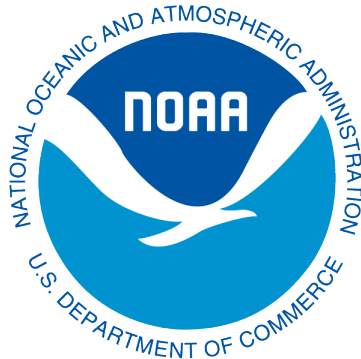


# Integration of multiannual climate predictions in the estimation of stock status and rebuilding time frames for highly migratory species

October 24, 2019

PICES 2019 Annual Meeting, Victoria, Canada

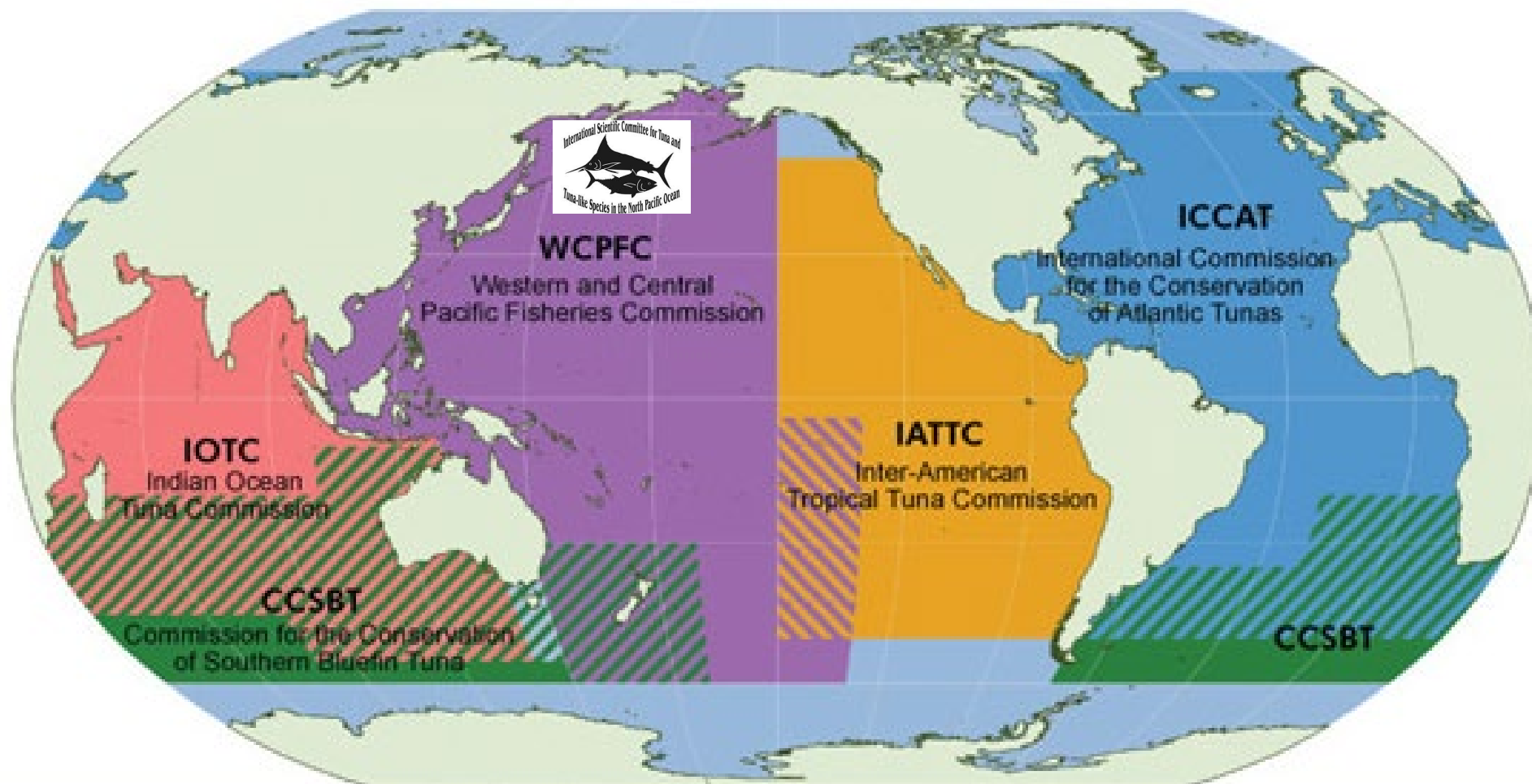
Desiree Tommasi and Barbara Muhling, NOAA SWFSC and UCSC



