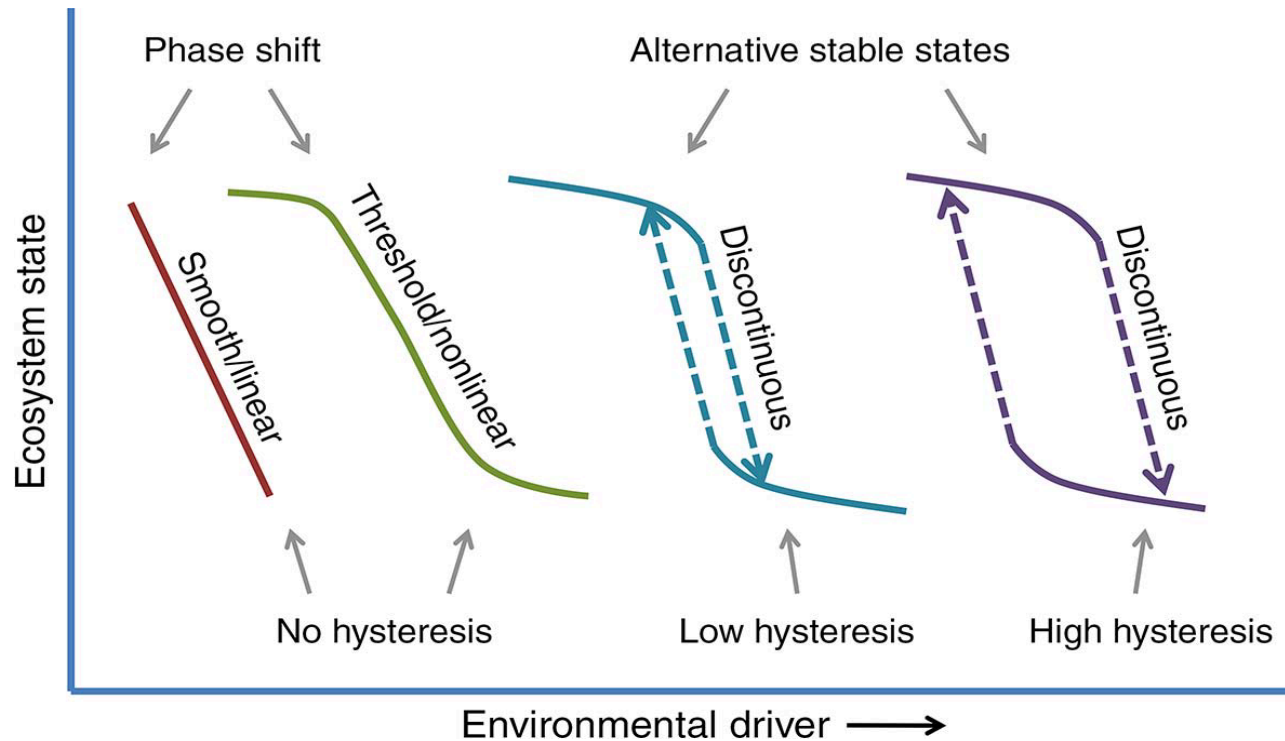


Driver exhibits threshold behavior that is tracked by the ecosystem response

Relationship is nonlinear



# Tipping points can occur in multiple forms



Driver exhibits threshold behavior that is tracked by the ecosystem response

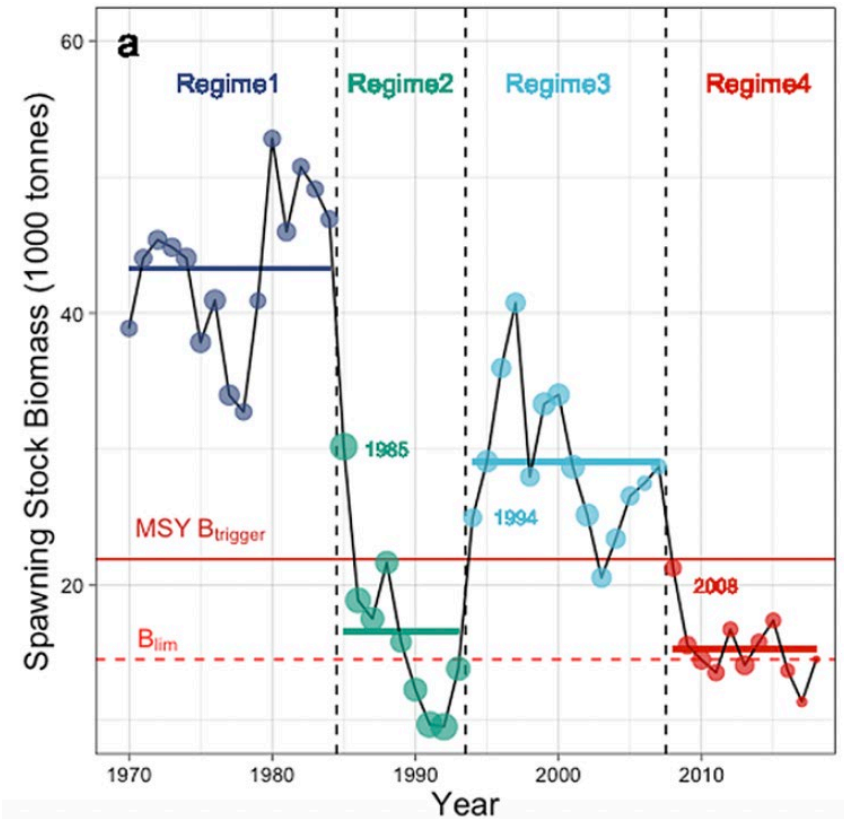
Relationship is nonlinear

Relationship is different after shift. Pathway to recovery is different.

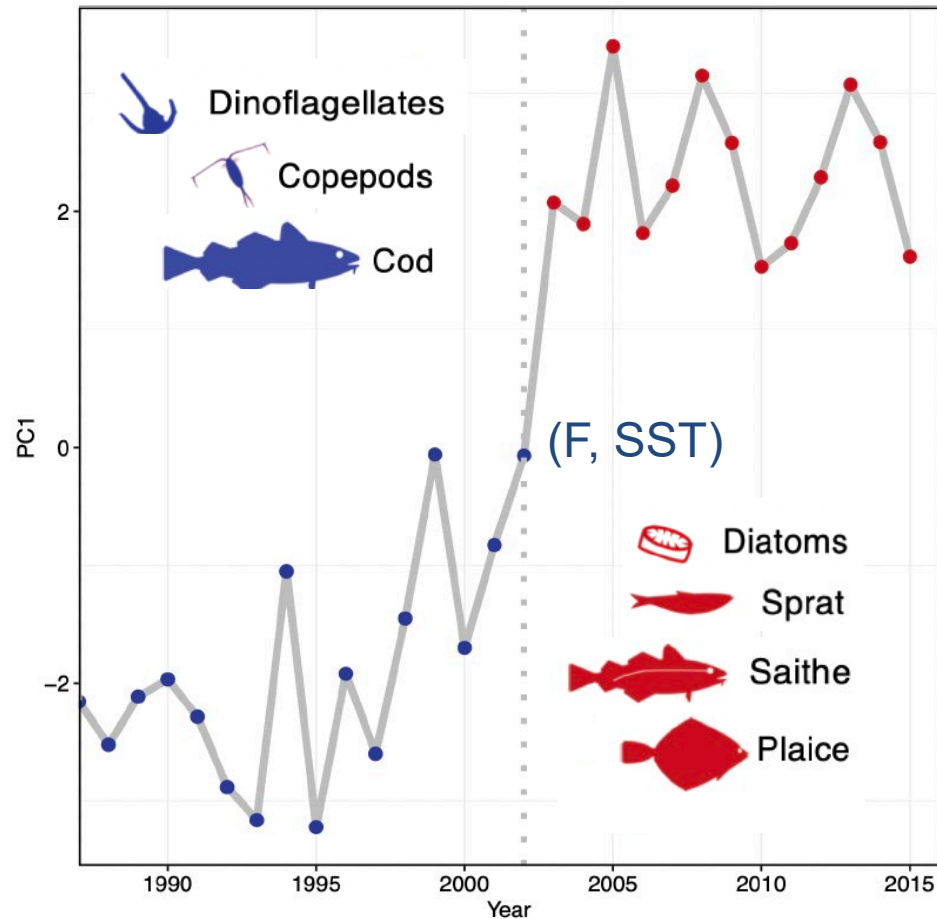
# scientific reports

## Tipping point realized in cod fishery

- Abrupt change in population variables (SSB, R, R/SSB)
- Nonstationary relationships among variables and external drivers (F, SST)
- Recently developed alternative stable state of low cod productivity (F, SST)
- Beyond a tipping point and unlikely to recover

