# Assessing the Reliability of Species Distribution Models (SDMs) in the Face of Climate and **Ecosystem Regime Shifts: How Common is Non-Stationarity?**

# Introduction

- Species distribution models (SDMs) are a common tool for projecting how climate change impacts living marine resources.
- SDMs assume stationary relationships between organisms and the environment.
- This assumption was violated during the 2014-2016 marine heat wave affecting the California Current System (Muhling et al., 2020).

How frequently has non-stationarity been observed during previous climate and ecosystem regime shifts? Methods **Target Species** Northern anchovy Jack mackerel Pacific sardine **Environmental variables** Salinity (S), Dissolved oxygen Temperature (T), **Zoo-** $(0), \frown$ plankton displacement volume (Z)

**Types of SDMs:** Generalized Additive Models (GAMs; max. 4 knots), Non-Parametric Probabilistic Ecological Niche (NPPEN) models (Beaugrand *et al.*, 2011)

**Types of Regime Shifts:** 1) Pacific Decadal Oscillation (PDO); 2) Change points in detected in time series of environmental variables and fish spawning stock biomass (SSB) with Ruggieri (2013) algorithm

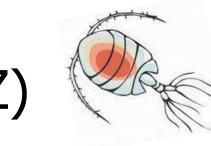
# Rebecca G. Asch, East Carolina University, Department of Biology, Greenville, NC. Email: aschr16@ecu.edu. 🔅 ECU

# Results









## **Change Point Detection:** Change points were

detected in the time series of: 1) Zooplankton volume in 1968 and 1983; 2) Anchovy SSB in 1963; 3) Sardine SSB in 1963 and 1997.

### **Assessment of Non-Stationarity:** Incidents of

non-stationarity associated with regime shift were assessed with six metrics. White = stationary relationship; Purple = non-stationarity; Grey = N/A

Ancho	vy						Ch	uh			Ja				
	vy							ub			ימין				
- ~			129	Sardine				mackerel				mackerel			
S	0	Ζ	T	S	0	Ζ	T	S	0	Ζ	T	S	0	Ζ	
		earity										SOZTSOZTSOZT BANK SOZTSOZT Barity			

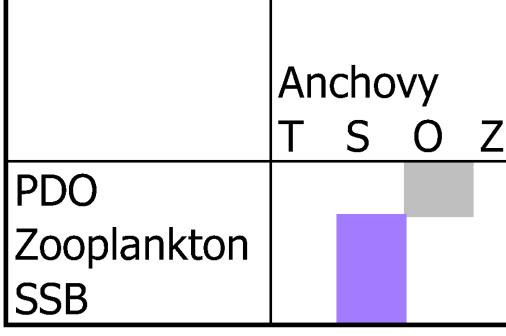
Metric 2: Li	nea	arity	Y														
										ub			Jao	ck			
	An	Anchovy			Sa	Sardine				mackerel				mackerel			
	Т	S	0	Ζ	Т	S	0	Ζ	Т	S	0	Ζ	T	S	0	Ζ	
PDO																	
PDO Zooplankton																	
SSB																	

Metric 3: Ra	Metric 3: Rank order of deviance explained															
	Δr	Anchovy				rdir	ופ			iub acke	erel		Jack mackerel			
			-	Ζ				Ζ								Ζ
PDO																
Zooplankton SSB																

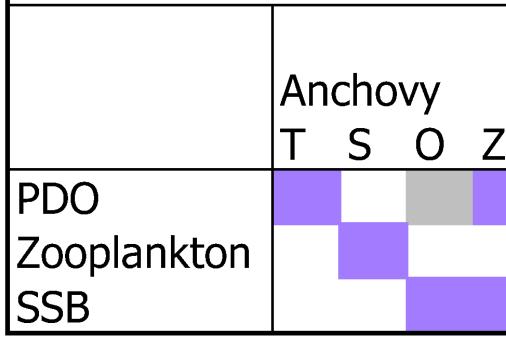
# Matria A. Desmanas auros abana

Metric 4: Re	esp	ons	se c	curv	e s	sna	pe										
									Ch				Ja				
	An	Anchovy S				Sardine				mackerel				mackerel			
	Т	S	0	Ζ	T	S	0	Ζ	Т	S	0	Ζ	Т	S	0	Ζ	
PDO Zooplankton																	
Zooplankton																	
SSB																	