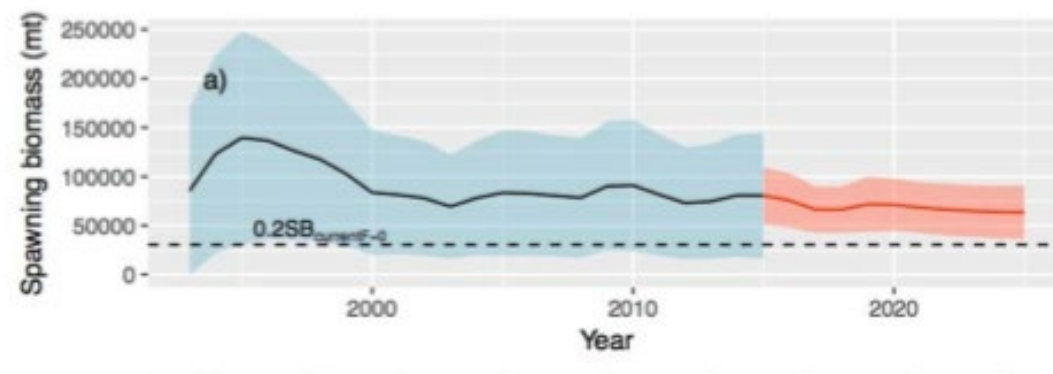
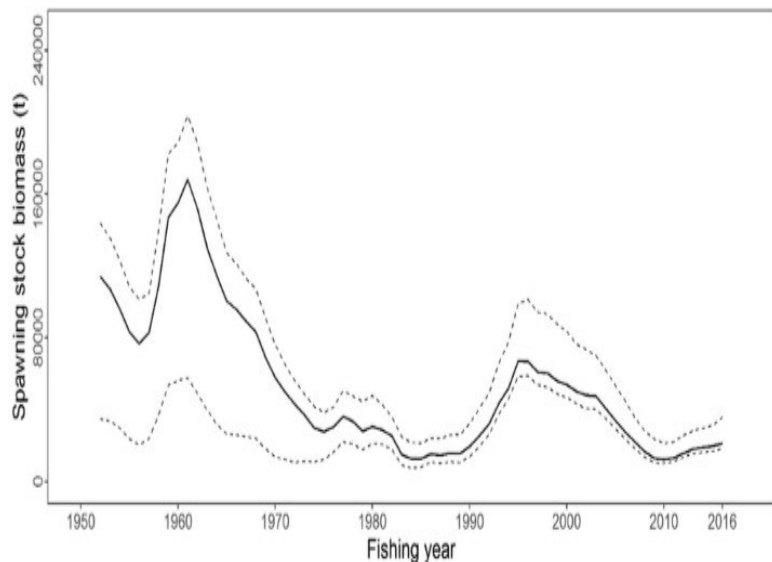
UNIVERSITY OF CALIFORNIA  
SANTA CRUZ



# Management of Highly Migratory Species (HMS) in the North Pacific



# Stock Status Determination of Highly Migratory Species in the North Pacific



Stock Assessment

Reconstruction of Historical Conditions

Estimation of Current Biomass and  
Reference Points



Management Decision

Future Projections

Project population forward with  
constant catch rate  
Probability of biomass > reference  
points or rebuilding target

# Stock Projections

- Sensitive to assumptions of future recruitment
- Often future recruitment is simulated as random noise around average stock-recruitment based on historical patterns
- Environment can drive substantial variability in recruitment (e.g. Szuwalski et al. 2015)
- Can lead to biased estimates of stock status or rebuilding probabilities

