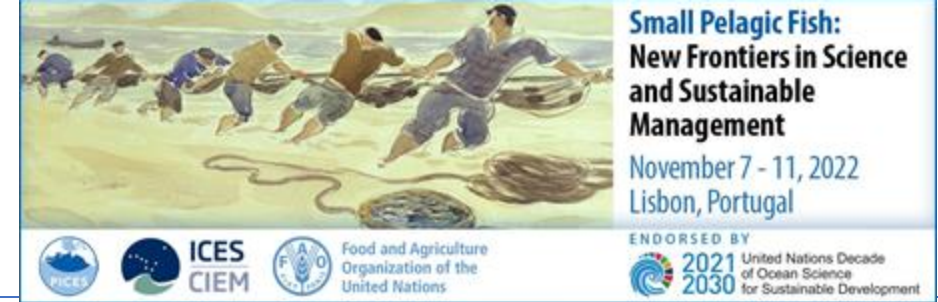


PRODUCT FROM PICES/ICES SMALL PELAGIC FISH CONFERENCE

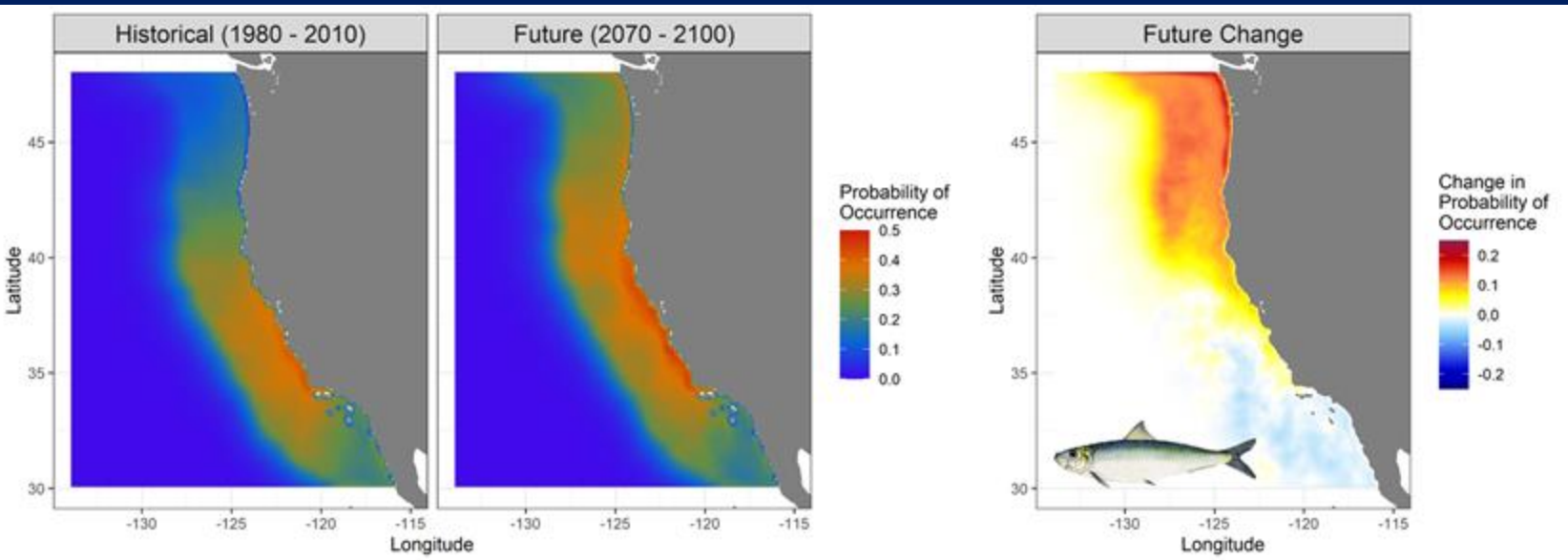


Coupling small pelagic fish distribution models to complex ecosystem models: tools and choices to support ecosystem-based fishery management and climate assessment

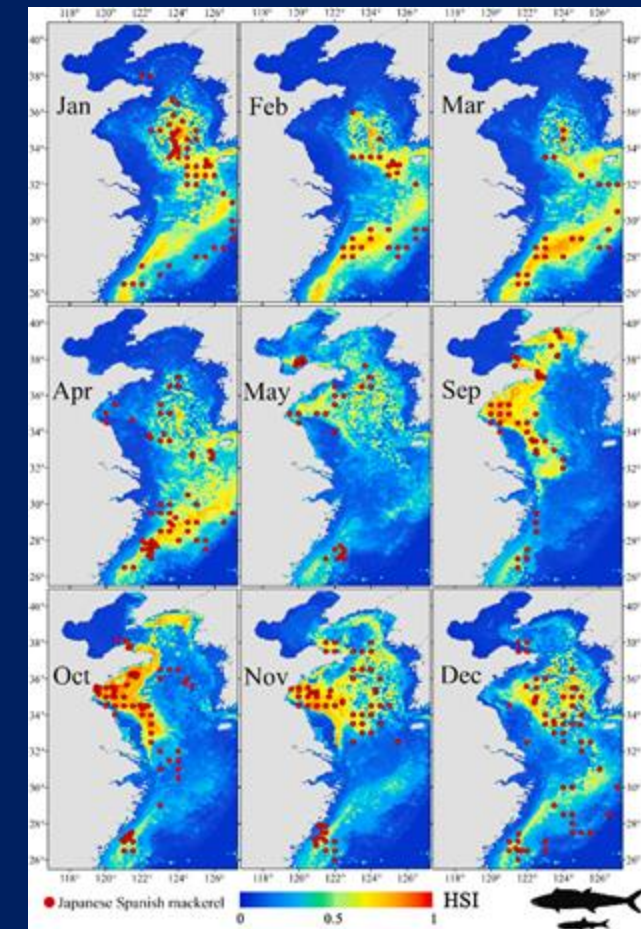
Isaac C. Kaplan, Elliott L. Hazen, Stefan Koenigstein, Nerea Lezama-Ochoa, Mariana Hill Cruz, Pierre-Yves Hervann, Owen R Liu, Dylan G.E. Gomes, Sebastian I. Vásquez, Criscely Lujan, Stephanie Green, Matthew R. Baker, Ricardo Oliveros-Ramos, Alberto Rovellini, Rebecca G. Asch, and Barbara Muhling

Identify best practices for the detailed decisions (“the devil’s in the details”) required to couple the burgeoning field of species distribution models (SDMs) to more complex multispecies and end-to-end models such as Ecospace, Ecosim, Atlantis, OSMOSE, EcoOcean, and MICE models

Species distribution shifts by decade and season: Coastal pelagic species



Projected shifts in April sardine distribution
Muhling et al.