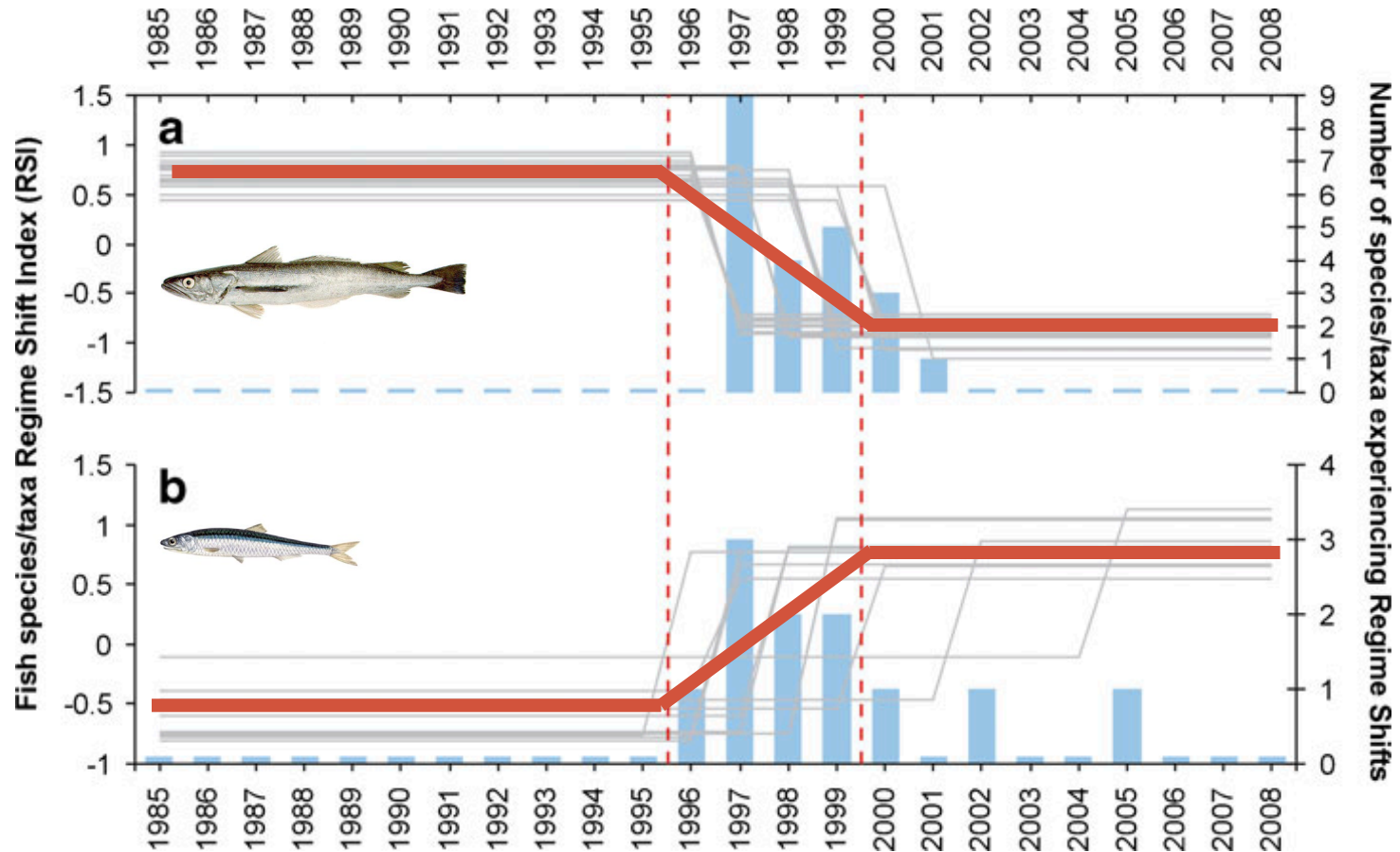


# Irreversibility of regime shifts in the North Sea

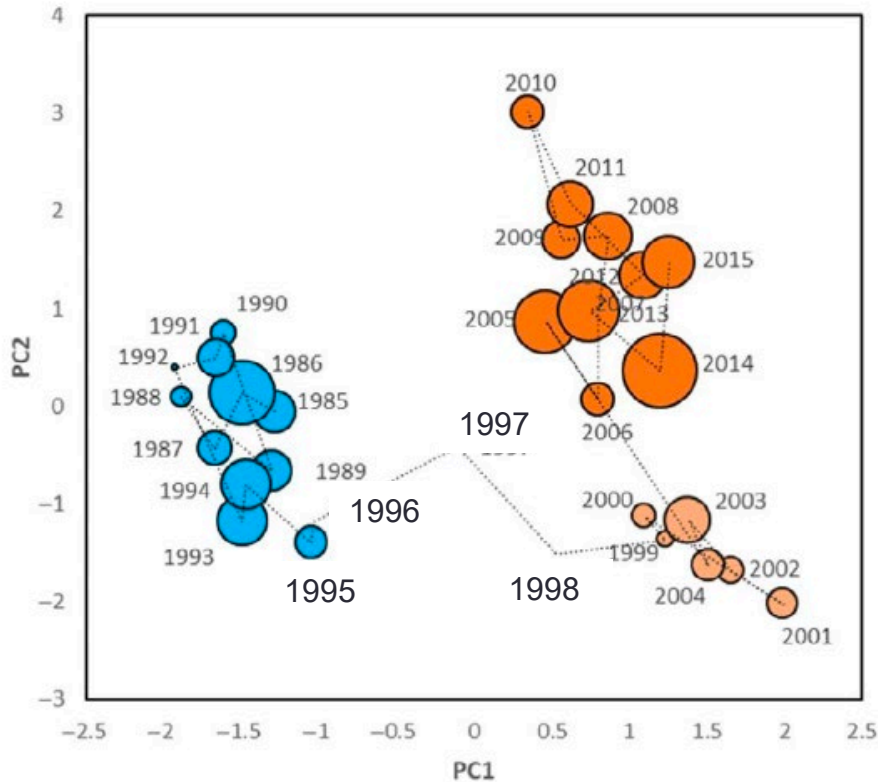


# Climatic Change

## Indications of a climate effect on Mediterranean fisheries



# An Integrated Traits Resilience Assessment of Mediterranean fisheries landings

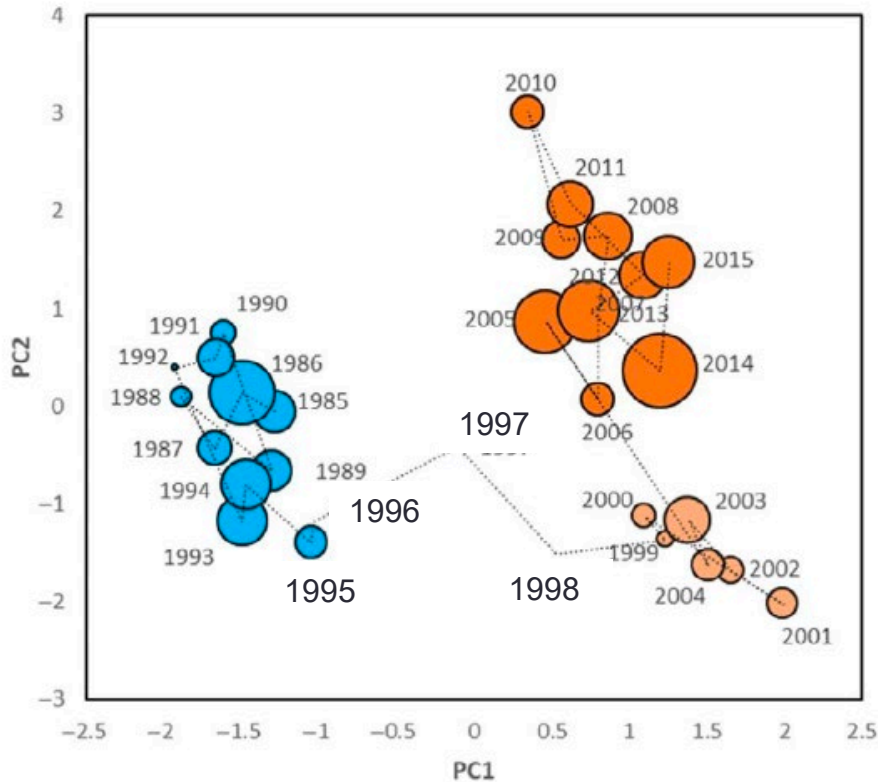


(-) PC1 loadings  
 Opt. temperature 15-20°C  
 Spawning period winter  
 Longevity > 20 years  
 Max. length > 1m  
 Diet piscivore  
 Opt. depth > 200 m



(+) PC1 loadings  
 Opt. temperature 25-30°C  
 Spawning period summer  
 Longevity 5-9 years  
 Max. length 20-50 cm  
 Diet planktivore  
 Opt. depth 50 - 200 m

# An Integrated Traits Resilience Assessment of Mediterranean fisheries landings



- Lagged nonstationary response to warming
- Shift did not interchange species with similar traits
- Implications for ecosystem functioning

