



**NOAA**  
**FISHERIES**

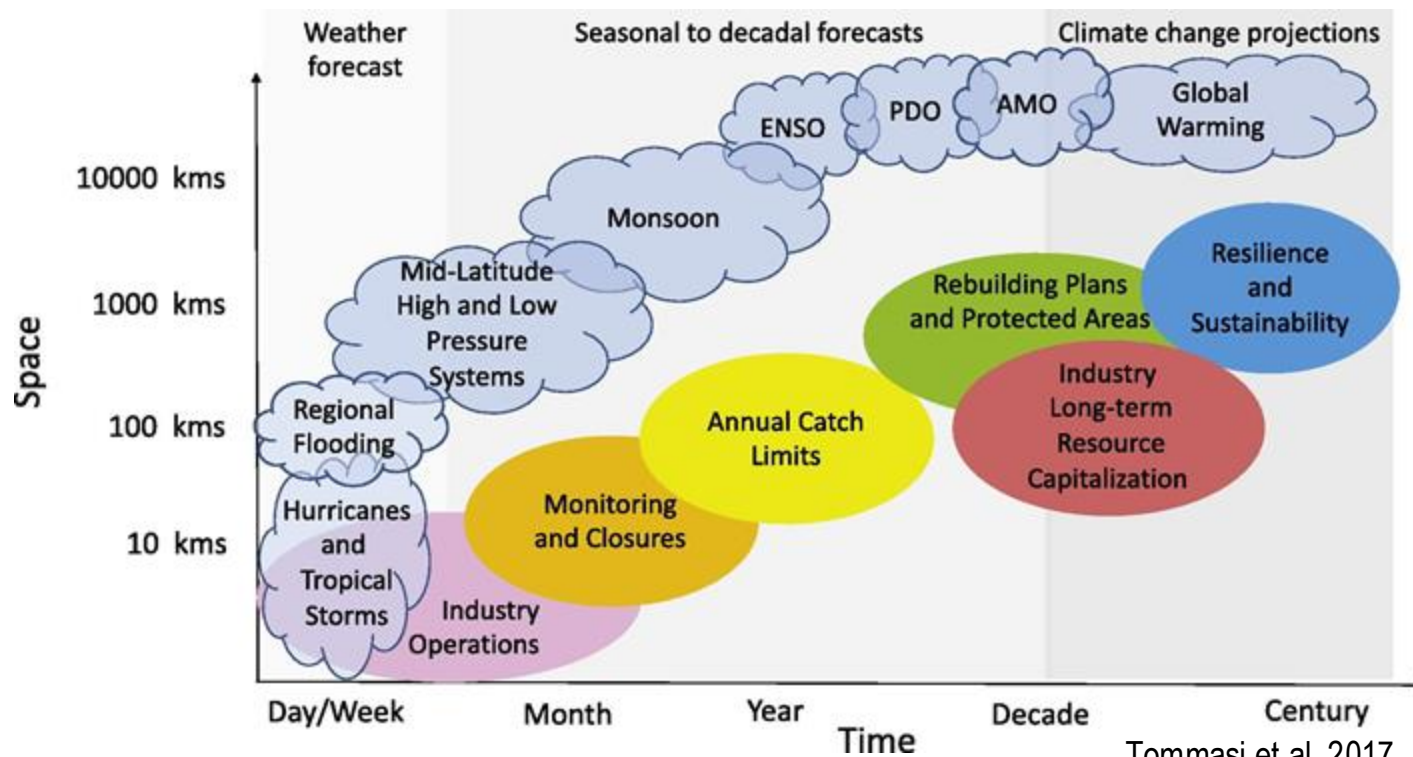
Northwest  
Fisheries  
Science Center

# Evaluating climate-robust management strategies for environmentally-driven recruitment in transboundary fisheries: avoiding tipping points for Pacific Hake

Kristin Marshall, Aaron Berger, Kelli Johnson,  
Eric Ward, Nick Tolimieri, Mary Hunsicker,  
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# Challenge: match spatiotemporal scale of predictions and models to management needs