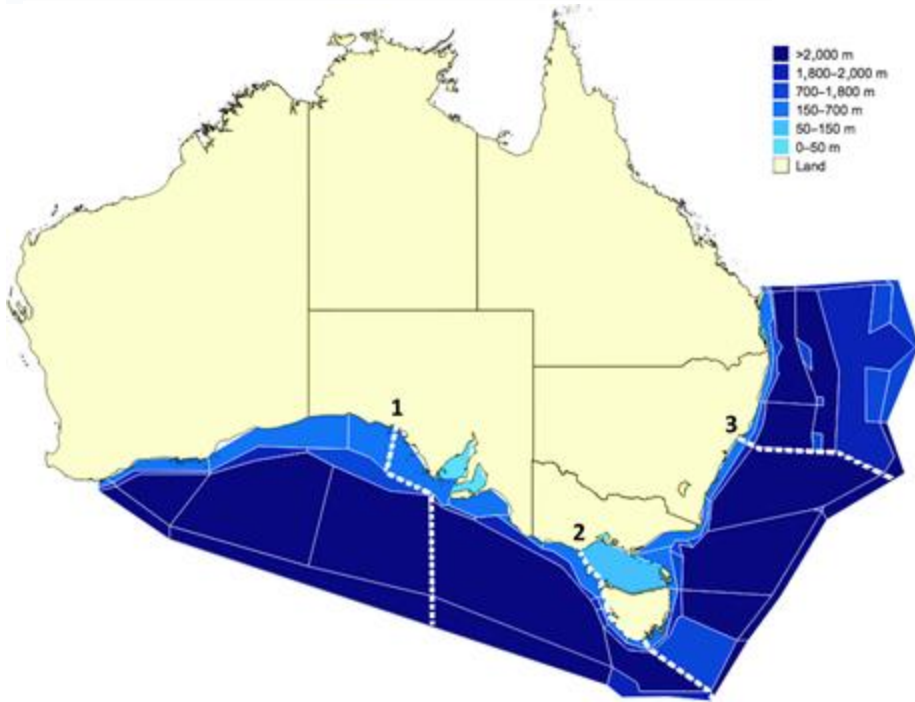


Japanese Spanish Mackerel distribution
Liu et al. 2023

COMPLEX ECOSYSTEM MODELS



Atlantis

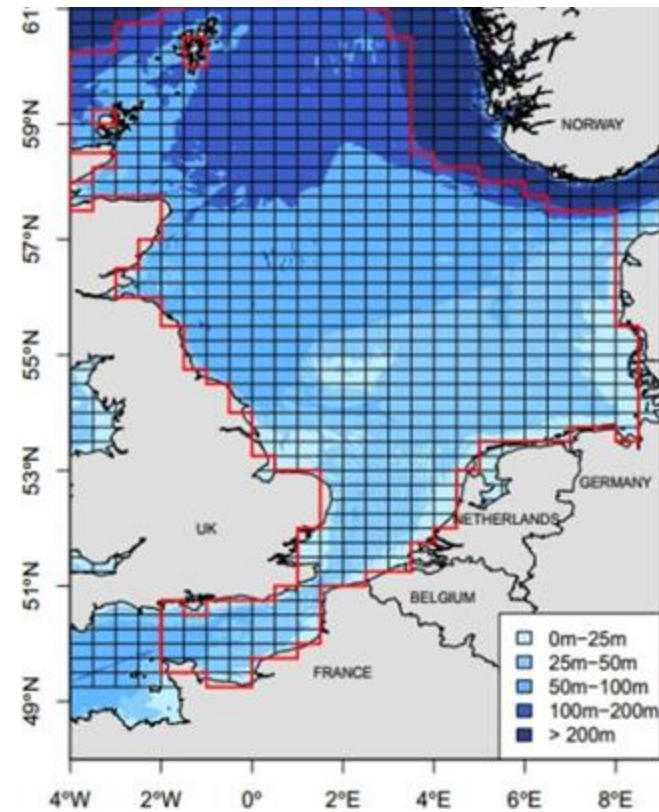


Fulton et al. 2018



Osmose

Object-oriented Simulator of Marine Ecosystems



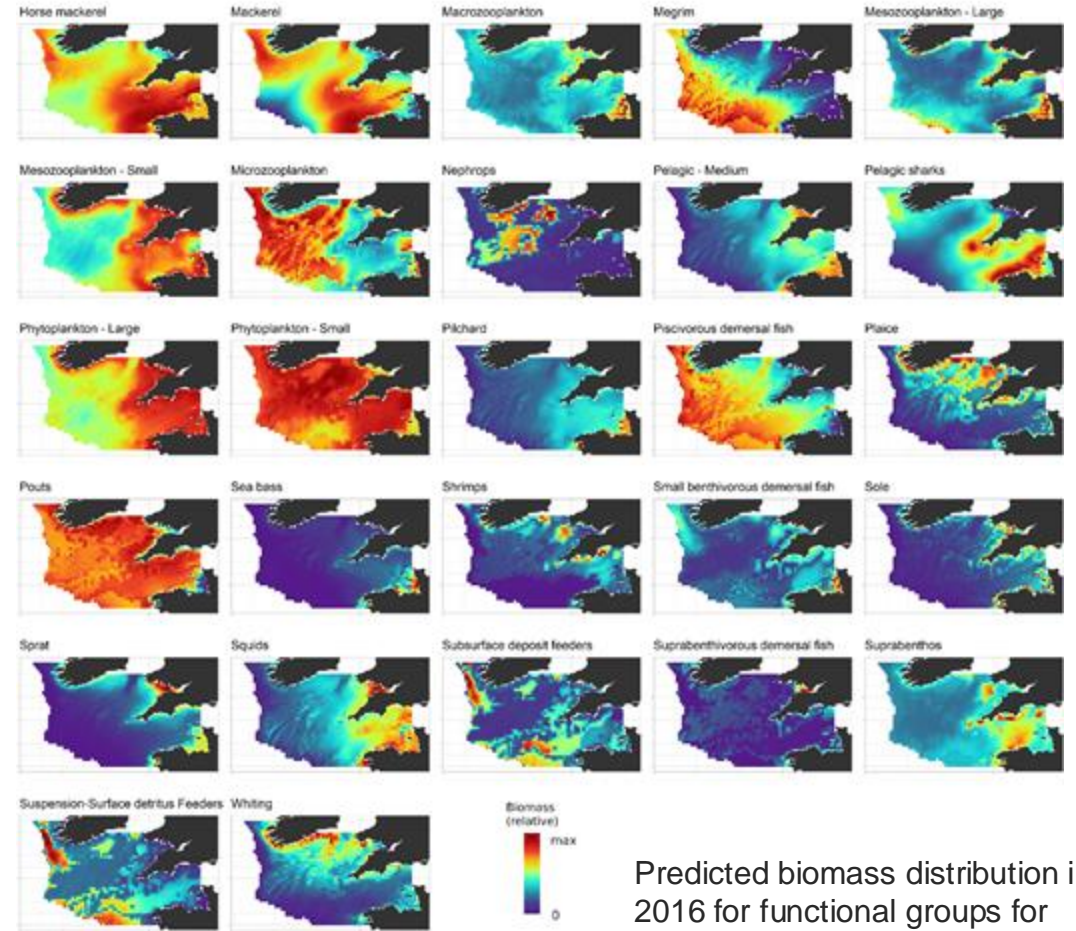
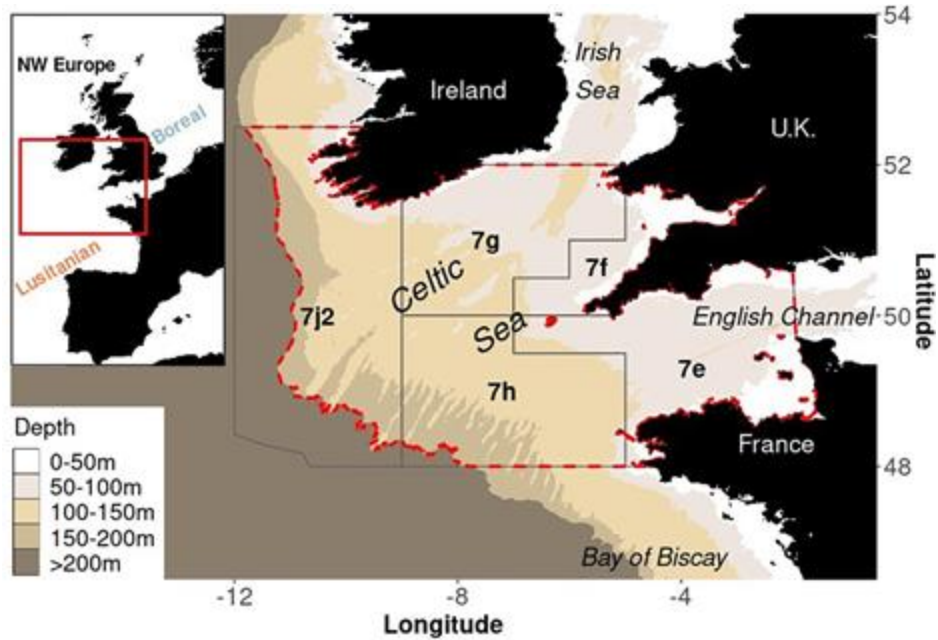
Morell et al. 2023

COMPLEX ECOSYSTEM MODELS



Ecopath with Ecosim

No fish is an island



Predicted biomass distribution in 2016 for functional groups for which statistical habitat models (generalized additive models) were developed

Hernvann et al. 2023

IS THIS A GOOD IDEA?

Forcing complex ecosystem model with...