(-) PC1 loadings  
 Opt. temperature 15-20°C  
 Spawning period winter  
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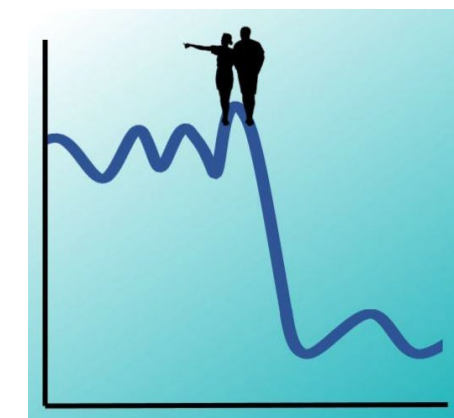
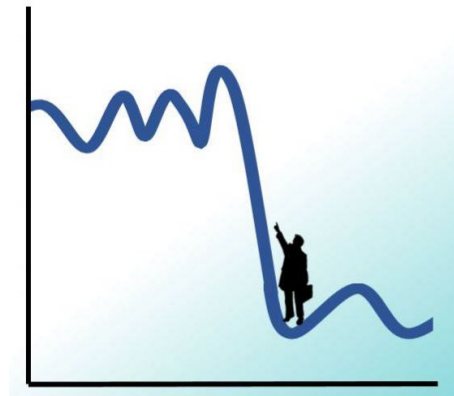


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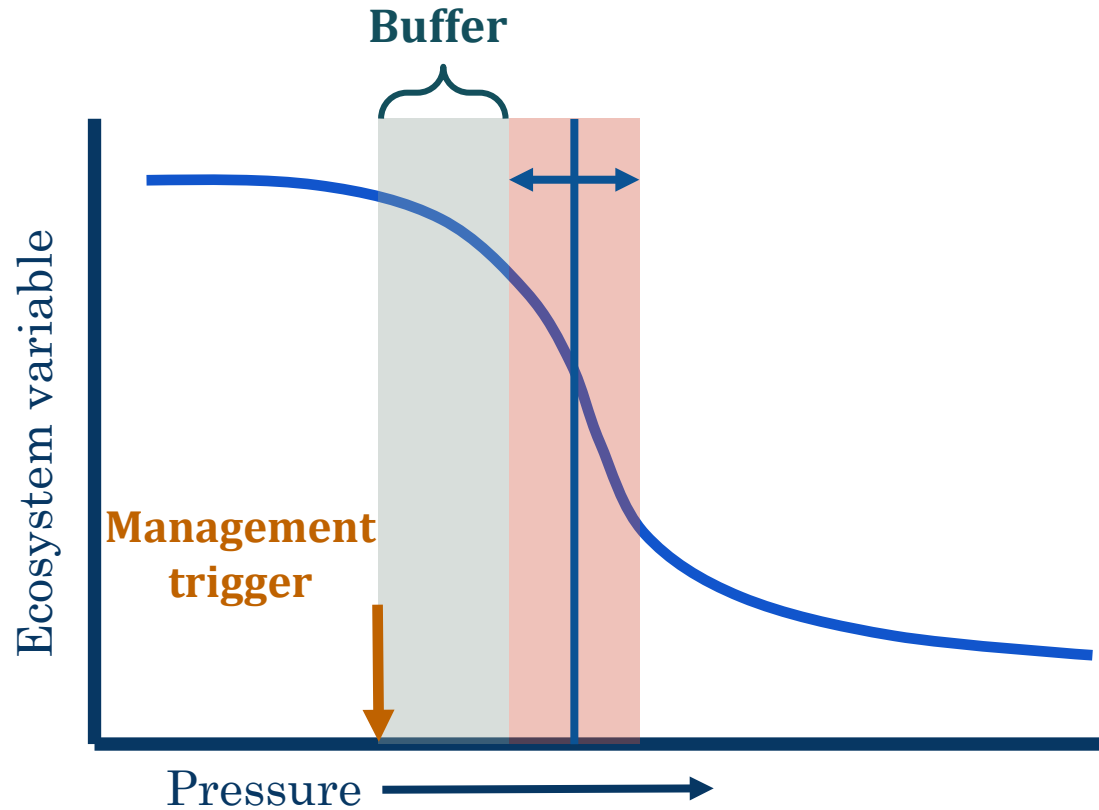
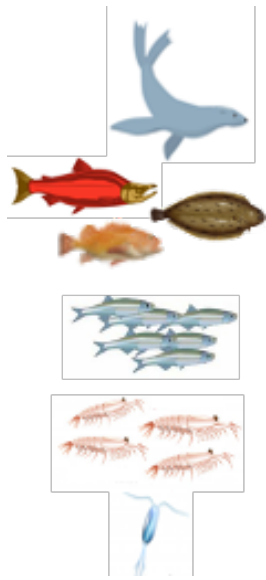
# Outline

Can we anticipate tipping points to better mitigate and adapt to the potential impacts

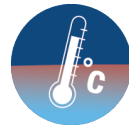
- Overview of tipping points
- **Ecological thresholds**
- Ecosystem state indicators
- Future directions