Tommasi et al. 2017

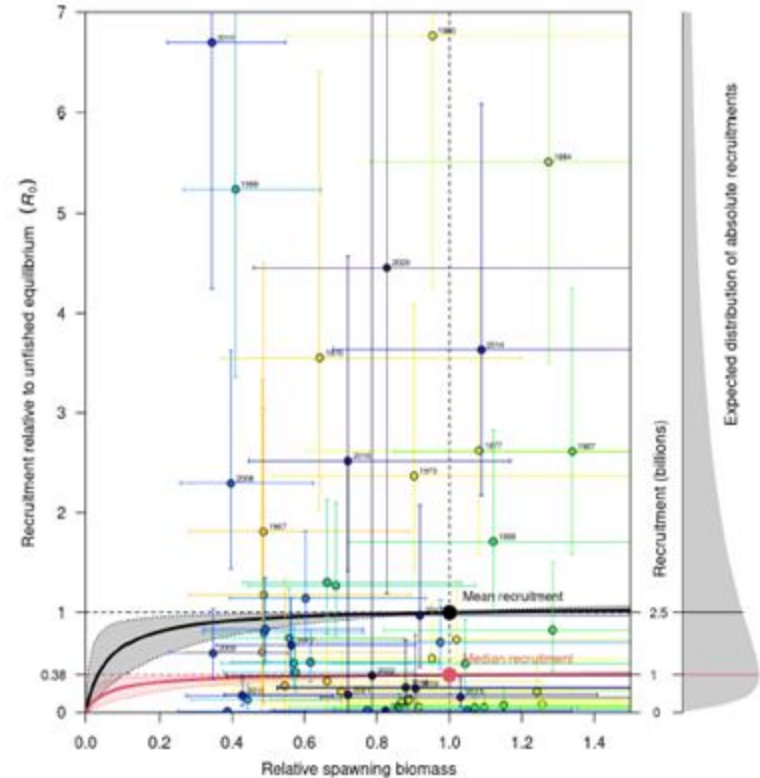
# How to operationalize research on drivers of recruitment for use in fisheries management?



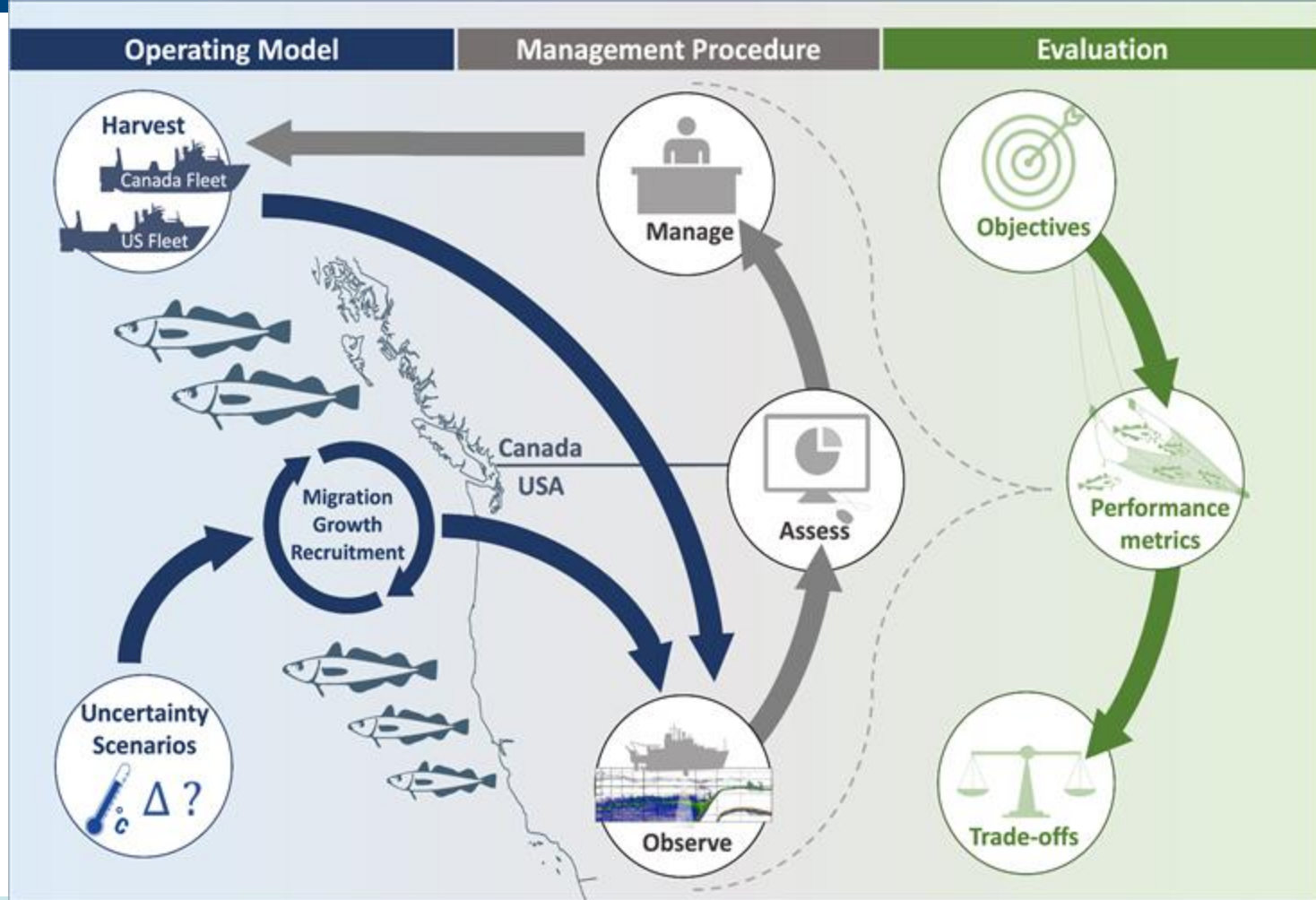
# Pacific Hake: dynamic and transboundary