# Stock Projections

- Informative to know if recruitment over the next 10 years will be likely to be



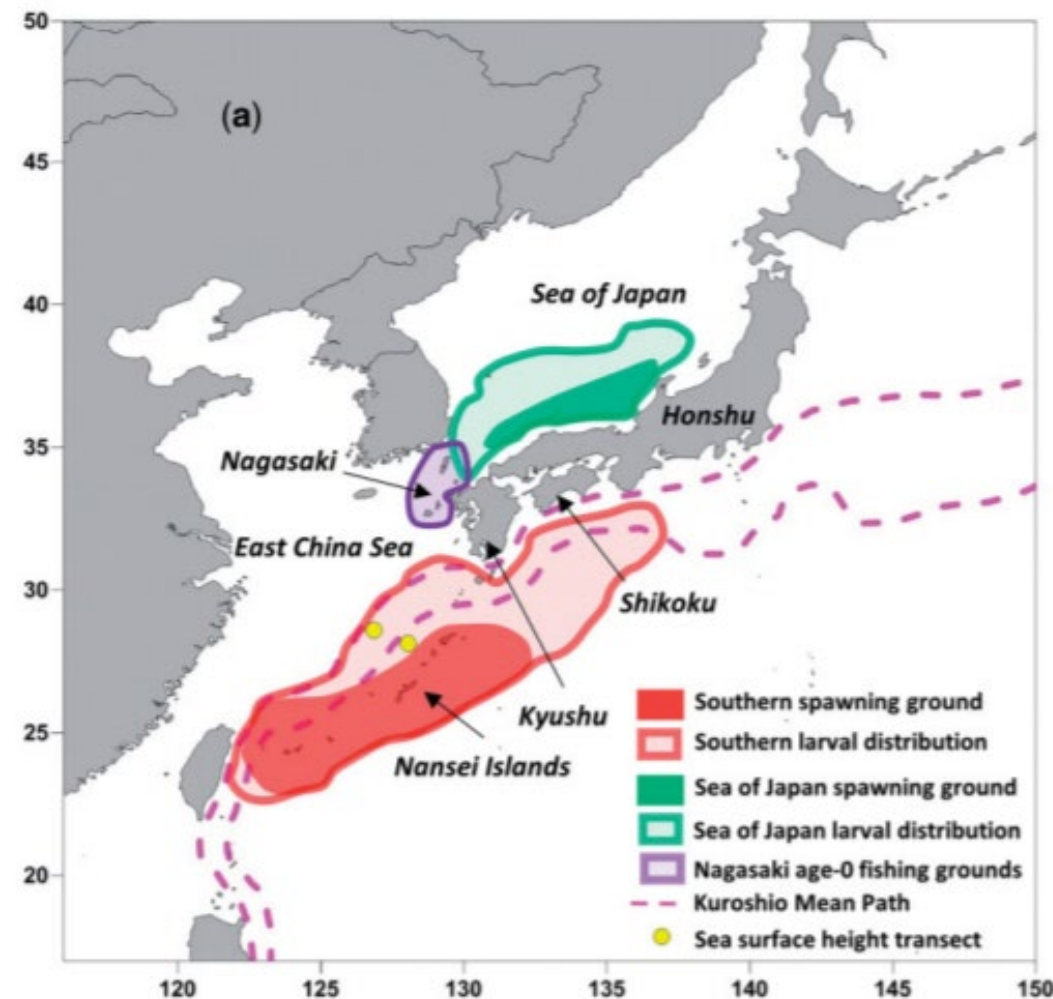
- Less bias?
- Narrower window of probable outcomes?