# Thresholds to help inform management strategies



Fishing Impacts



Temperature Increasing



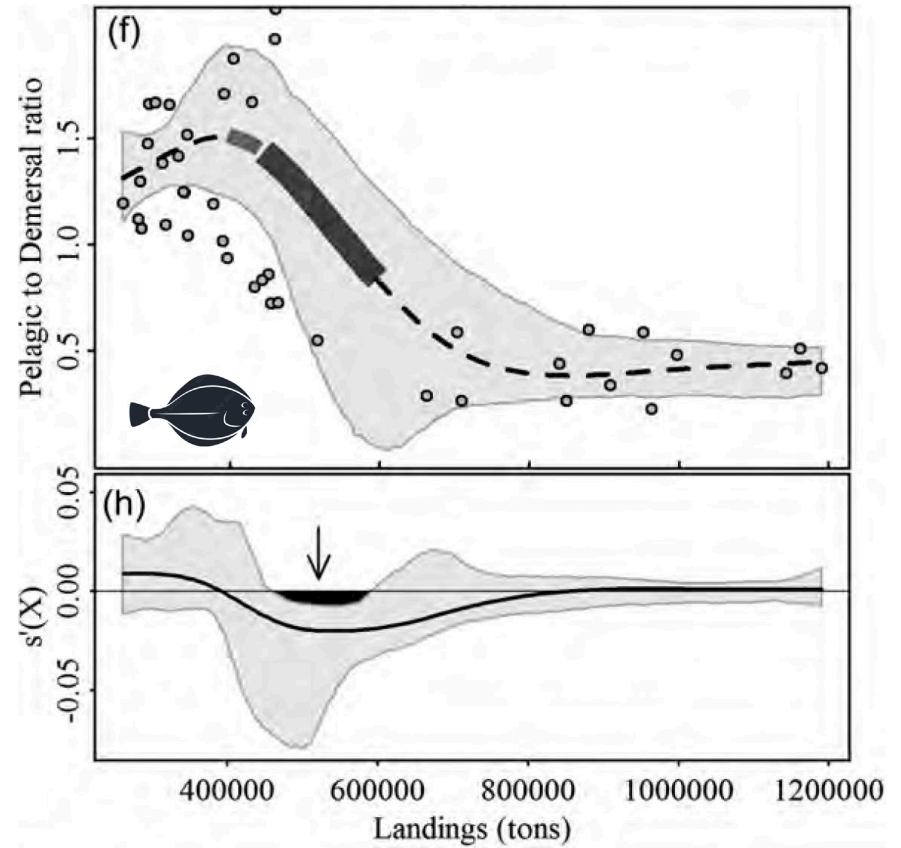
Ocean Acidification



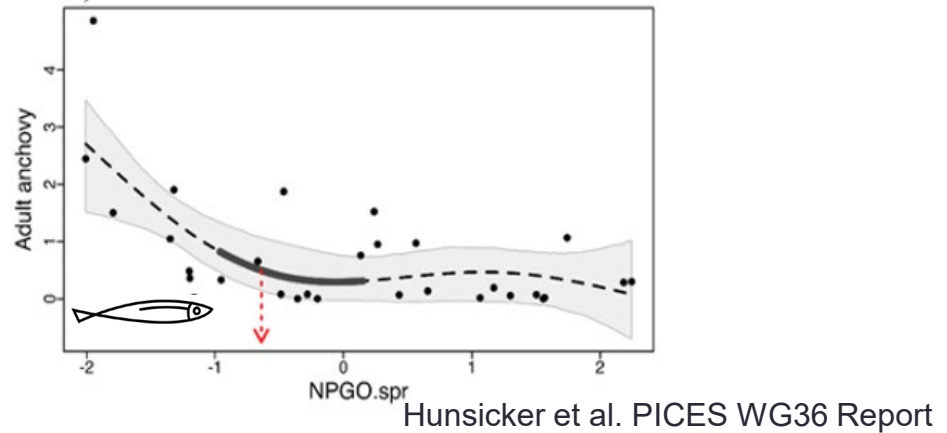
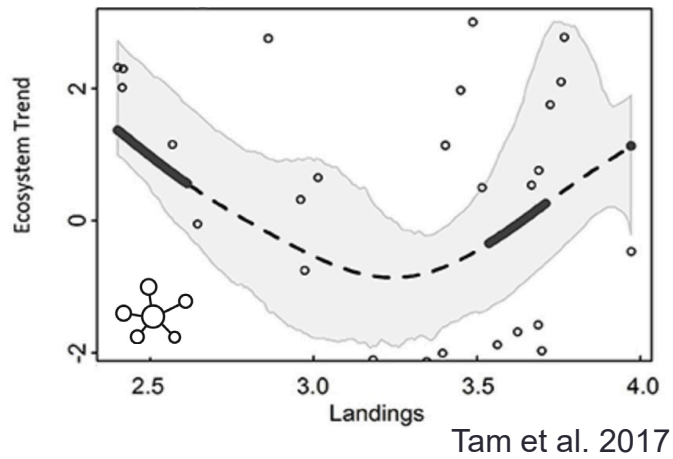
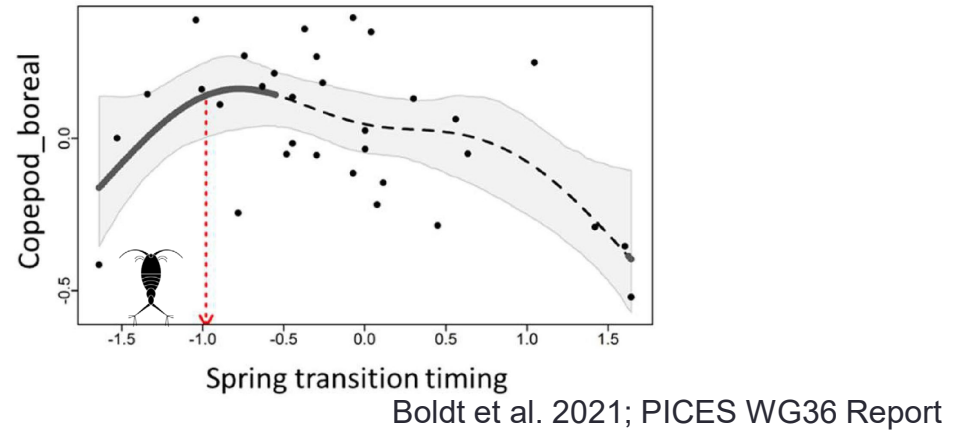
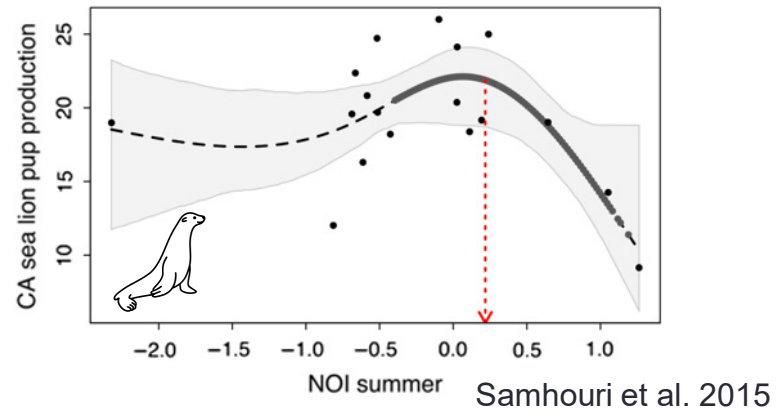
Hypoxia



# Evidence of ecological thresholds



Large et al. 2013 ICES JMS





**Threshold management works.** More explicit use of thresholds in management is strongly associated with better environmental outcomes

Kelly et al. 2014 Phil. Trans. Roy. Soc. B



How to increase uptake of thresholds in management?



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**Simulation studies** to demonstrate how incorporating thresholds in management applications could improve knowledge of risk and uncertainty



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**Sensitivity analyses** of threshold models to nonstationary dynamics, missing environmental info, observation error, etc.  
Where are thresholds robust or not?



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**Better communication and collaboration** around developing management on-ramps for information on thresholds

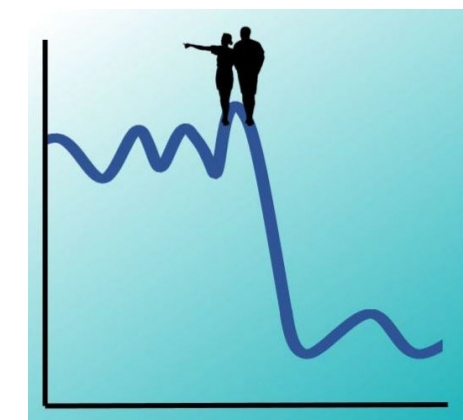
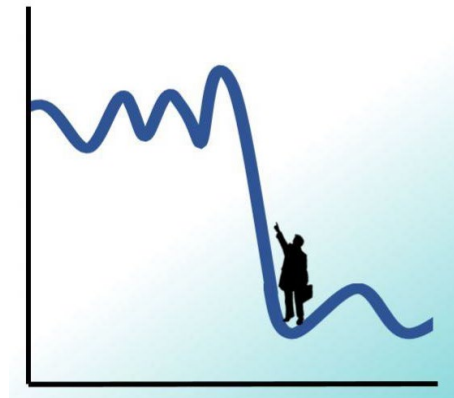




# Outline

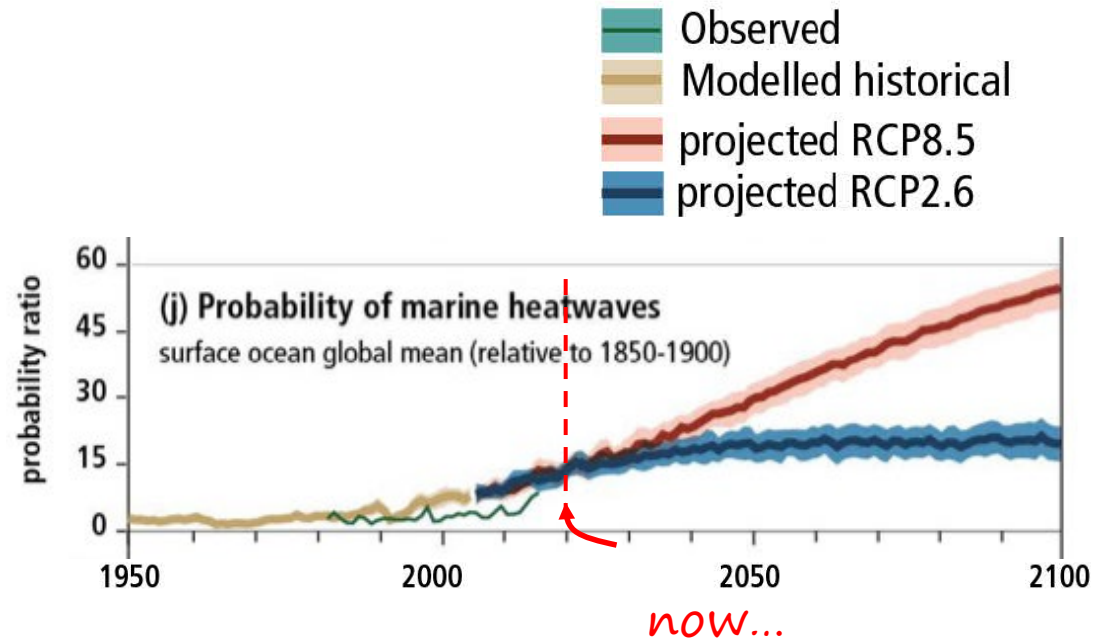
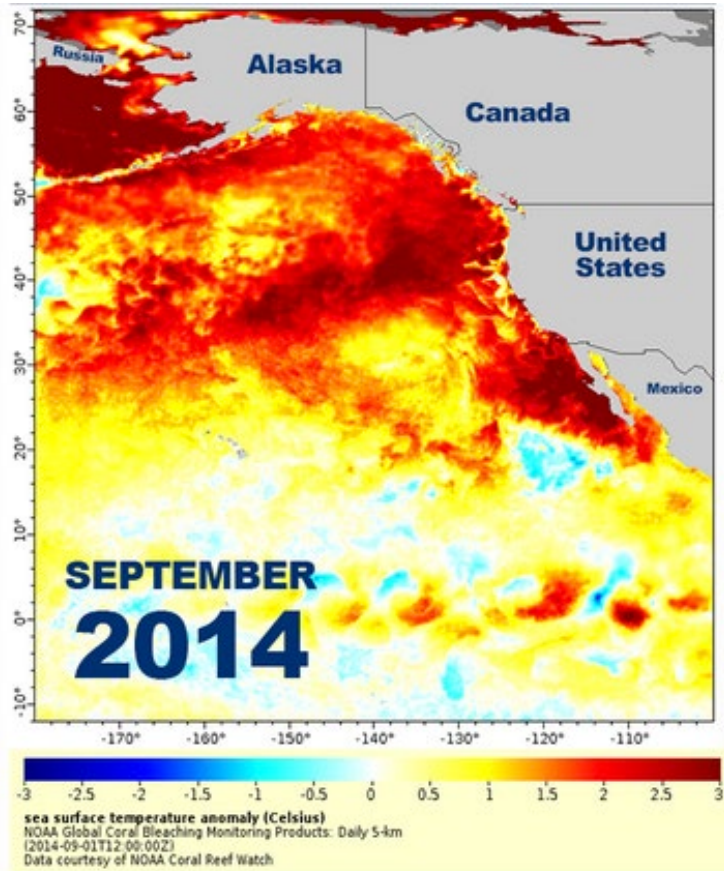
Can we anticipate tipping points to better mitigate and adapt to the potential impacts

- Overview of tipping points
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# Marine heatwaves in northeast Pacific

Sea surface temperature anomaly



IPCC 2019. The Ocean and Cryosphere in a Changing Climate, Fig SPM.1

# Will biological responses to warm ocean conditions result in ecosystem shift?

**Crab and clam fisheries closures due to domoic acid**



**Species range extensions / invasions**



**Record low returns / abundance / poor condition**



**Caspian terns abandon colony in mid-season**



# Ecosystem state index

- Evaluate changes in mean community state in response to climate perturbations
- Distinguish normal variability from changes signaling a major shift (i.e. reference points)
- Early detection of abrupt ecosystem-level changes



# Bayesian Dynamic Factor Analysis

Can we identify latent 'trends' that are useful as indices?