Managed under international treaty between US and Canada

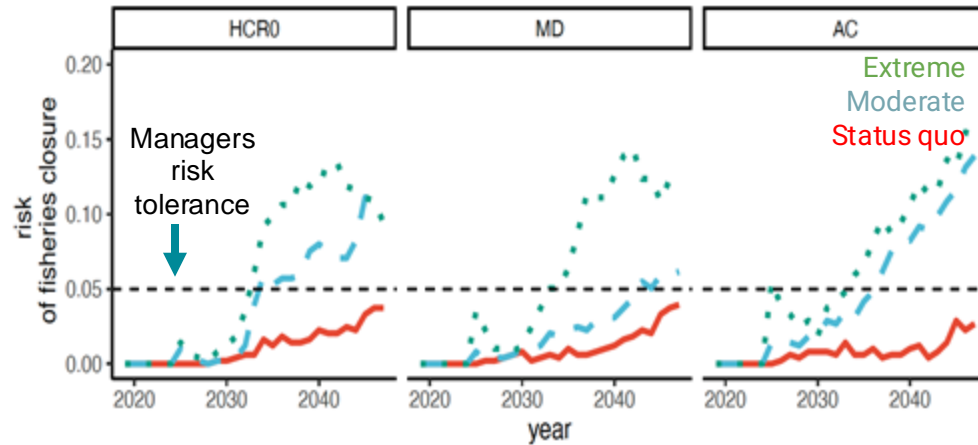
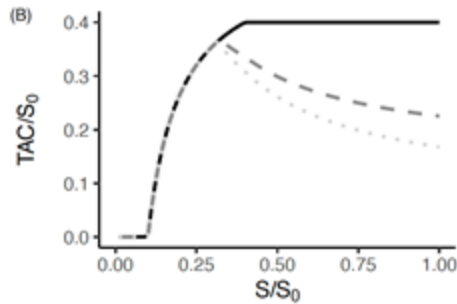
Variable migration and recruitment with links to ocean conditions



Hake MSE  
goal: evaluate  
the  
performance of  
alternative hake  
MPs under  
current and  
future  
environmental  
conditions