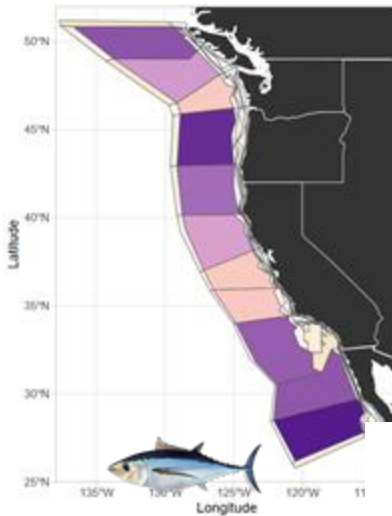
Small Pelagics distribution



Atlantis



Projections of population and food web response

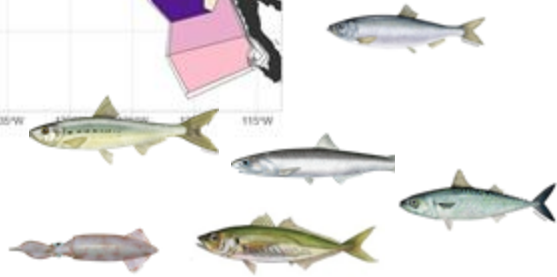


Predators' distribution

BENEFITS!

Forcing complex ecosystem model with...

Small Pelagics distribution



Atlantis

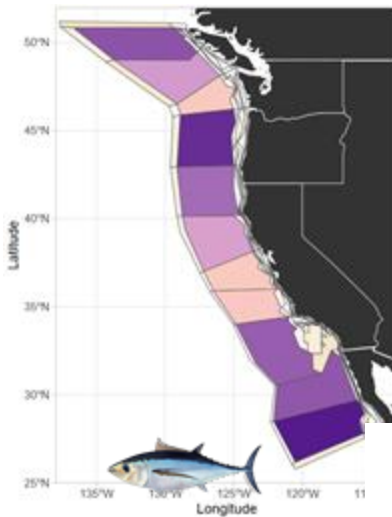


Projections of population and food web response

Improving ecosystem model's

- age-structured distributions
- interannual distribution shifts
- thermal responses

Predators' distribution



Decisions, Decisions, Decisions: Choices when coupling Species Distribution models to complex ecosystem models

Decisions during construction of the SDM

- **SDM structure:** Should an SDM model abundance or the probability of presence? Which covariates should be included in the SDM?
- **Spatial, temporal, and/or ontogenetic mismatches:** How to best handle cases in which SDMs omit regions (based on the spatial domain), years, seasons, or life stages included within the complex models? How to work across models that vary in spatial and temporal resolution?
- **Is the SDM intended to represent the fundamental niche or a realized niche?** The **fundamental niche** indicates broad habitat preferences (a species could survive and thrive there), while the **realized niche** is which habitat a species actually occupies

Decisions, Decisions, Decisions: Choices when coupling Species Distribution models to complex ecosystem models

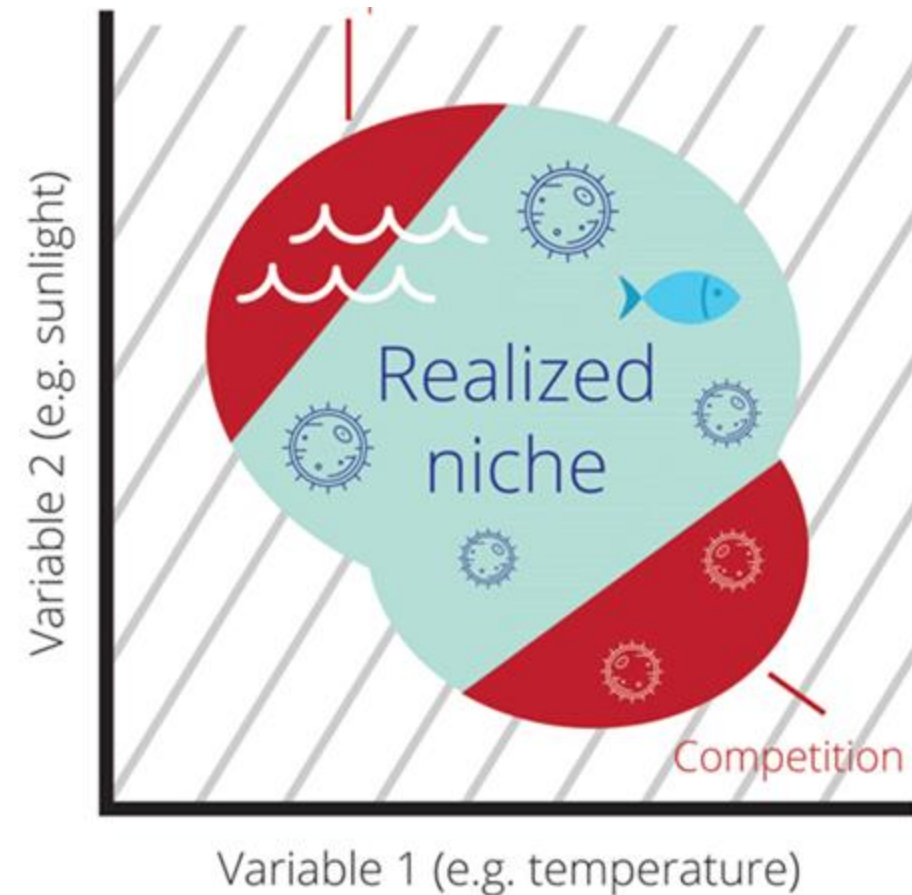
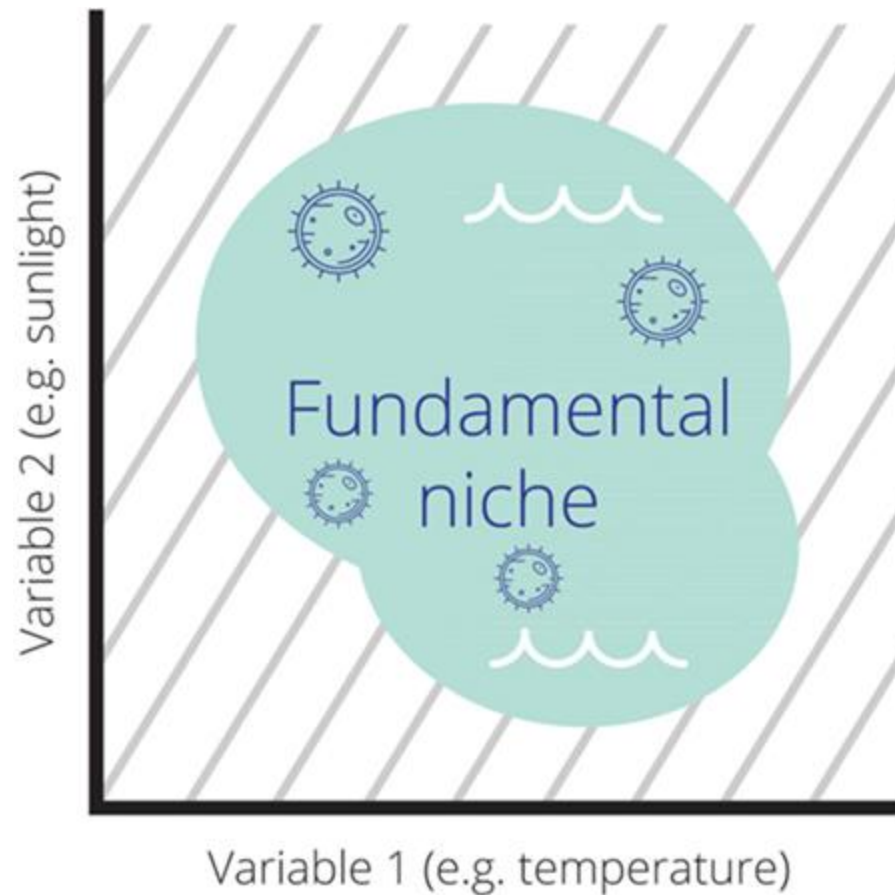
Decisions within complex ecosystem models when linking to SDMs

- **Explicit movement:** Should the more complex models include processes like movement rates or foraging behavior, should they simply be forced by the SDM? Are detailed studies modeling processes such as advection of individual organisms needed to inform the ecosystem model?
- **Life history / dispersal:** How to handle different spatial habitats for multiple life history stages ? What is the necessary stage resolution in ecosystem models, and should we (and how do we) include processes such as density-dependence and larval transport?
- **Non-spatial ecosystem models:** How can complex, but non-spatial or coarsely-spatial ecosystem models be forced or informed by SDMs?
- **Propagating uncertainty:** How can estimates of uncertainty from SDMs be incorporated within the more complex models?