- Large changes in trends values indicate large changes in the underlying community of shared trends
- Handles missing values in time series
- Identify states/regimes in estimated shared trends
- Create one year ahead forecasts

'bayesDFA' R package on CRAN / Github

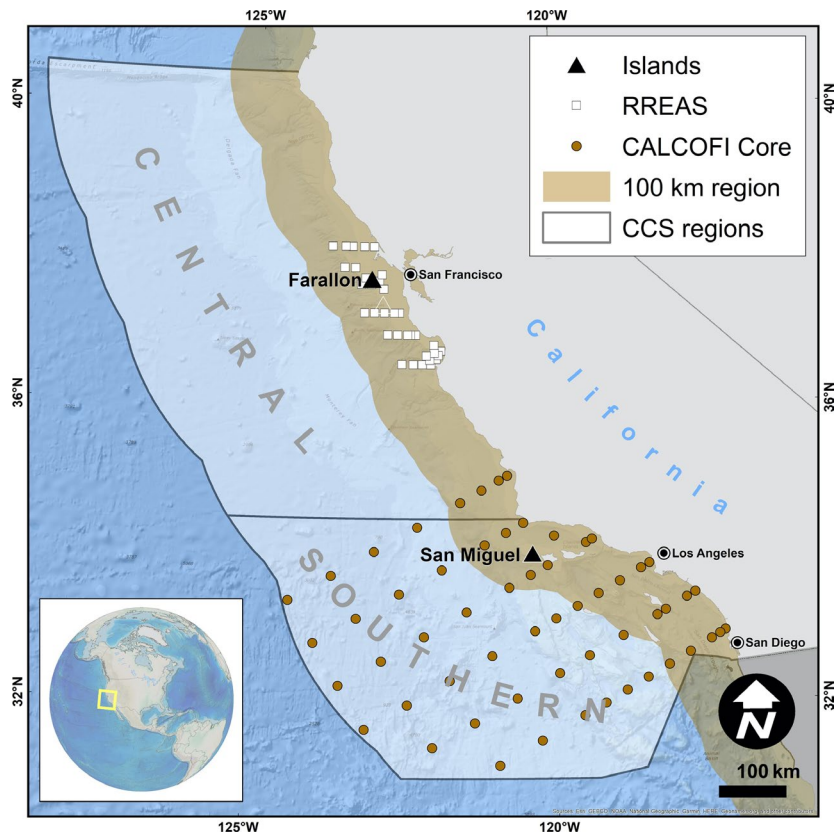
Ward et al. 2019, 2022

# Objectives

- Summarize environmental and biological variability in the southern and central regions of the CCE, evidence of regime shift?
- Identify relationships between community variability and climate variables
- Test our ability to create one-year ahead forecasts



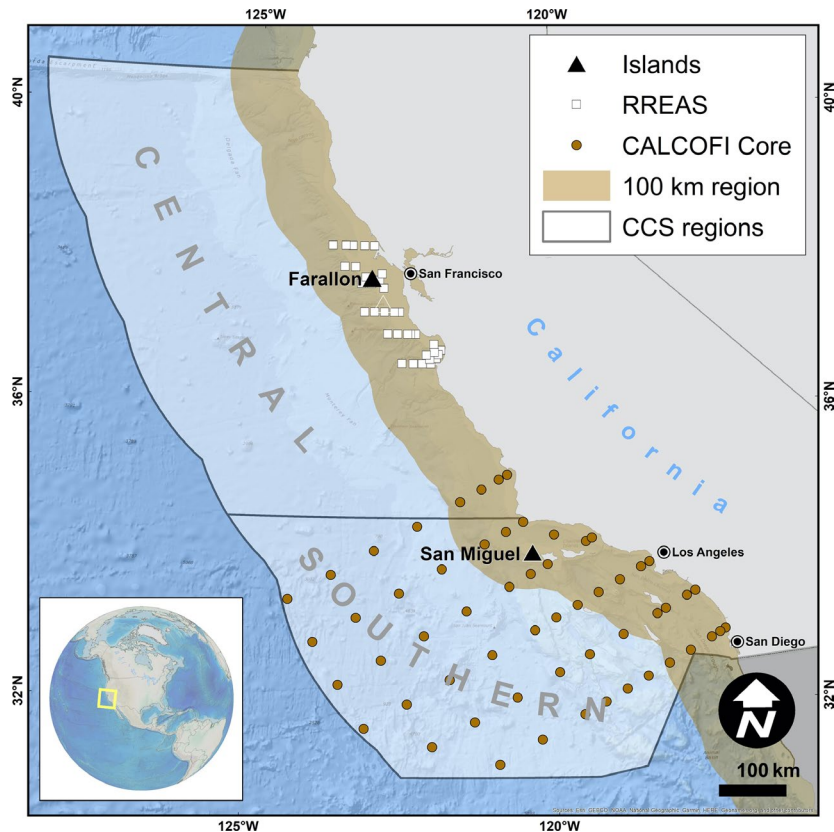
# South/Central California Current Ecosystem



## Data

- Short lag in response (0-1 years)
- 15+ year time series
- Sampled at least annually
- Short processing time

# South/Central California Current Ecosystem

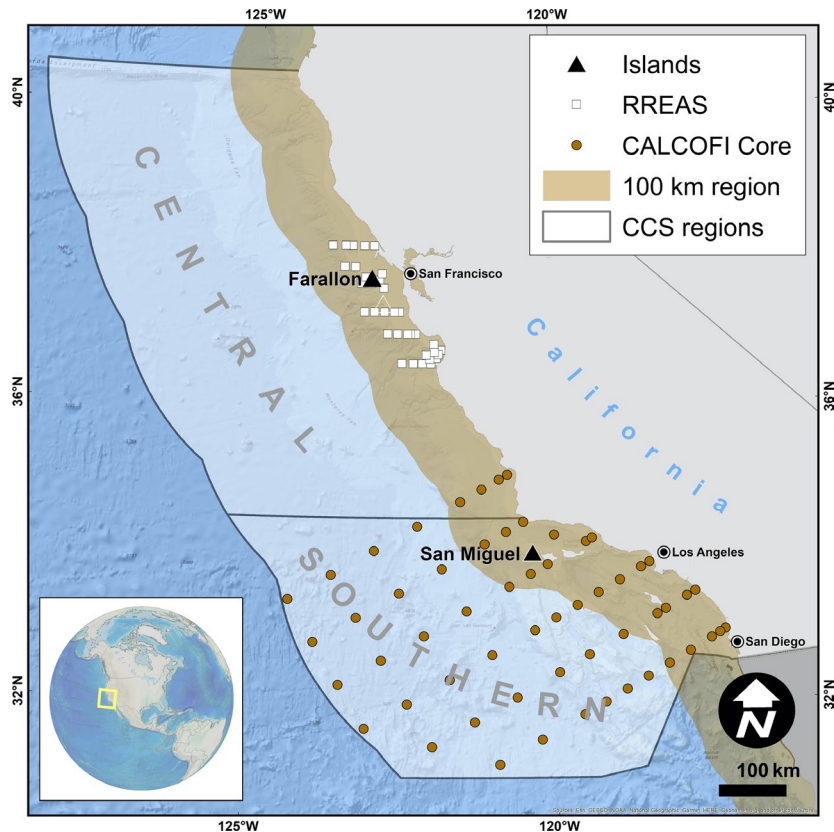


## Climate data (1980-2018)

- SST
- Sea surface height
- Isothermal layer depth
- Brunt-Vaisala frequency (stratification)
- CUTI (Upwelling)
- BEUTI (Nitrate flux)