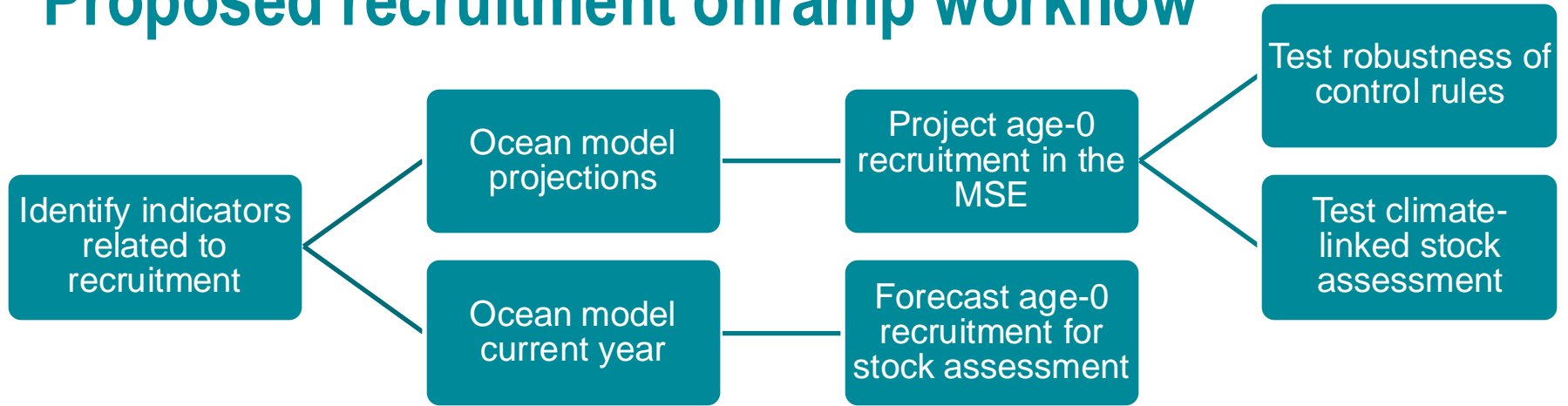
# Climate change-induced movement scenarios



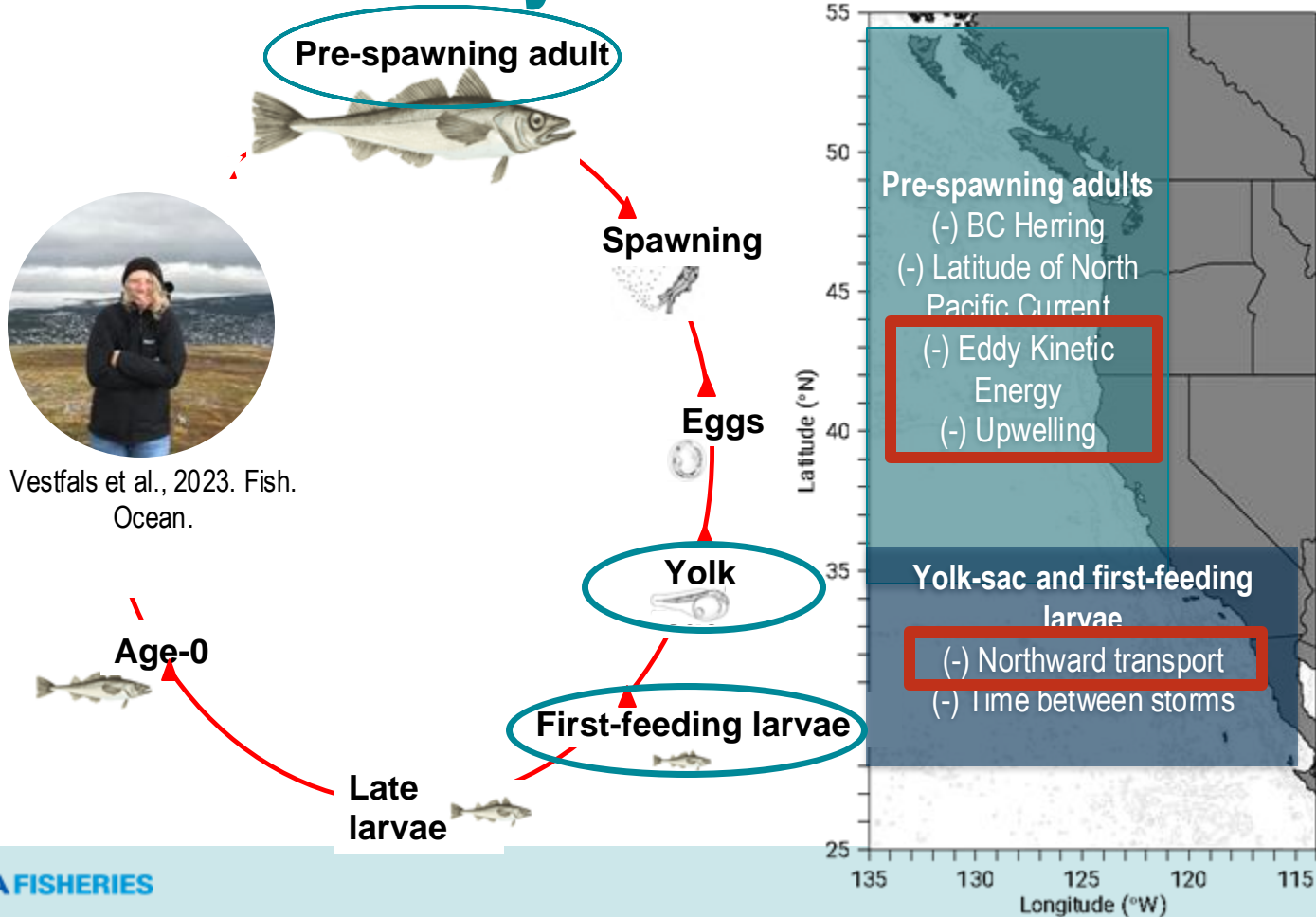
Conceptual scenarios suggests northward distribution shift could increase risk of fishery closures, but effects of **high recruitment variability** dominate effects of distribution shifts