BEST PRACTICE #1: DECIDE ON REALIZED VS FUNDAMENTAL NICHE



Be cognizant of how, and in which model, the realized versus fundamental niches are represented, and whether this is appropriate for the questions at hand.



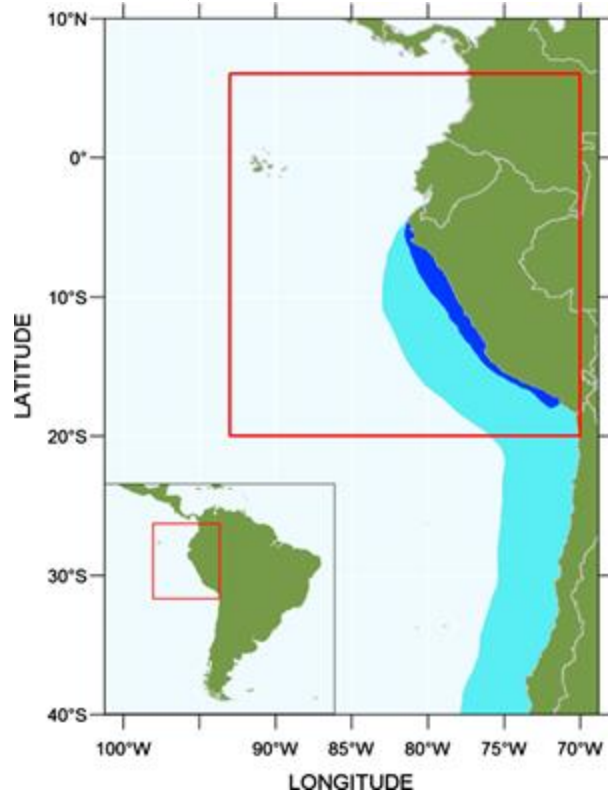
Escobar et al. 2017

BEST PRACTICE #1: DECIDE ON REALIZED VS FUNDAMENTAL NICHE



Be cognizant of how, and in which model, the realized versus fundamental niches are represented, and whether this is appropriate for the questions at hand.

OSMOSE, Northern Humboldt Current



Covariates from the SDMs used as inputs to the OSMOSE model in the Northern Peru Current Ecosystem

Type of SDM	Covariates
Fundamental Niche	Temperature, Salinity, Oxygen. A concave functional shape is assumed for all variables.
Realized Niche	Temperature, Salinity, Oxygen. Net primary productivity (proxy of prey for small pelagics) Bathymetry, distance to the shelfbreak (negative within the shelf). Abundance (local average density at several scales, e.g. 200km).

BEST PRACTICE #2: EARLY LIFE STAGES MAY REQUIRE NEW MECHANISTIC APPROACHES

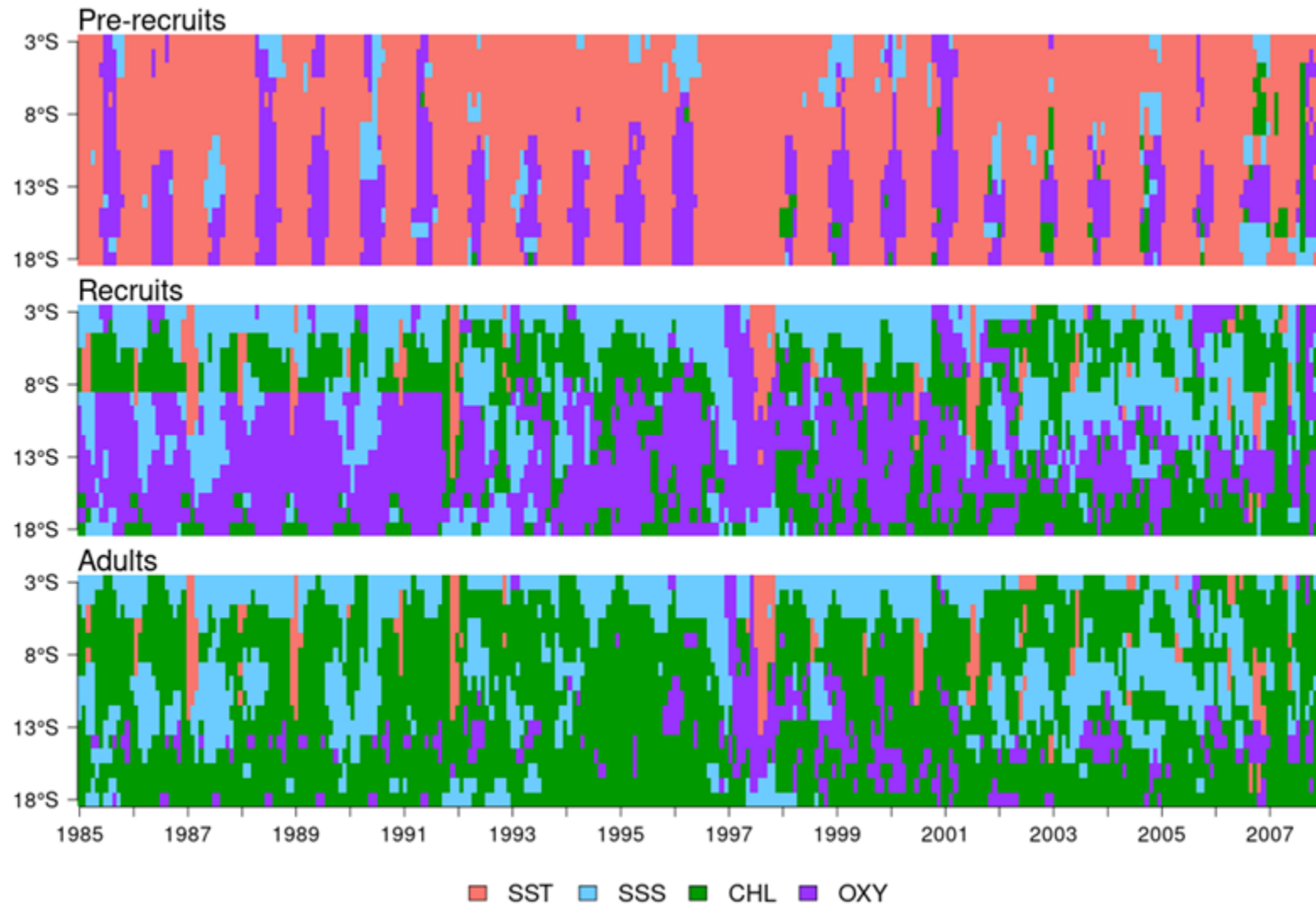


For some cases, such as early life stages of fish, explicit, mechanistic studies of dispersal and movement may be more appropriate than correlative approaches.