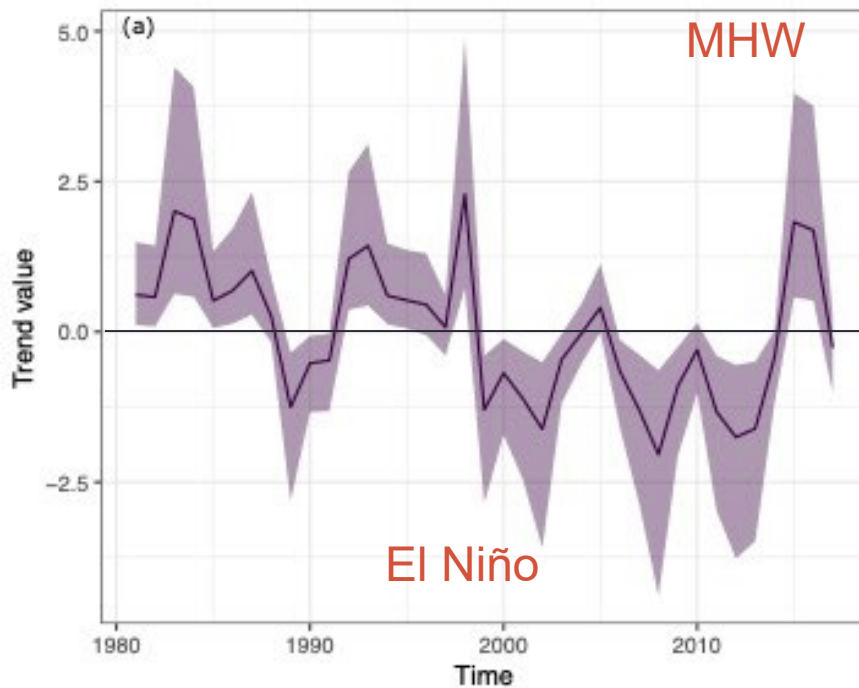
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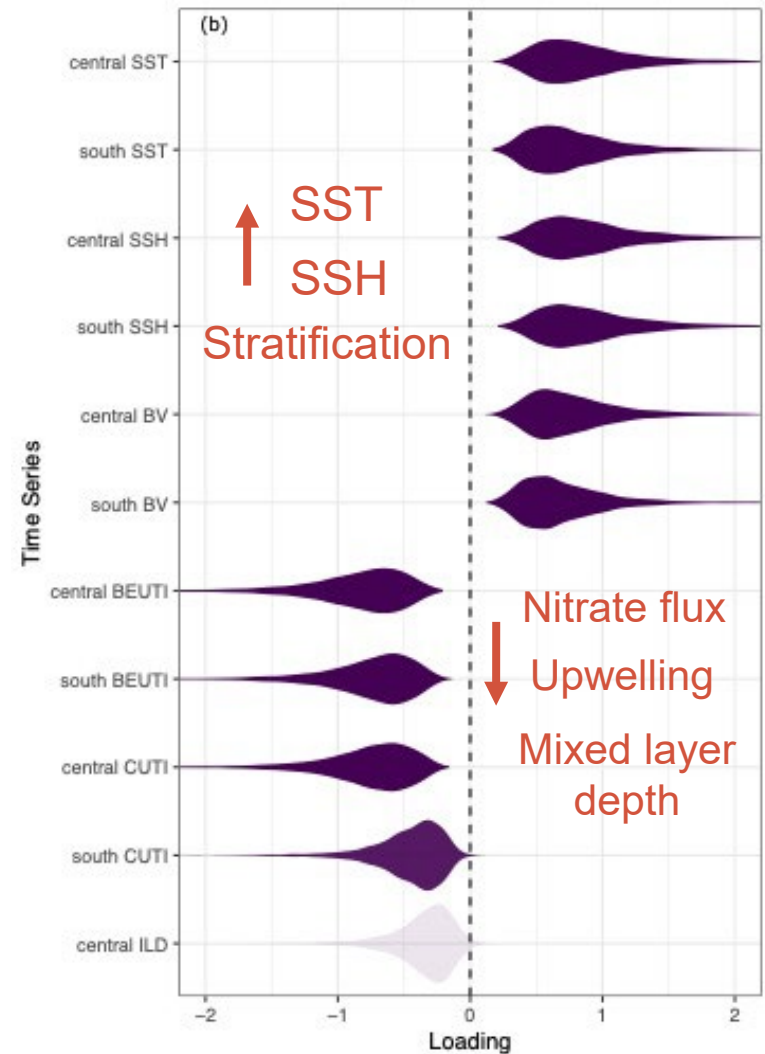
## Biology data

- Ichthyoplankton (1951-2016)
- Juvenile rockfish, groundfish, squid and krill (1990-2016)
- Seabird productivity (1971-2016)
- Sea lion pup growth, count, weight (1997-2016)

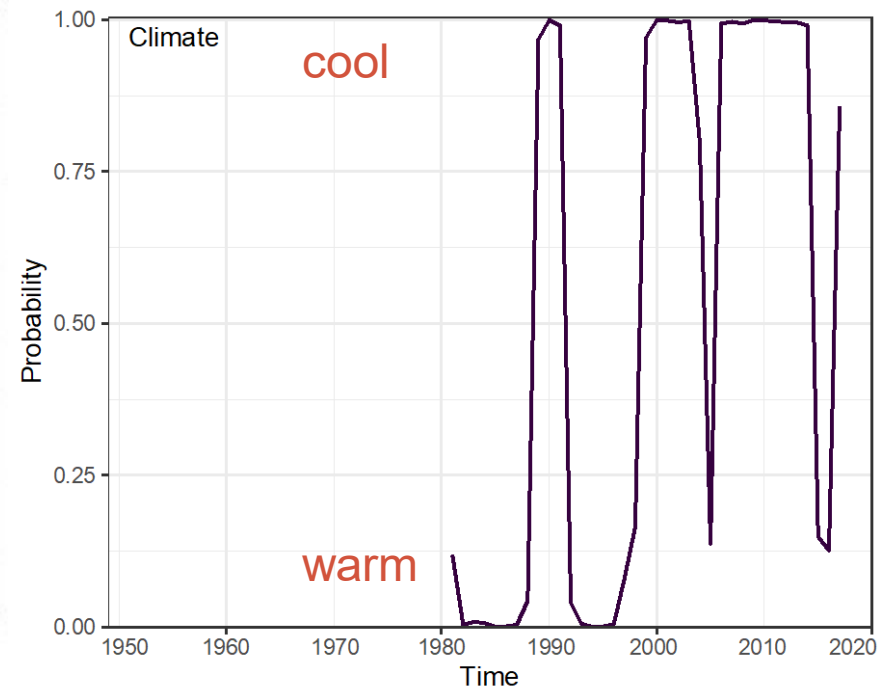
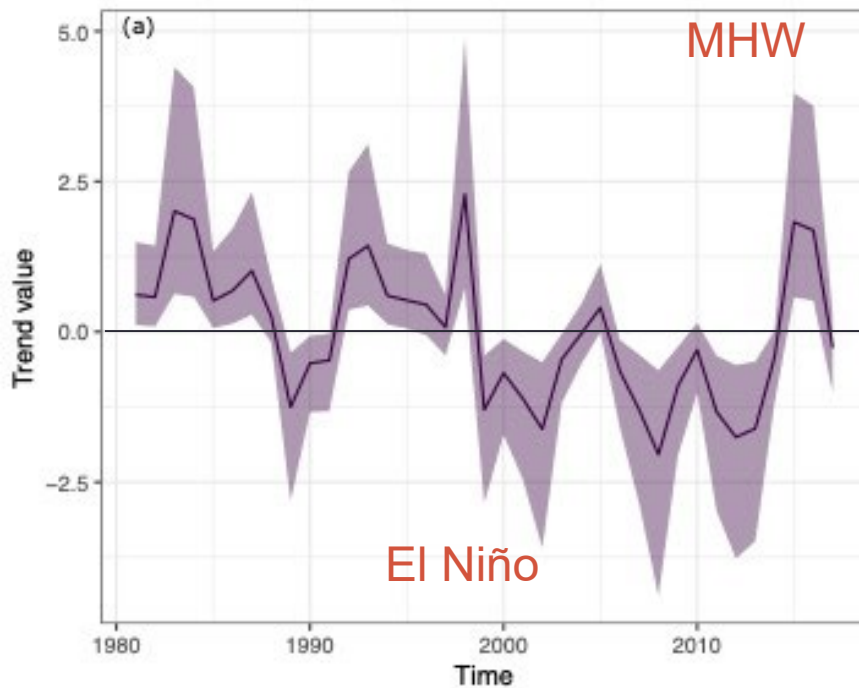
# Climate trend captured cooling period, El Niño events, and MHW