Jacobsen et al. 2022. ICES JMS.

# Proposed recruitment onramp workflow



# What drives variability in hake recruitment?

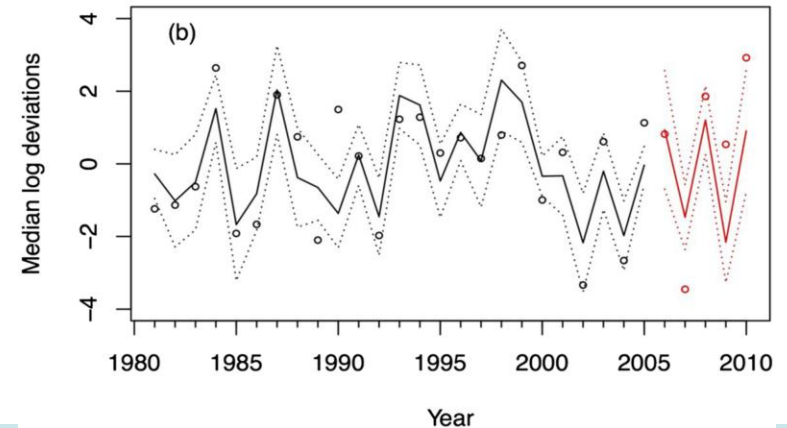
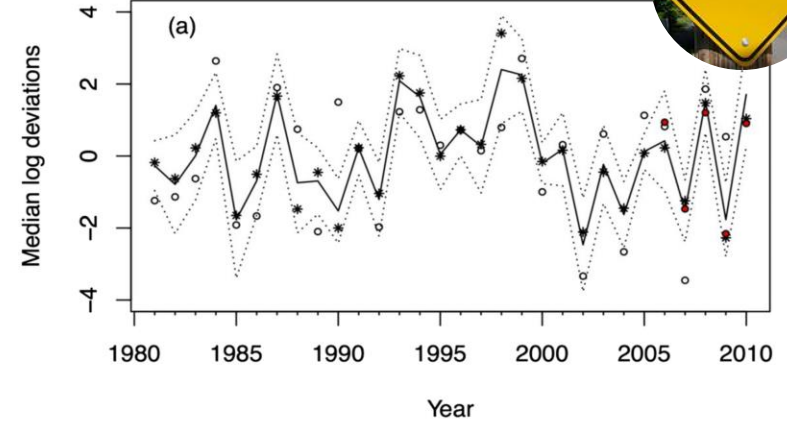


Vestfals et al., 2023. Fish. Ocean.