MAIN LIMITING FACTOR OF ANCHOVETA – BY STAGE

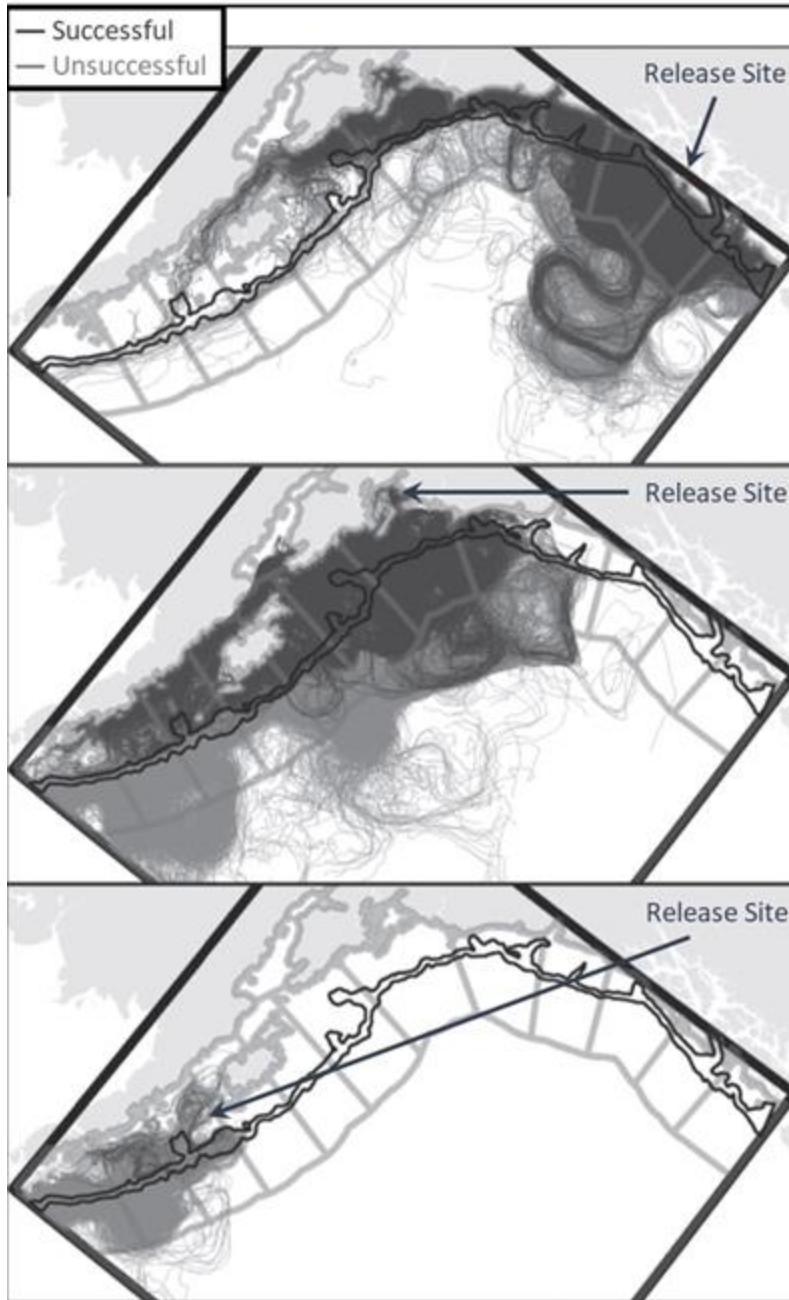


Fundamental niche varies by life stage



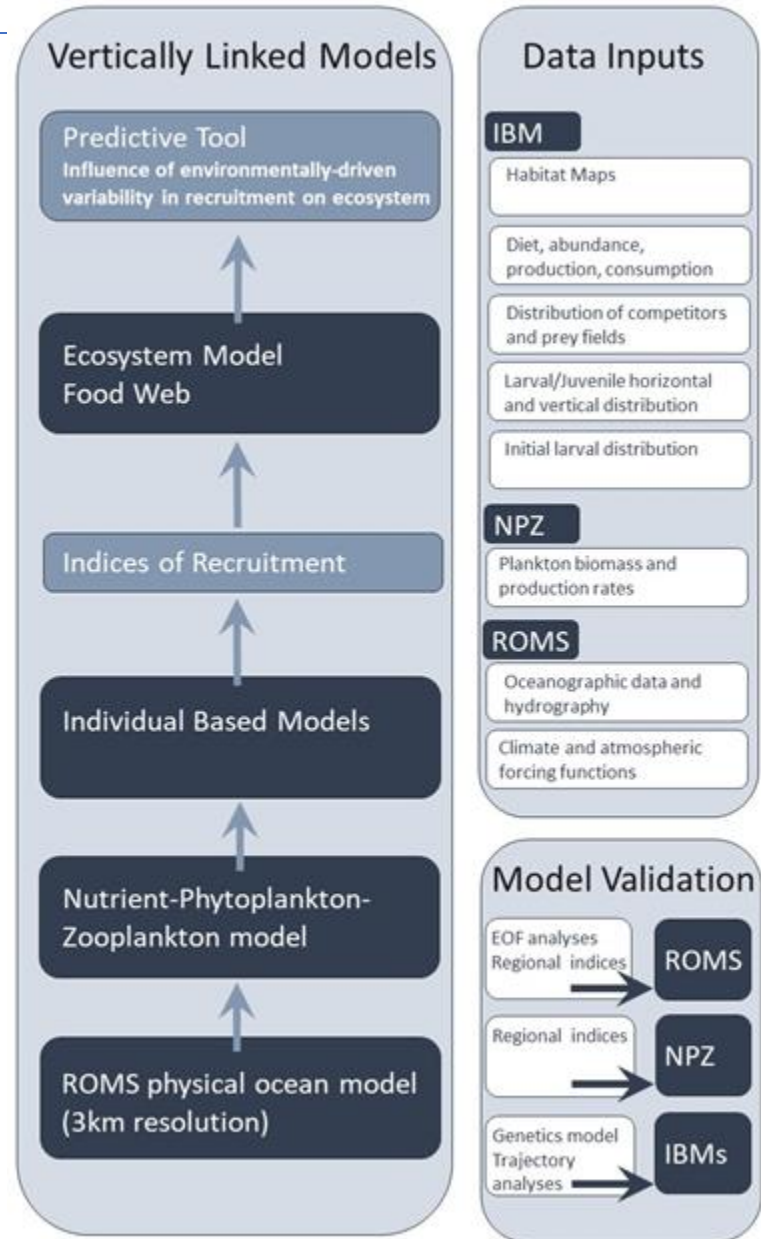
Lujan et al.
2016

GULF OF ALASKA



Understanding distribution of earliest life stages may require dispersal modeling

Stockhausen et al. 2019



BEST PRACTICE #3: USE CARE WHEN EXTRAPOLATING IN TIME AND SPACE



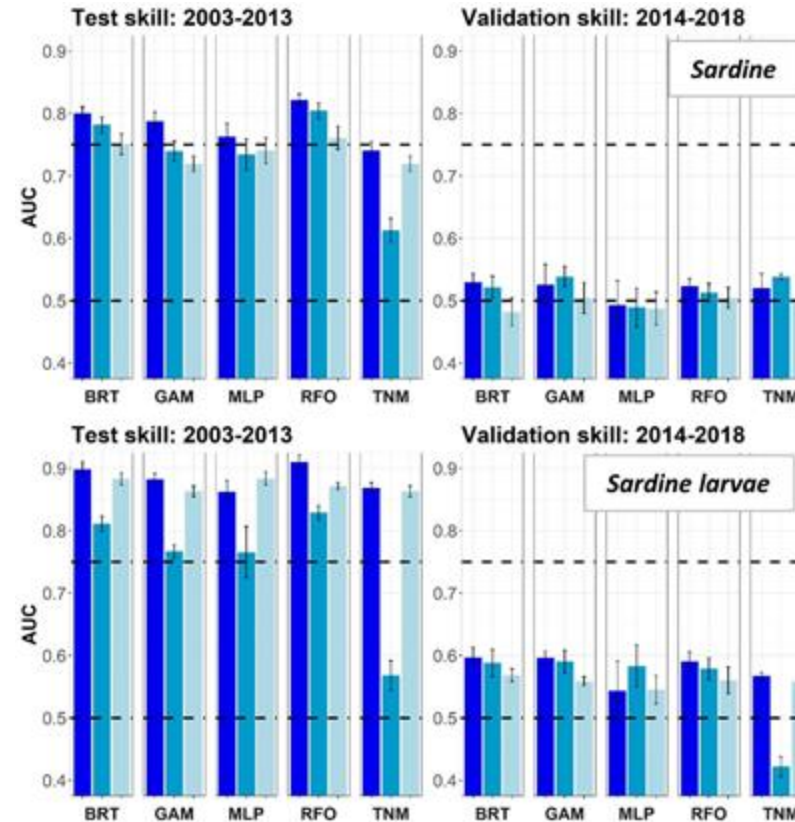
Best practices for climate change projections will involve the use of covariates available at such decadal time-scales, while also being conscious of the challenges of extrapolating to novel conditions and areas.