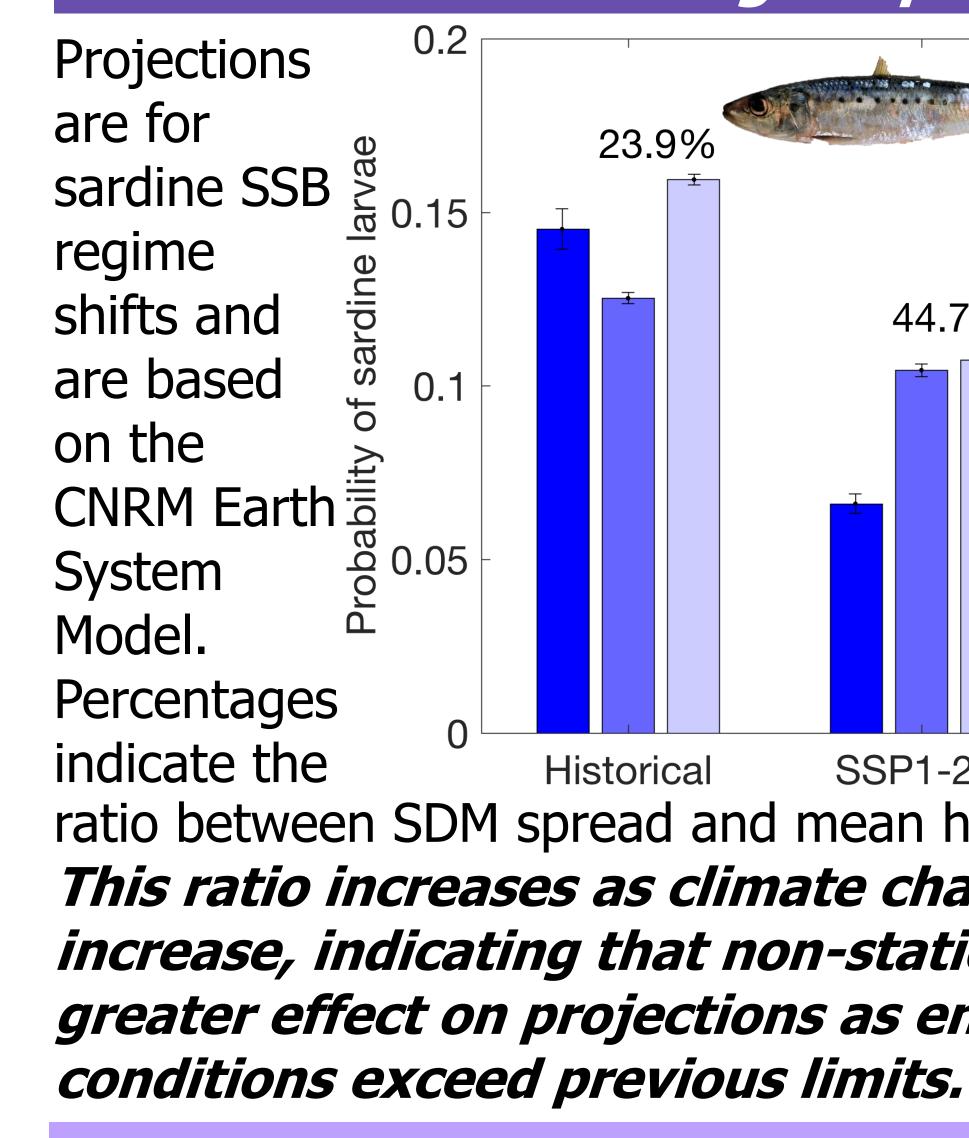
### Metric 5: Degree of res



### Metric 6: Preferred env



### How could this affect projections of future climate change impacts?

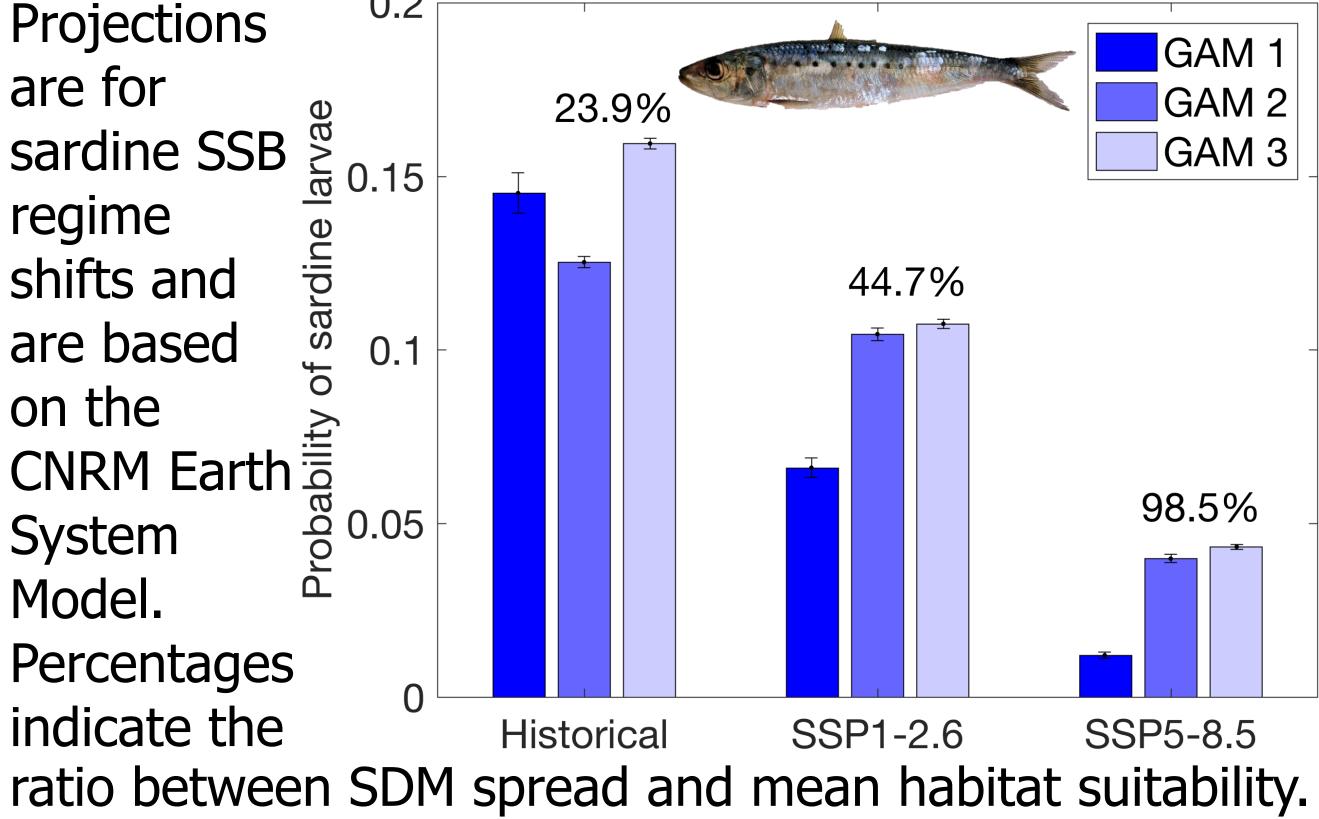


Beaugrand G., Lenoir S., Ibañez F., Manté C. 2011. A new model to assess the probability of occurrence of a species, based on presence-only data. Mar Ecol Prog Ser 424:175-190. Muhling B.A., Brodie S., Smith J.A., Tommasi D., et al. 2020. Predictability of species distributions deteriorates under novel environmental conditions in the California Current System. Front Mar Sci 7:589 Ruggieri E. 2013. A Bayesian approach to detecting change points in climatic records. Int J Climatol 33:520-528.



sp	ponsiveness														
					Ch	ub			Jack						
	Sar	din	e		ma	acke	erel		mackerel						
7	Т	S	0	Ζ	Т	S	0	Ζ	Т	S	0	Ζ			

vi	ron	me	nta	l ra	ng	е								
					Ch	ub			Jack					
	Sar	din	е		ma	cke	rel		mackerel					
7	Т	S	0	Ζ	Т	S	0	Ζ	Т	S	0	Ζ		



This ratio increases as climate change impacts increase, indicating that non-stationarity has a greater effect on projections as environmental

### References