# Challenges to operationalizing

- 59% variability explained with 5 indicators
- Linear relationships only
- Some estimated in opposite direction of hypothesis
- Model fit and validated in 1980-2010



# Validating recruitment prediction with new approaches

'Big data' non-mechanistic approach  
(methods in Ward et al. 2023)

Compare multiple model types

Univariate and multivariate

Performance based on in-sample and  
out-of-sample prediction skill


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## Leveraging ecological indicators to improve short term forecasts of fish recruitment

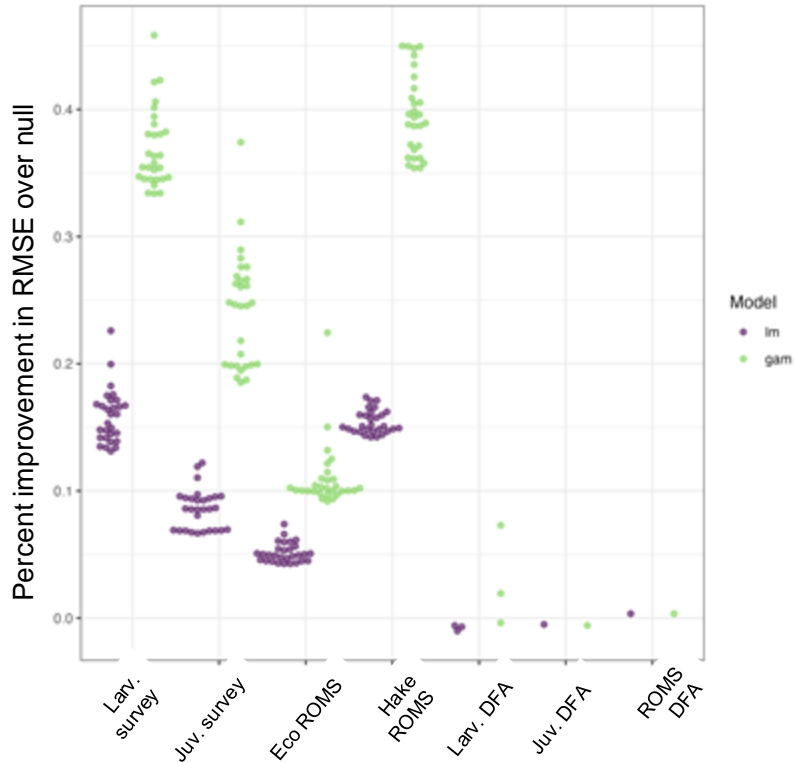
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# Potential operational indicators for hake recruitment

- Hake life-history informed ROMS variables (Vestfals et al. 2023)
- Ecosystem-state ROMS variables (Hunsicker et al. 2022)
- Survey time series of early life history stages
  - Larval fish (CalCOFI, 1985-2020)
  - Juvenile fish (RREAS, 1988-2018)

# Within-sample prediction skill



Hake-specific ROMS and larval survey perform well

Better performance with ROMS indicators supported by mechanistic hypotheses than naïve ROMS