Muhling et al. 2020

Liu et al. in review,
Hervann et al in prep



New ocean downscaling via GLORYS, rather than extrapolating from smaller ROMS grid

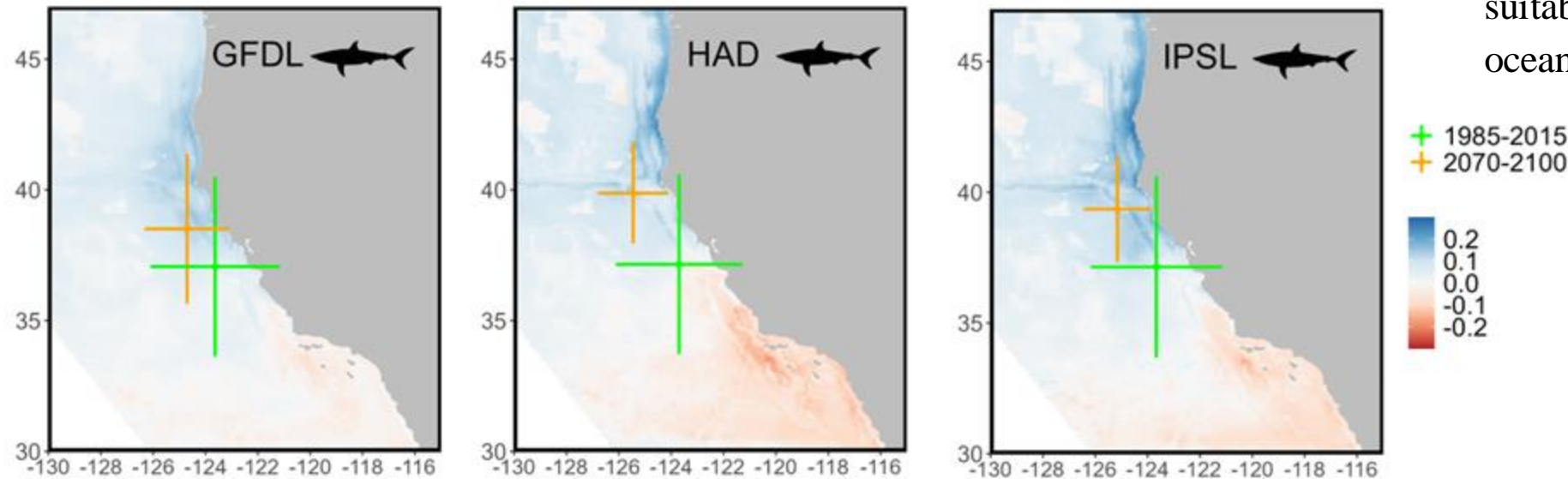


SDM skill degrades in projections into heat wave years

BEST PRACTICE #4: QUANTIFY UNCERTAINTY



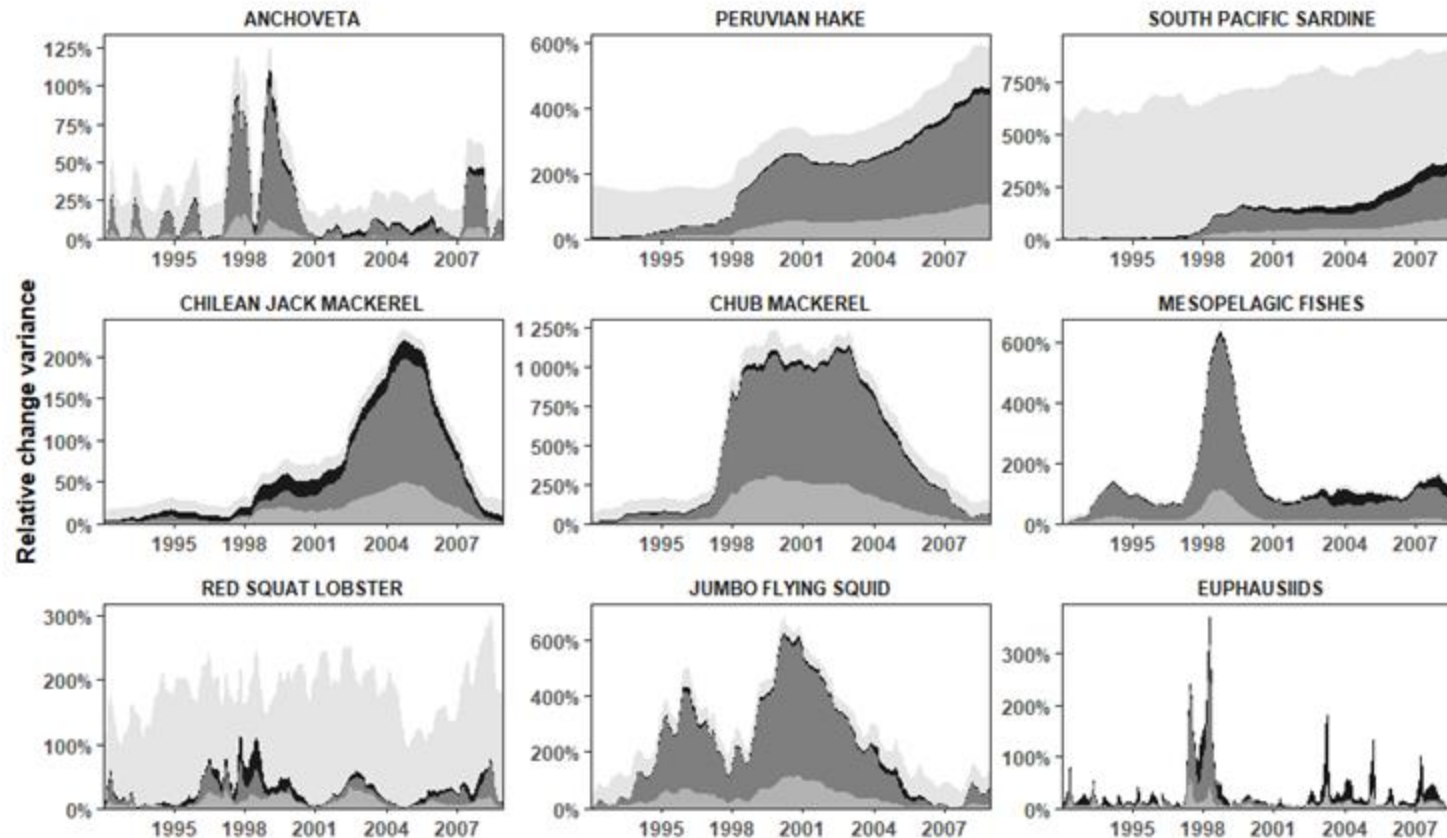
Climate change projections also should quantify uncertainty in environmental conditions, and the subsequent implications for species distributions and for the full ecosystem.



BEST PRACTICE #4: QUANTIFY UNCERTAINTY



Best practices include quantifying the uncertainty stemming from the SDMs, and how such uncertainty propagates through the linked ecosystem models.



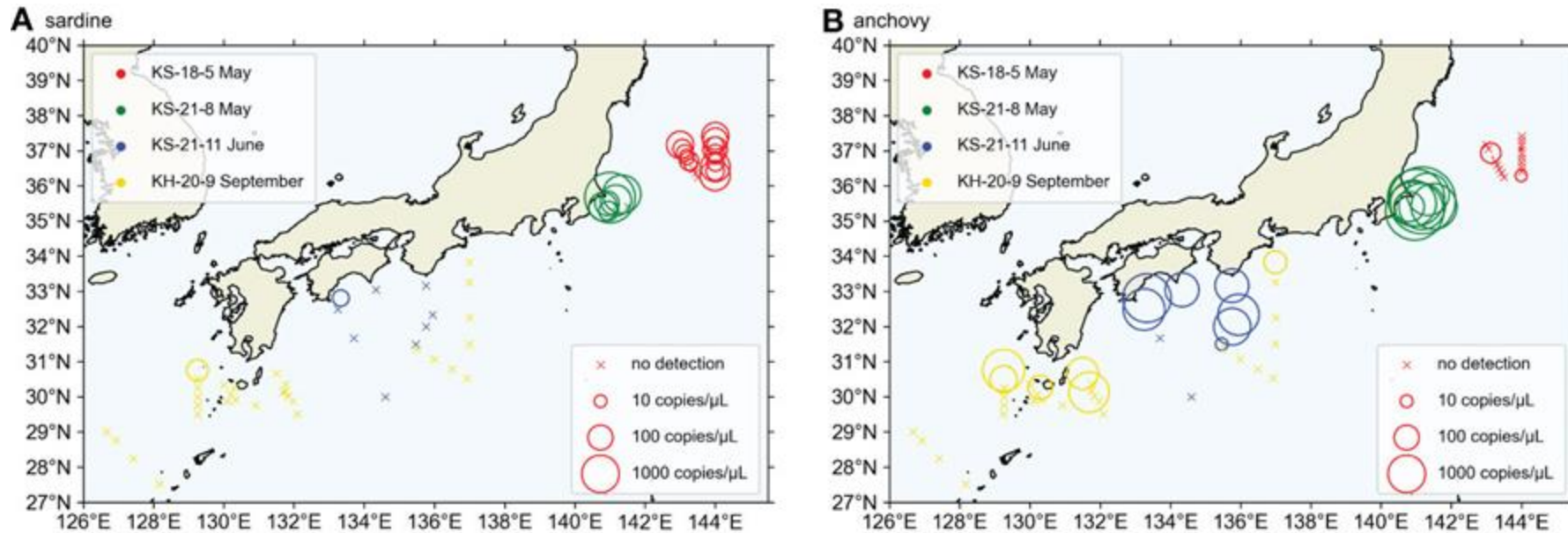
Model variability driven by SDMs (maps) and mapsXplankton

source stochasticity plankton maps plankton:maps

BEST PRACTICE #5: EMBRACE NEW OBSERVATIONS



Novel methods (such as eDNA and the use of fishery-dependent data) should be embraced.