Shared trend with 95% credible intervals



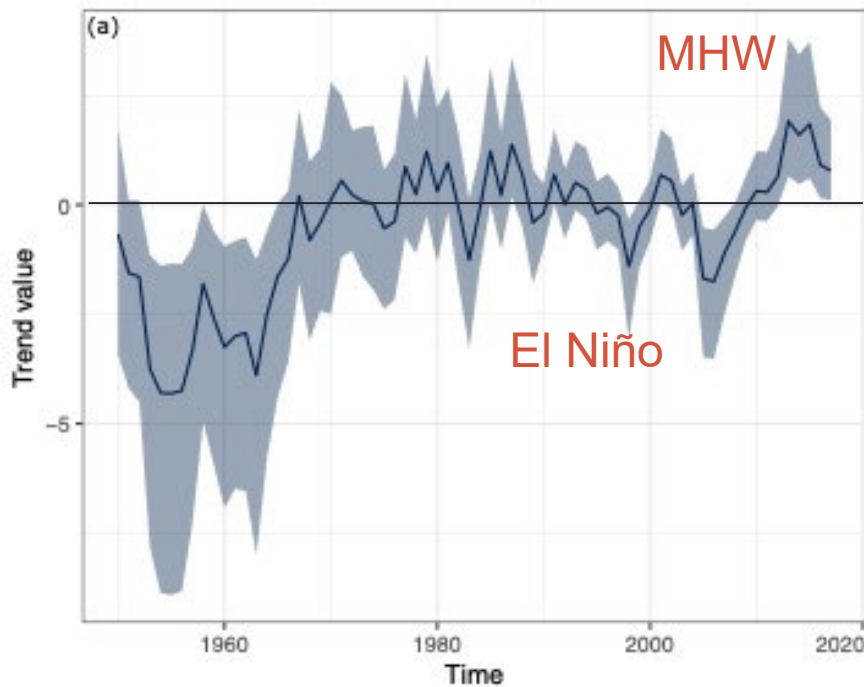
# Presence of two states, warmer versus cooler conditions



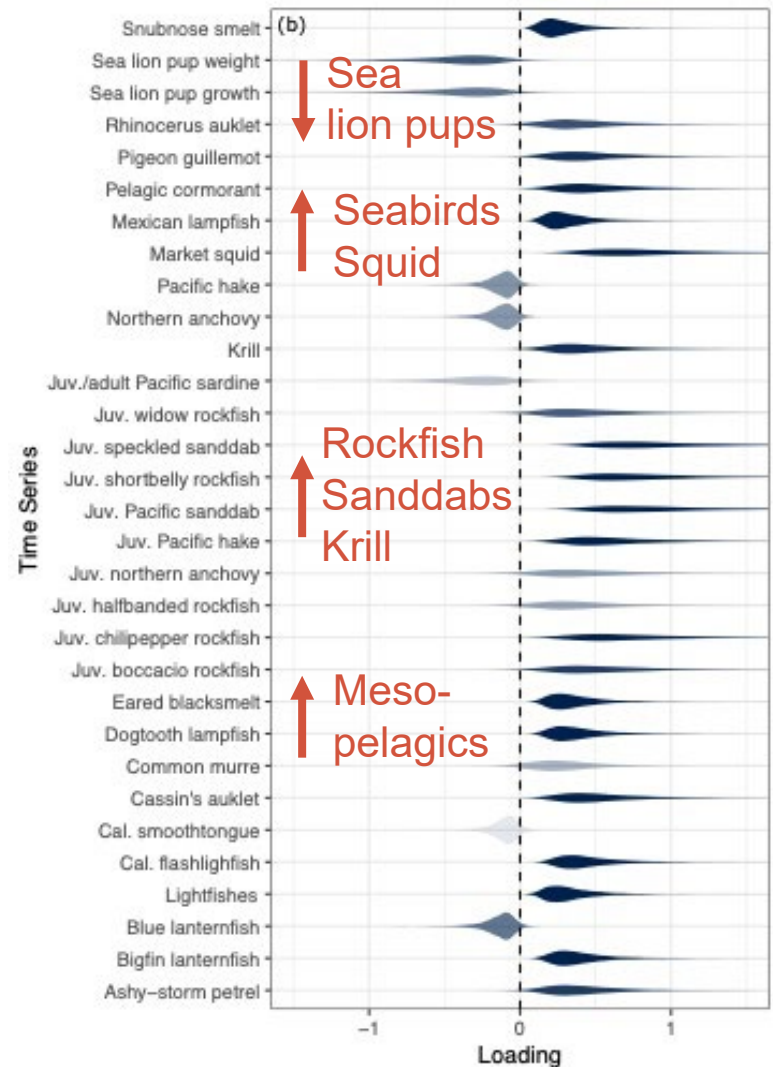
Shared trend with 95% credible intervals

Assigns a probability of shared trends being in a particular state (median, 95% CI)

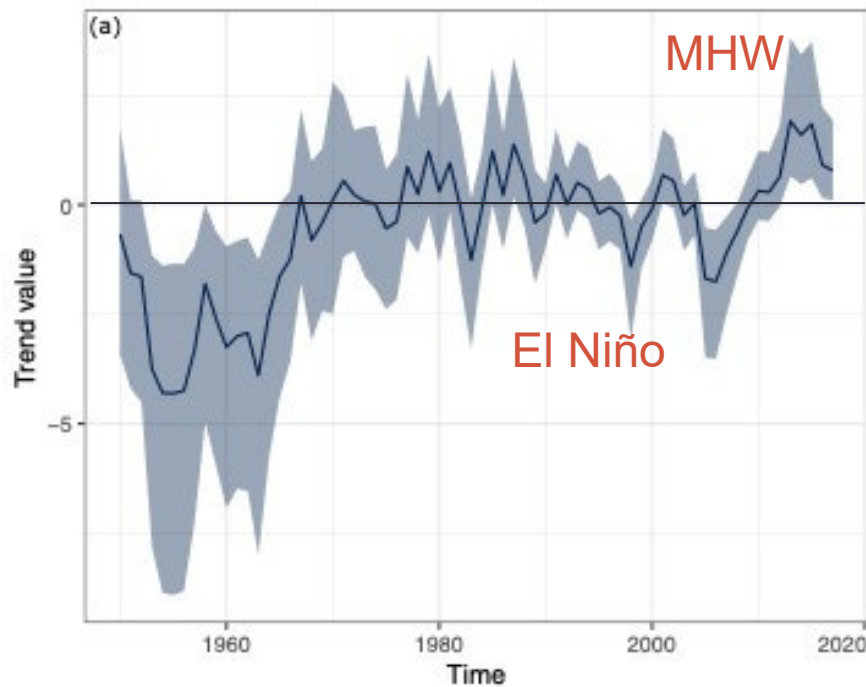
# Strong deviations in community trend around the time of El Niño events, and MHW



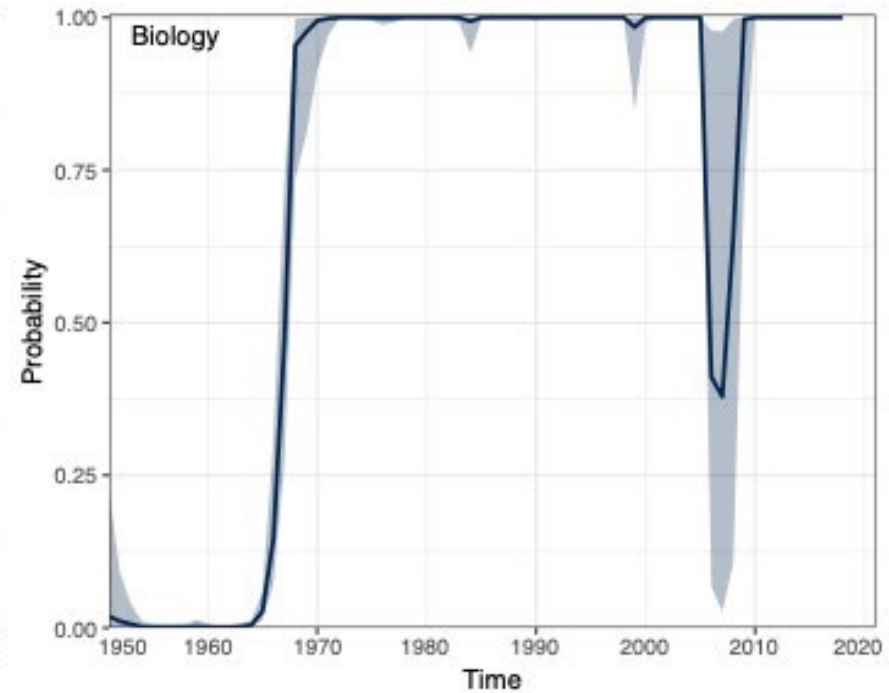
Shared trend with 95% credible intervals