GAMs reduced number of indicators needed for higher performance

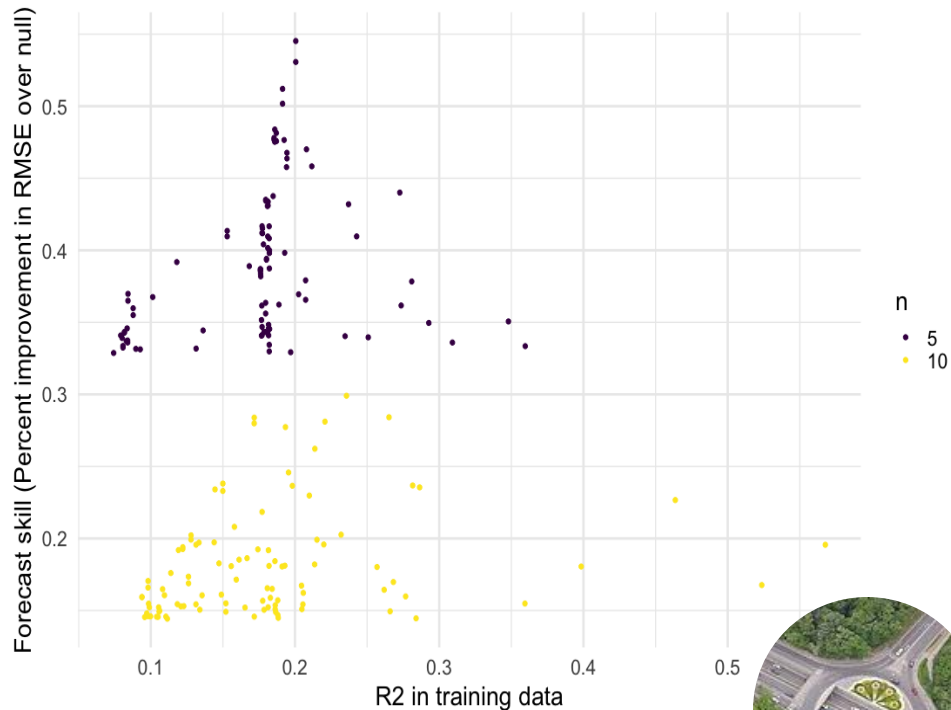


## Validate with out-of-sample prediction skill

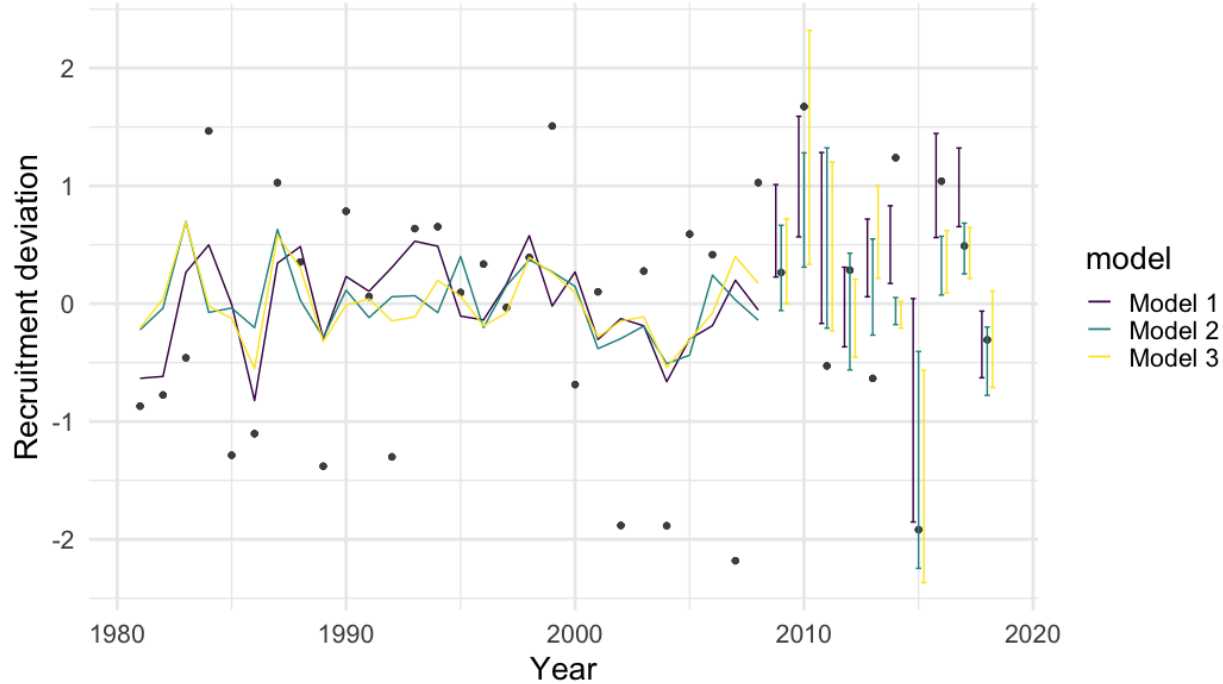
- Age-0 recruitment deviation prediction
- Moving window one year out of sample prediction
- Hake-specific ROMS or GLORYS variables
- Performance measured as reduction in RMSE compared to a null model, over 5 or 10 forecasts