Sardine and anchovy eDNA in the Kuroshio

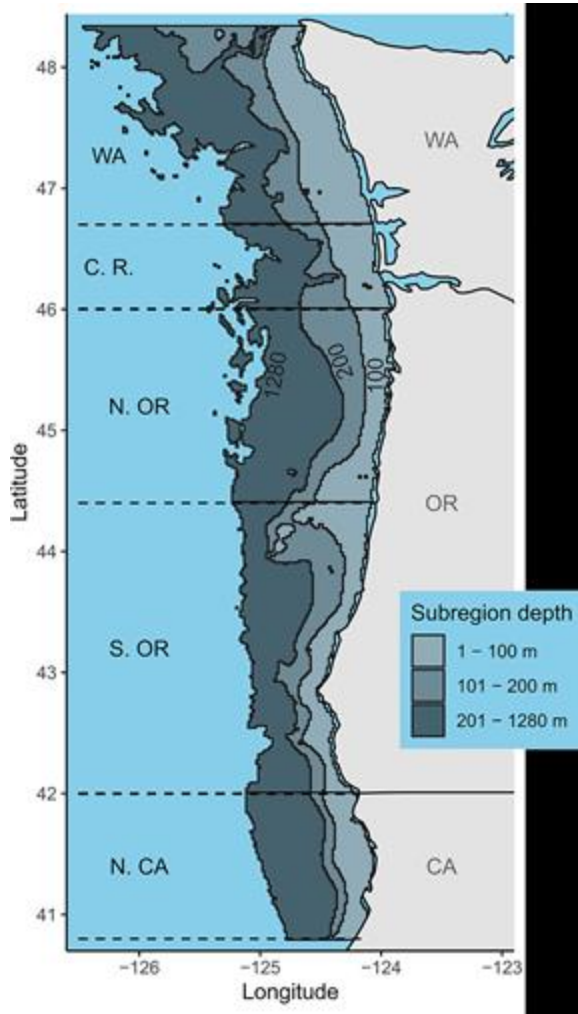
Yu et al. 2023

BEST PRACTICE #6: SDMs CAN BE USED EVEN IN NON-SPATIAL ECOSYSTEM MODELS



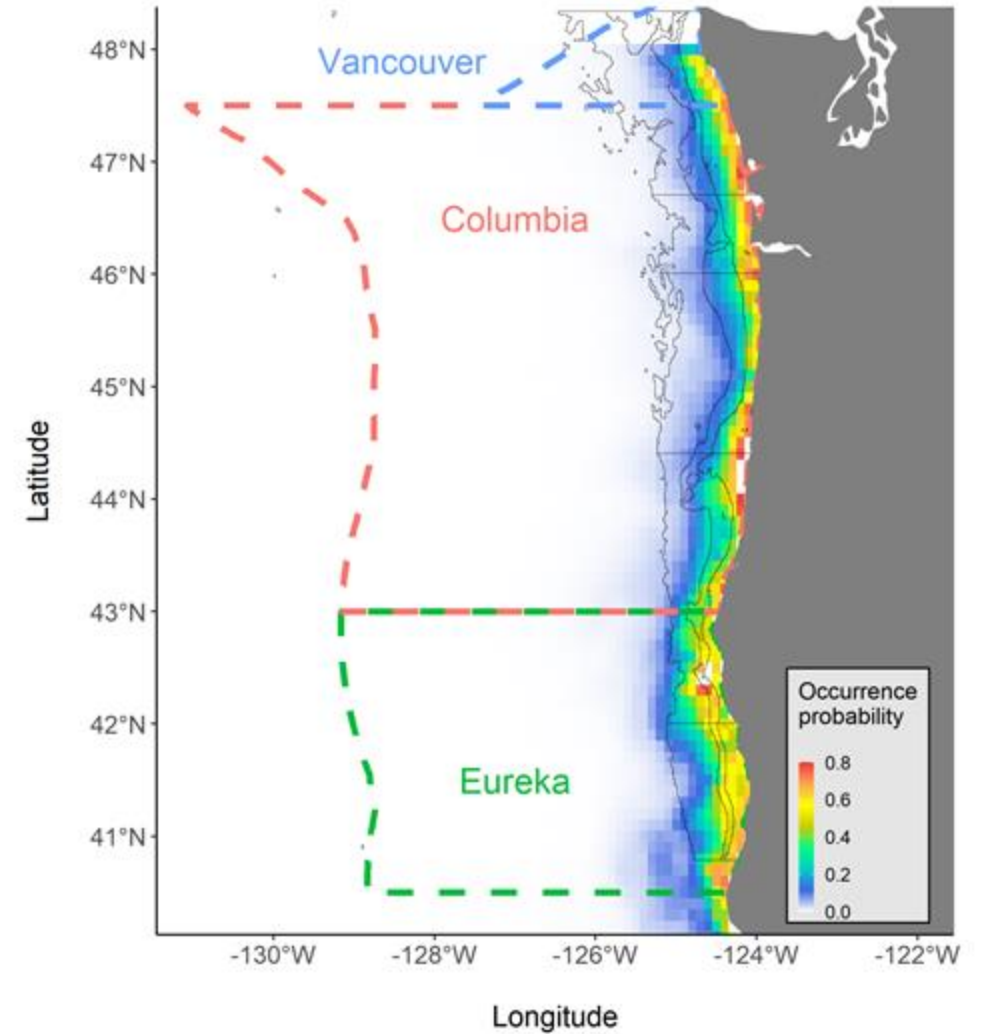
Practical applications of SDMs include for instance better spatial apportionment of catches, and translation of environmental performance curves (e.g. thermal niches) to improve understanding of population and ecosystem productivity.

CALIFORNIA CURRENT – ECOTRAN

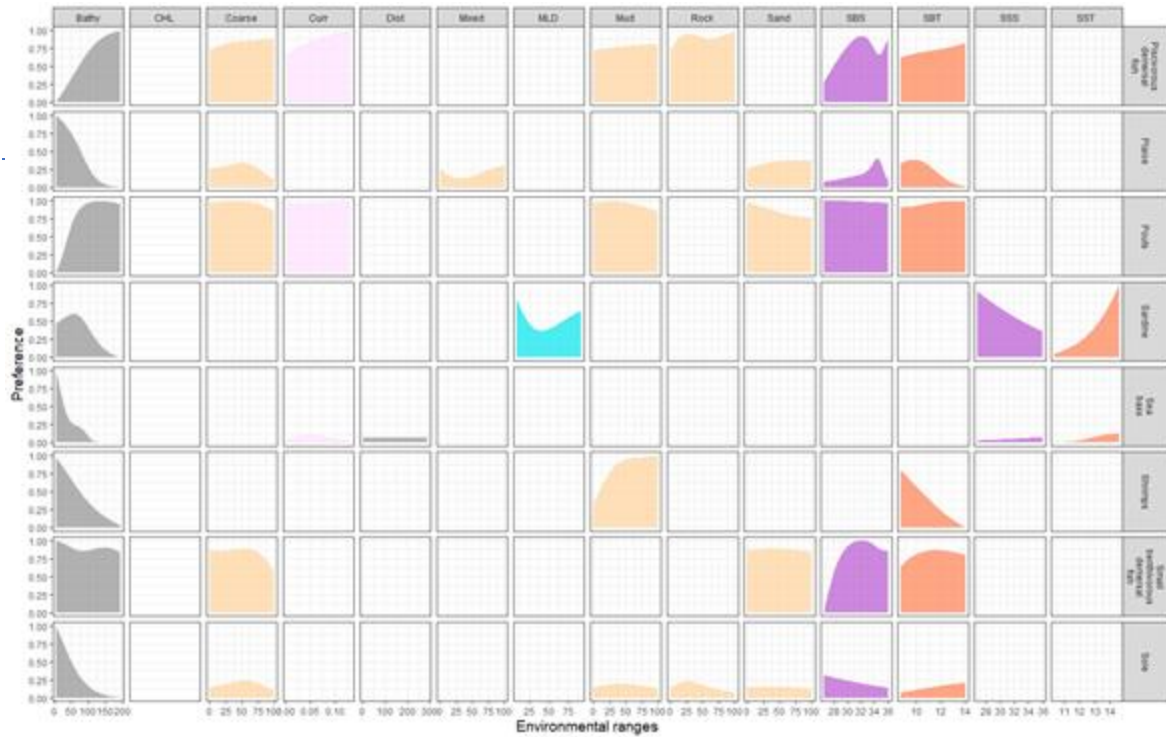


← Gomes et al.
2024– 15 spatial
zones in ECOTRAN
model

→ SDMs assist with
catch apportionment
to coarse spatial
polygons within the
ECOTRAN model