## Evidence for regime shift in 1960s, not after MHW



Shared trend with 95% credible intervals

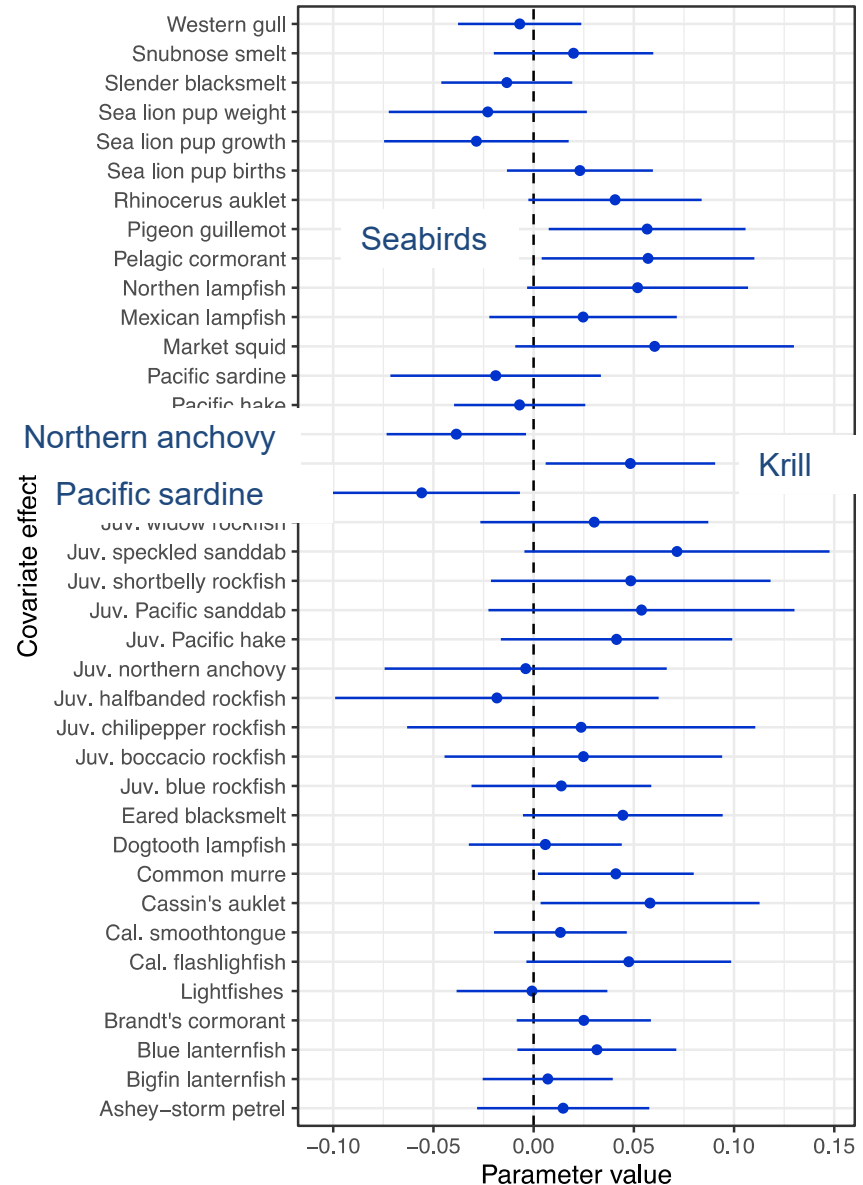


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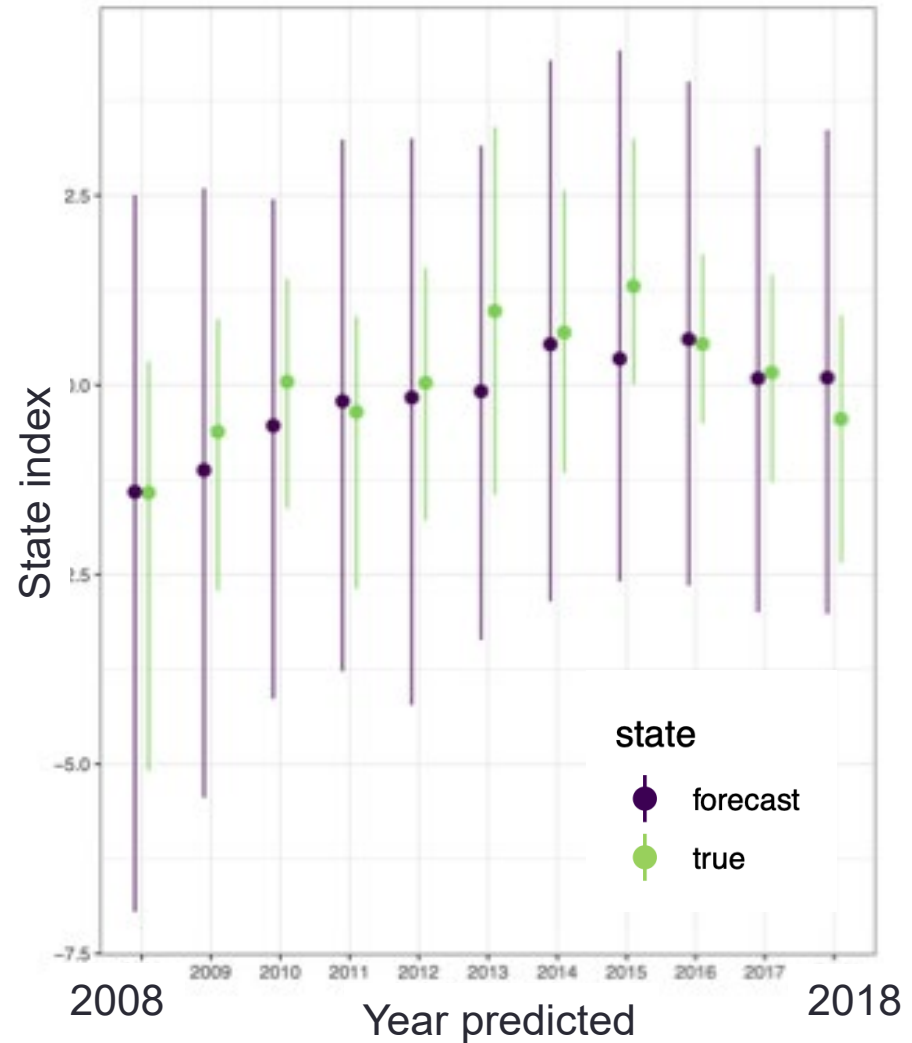
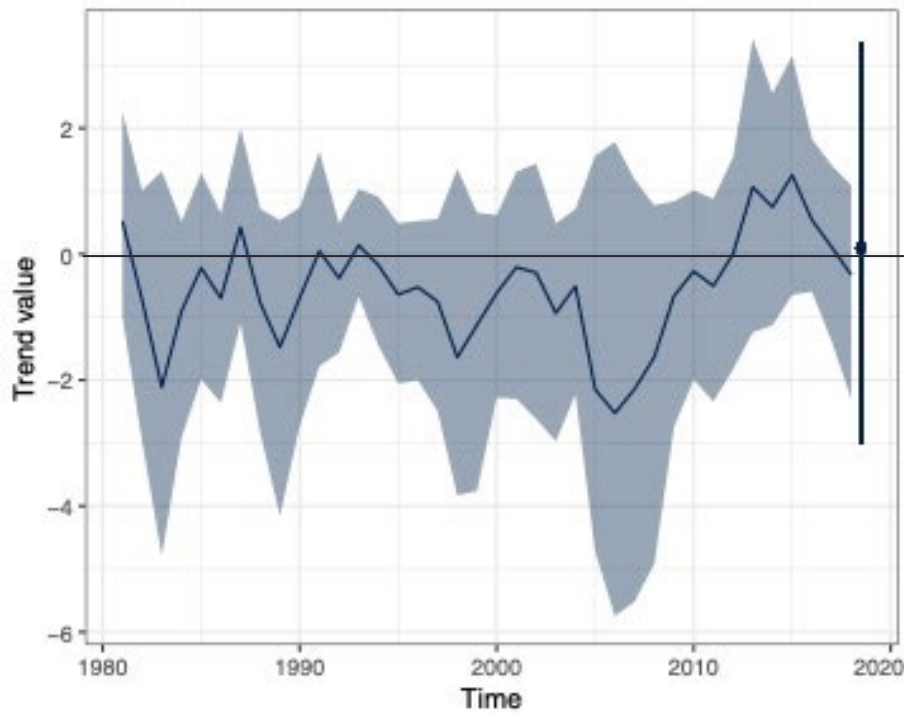
# One year ahead forecasts of ecosystem state

Nitrate flux exhibited strongest relationship with species and community-level responses

Model	Process sigma	Trends	ELPD	SE ELPD	Covariate	Region
<b>1</b>	<b>No</b>	<b>1</b>	<b>-1878.71</b>	<b>71.52</b>	<b>BEUTI</b>	<b>central</b>
2	No	1	-1905.27	81.98	CUTI	central
3	No	1	-1914.62	83.22	ILD	south
4	No	1	-1927.33	88.26	SST	south
5	No	1	-1928.03	88.39	BV	south
6	No	1	-1946.75	86.33	SSH	south
7	No	1	-1951.44	73.59	None	-
8	Yes	1	-2038.71	91.44	None	-



Forecasts of community trend for ten additional years indicate some skill for many of the years tested



# Future Directions

- Evaluate multiple covariates at the same time
- Apply analysis to other NE Pacific ecosystems
- Tailor to particular species, improve predictions of recruitment /survival?
- Evidence of nonstationary relationships in California Current



Image: [marineresearch.oregonstate.edu](http://marineresearch.oregonstate.edu)



# Concluding remarks

- Tipping points science to mitigate and adapt to impacts, especially in the face of climate change



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- Tools to track and forecast ecosystem shifts can help inform better, more rapid management decisions



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- Tipping points science to mitigate and adapt to impacts, especially in the face of climate change
- Ecological thresholds, even if somewhat rare, are worthwhile to detect due to risks of missing them
- Tools to track and forecast ecosystem shifts can help inform better, more rapid management decisions
- Nonstationary relationships challenge our ability to anticipate thresholds and forecast ecosystem change



Thank you!



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