# Skill in 5- and 10-year forecast windows

- Shorter forecast period shows higher skill but less variability explained in training period
- Sensitivity of indicators to assignment of testing/training years
- Tradeoffs between forecast skill and within sample  $R^2$
- Similar results with ROMS or GLORYS



# Most highly skilled forecasts

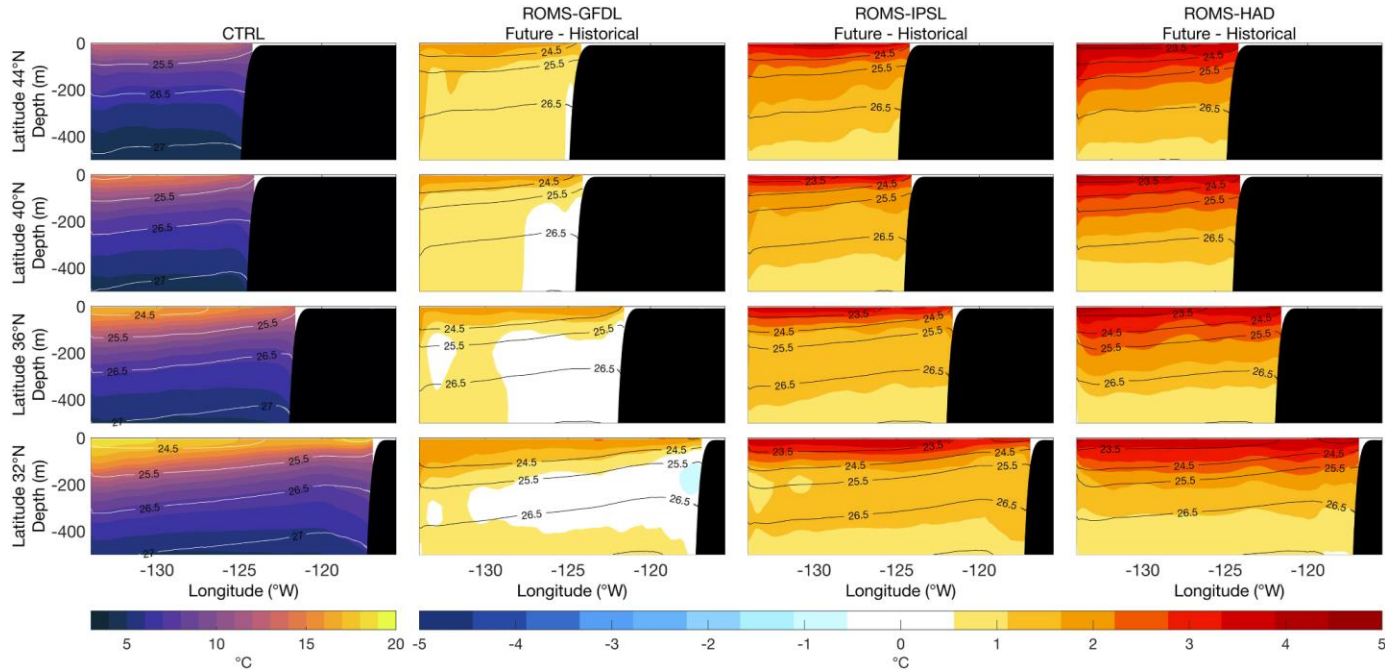


Indicators include:  
Temperature/degree days  
Upwelling (BEUTI)  
Alongshore transport  
Cross-shelf transport



# Next steps

- MSE: Develop recruitment projections from ROMS (Pozo Buil et al. 2021)



- Assessment: Use indicators that perform well to test in assessment and/or risk table



# Conclusions

- Species- and life-history based ROMS/GLORYS indicator selection method validated
- Ecosystem indicators (larval stages) may be useful for hake age-0 recruitment prediction
- Recommend skill metrics and out-of-sample forecast windows that match intended operational use
- Need to adapt our expectations for stable/stationary statistical relationships between ocean indicators and recruitment variability



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