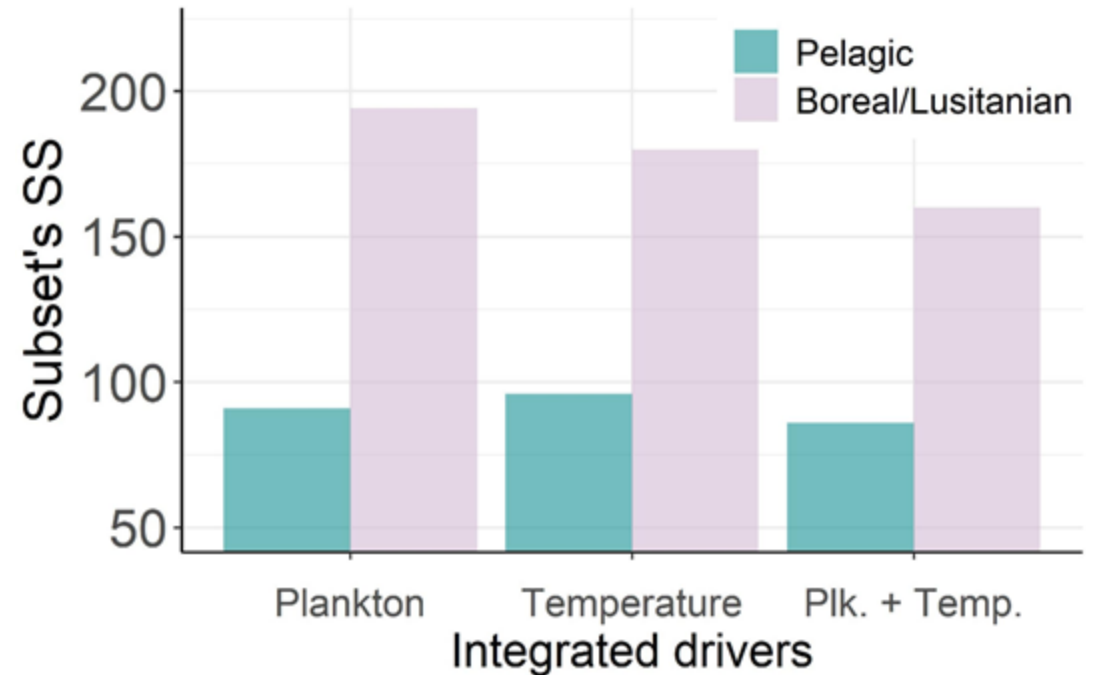
CELTIC SEA – ECOSIM



→ Hernvann et al. 2020

Ecosim model fits to data improved when SDM-derived temperature-to-productivity relationships were included

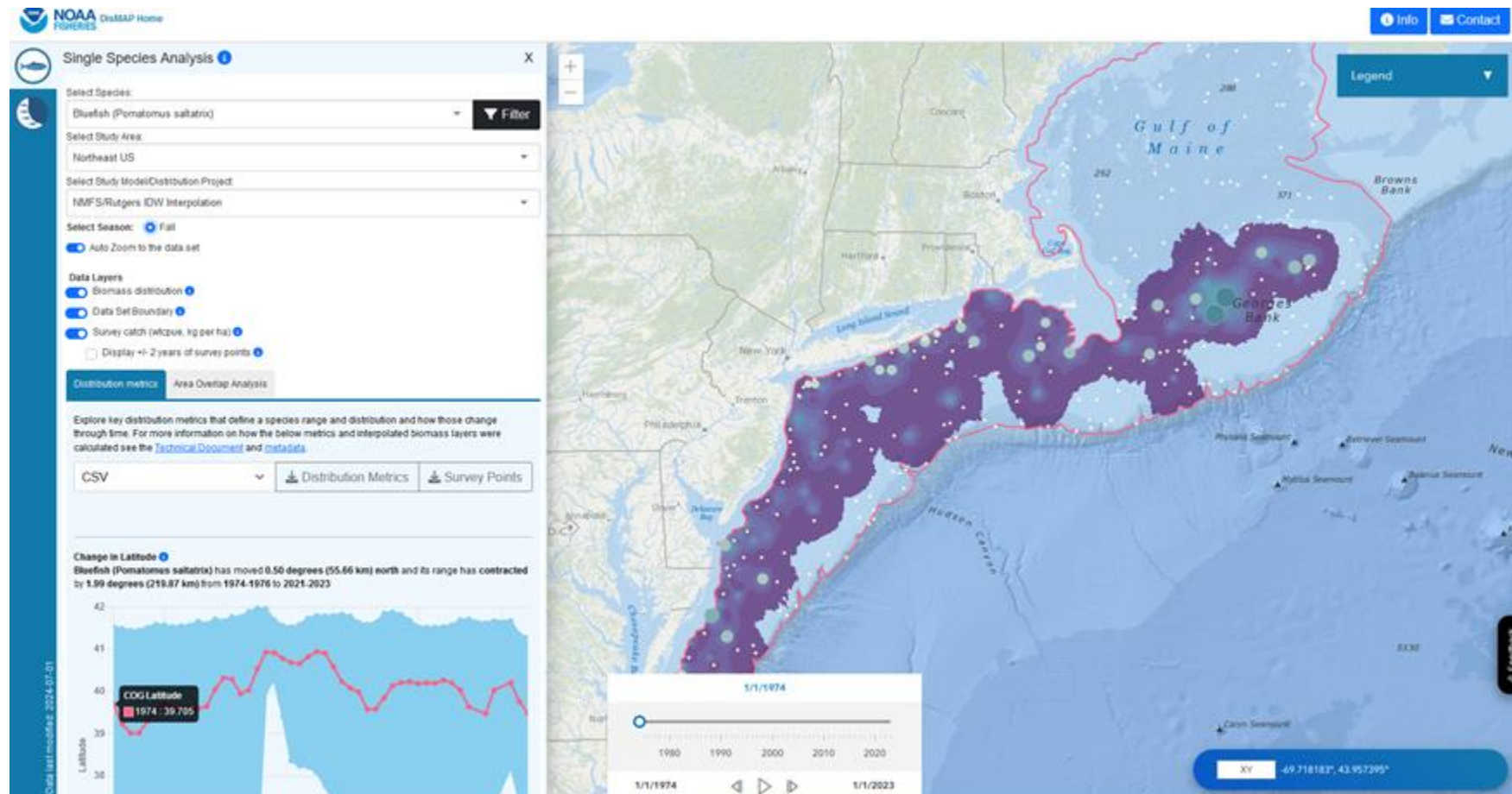
Ecosystem driver



BEST PRACTICE #7: PROMOTE DIALOG BETWEEN DISCIPLINES, AND SHARE PRODUCTS VIA DATA PORTALS



Critically, opportunities for open dialog between SDM developers, ecosystem modelers, oceanographers, and others is necessary and productive, as is dissemination of products via data portals to facilitate use, integration, and evolution.



NOAA DisMAP
portal
<https://apps-st.fisheries.noaa.gov/dismap/DisMAP.html>

- **Practitioners from many regions have begun linking SDMs to ecosystem models, for small pelagic fish and other species**
- **This allows more dynamic and realistic ecosystem models, including**
 - **age-structured distributions**
 - **interannual distribution shifts**
 - **thermal responses**
- **This linking requires some careful decisions, guided by best practices.**
- **Contact us if you are experimenting with this yourself!**

This work is a product of the ICES PICES Working Group on Small Pelagic Fish. The work stems from a workshop at the 2022 ICES PICES Small Pelagic Fish Symposium.

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