# Pacific Bluefin Tuna Case Study

## Regional-scale surface temperature variability allows prediction of Pacific bluefin tuna recruitment

Barbara A. Muhling<sup>1,2\*</sup>, Desiree Tommasi<sup>1,2</sup>, Seiji Ohshimo<sup>3</sup>, Michael A. Alexander<sup>4</sup>, and Gerard DiNardo<sup>2</sup>

- SST-informed recruitment model skillful
- $R^2 = 0.72$  for training (1982-2005)
- $R^2 = 0.51$  for out of sample prediction (2006-2012)





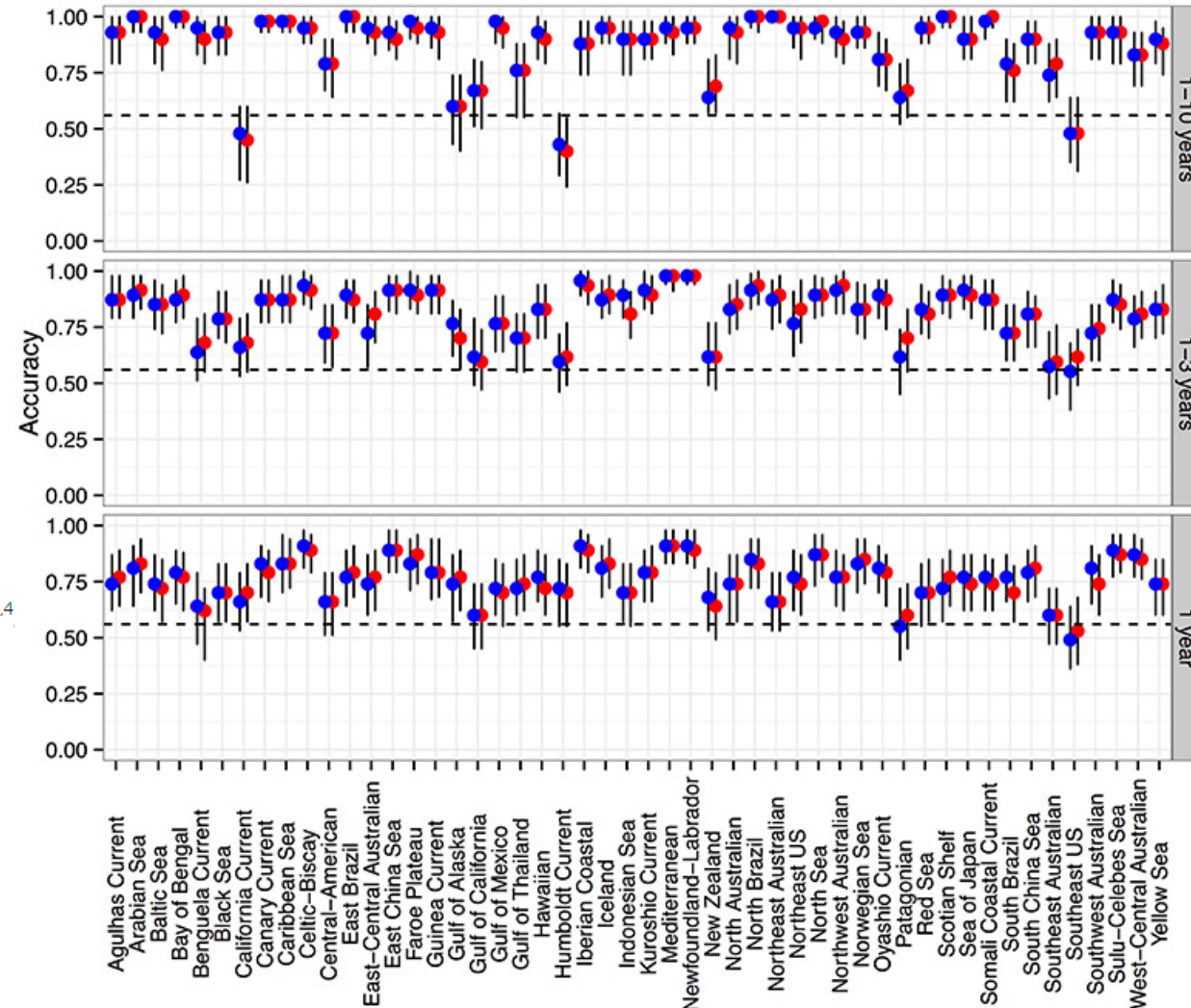
# Pacific Bluefin Tuna Case Study

## Multi-Annual Climate Predictions for Fisheries: An Assessment of Skill of Sea Surface Temperature Forecasts for Large Marine Ecosystems

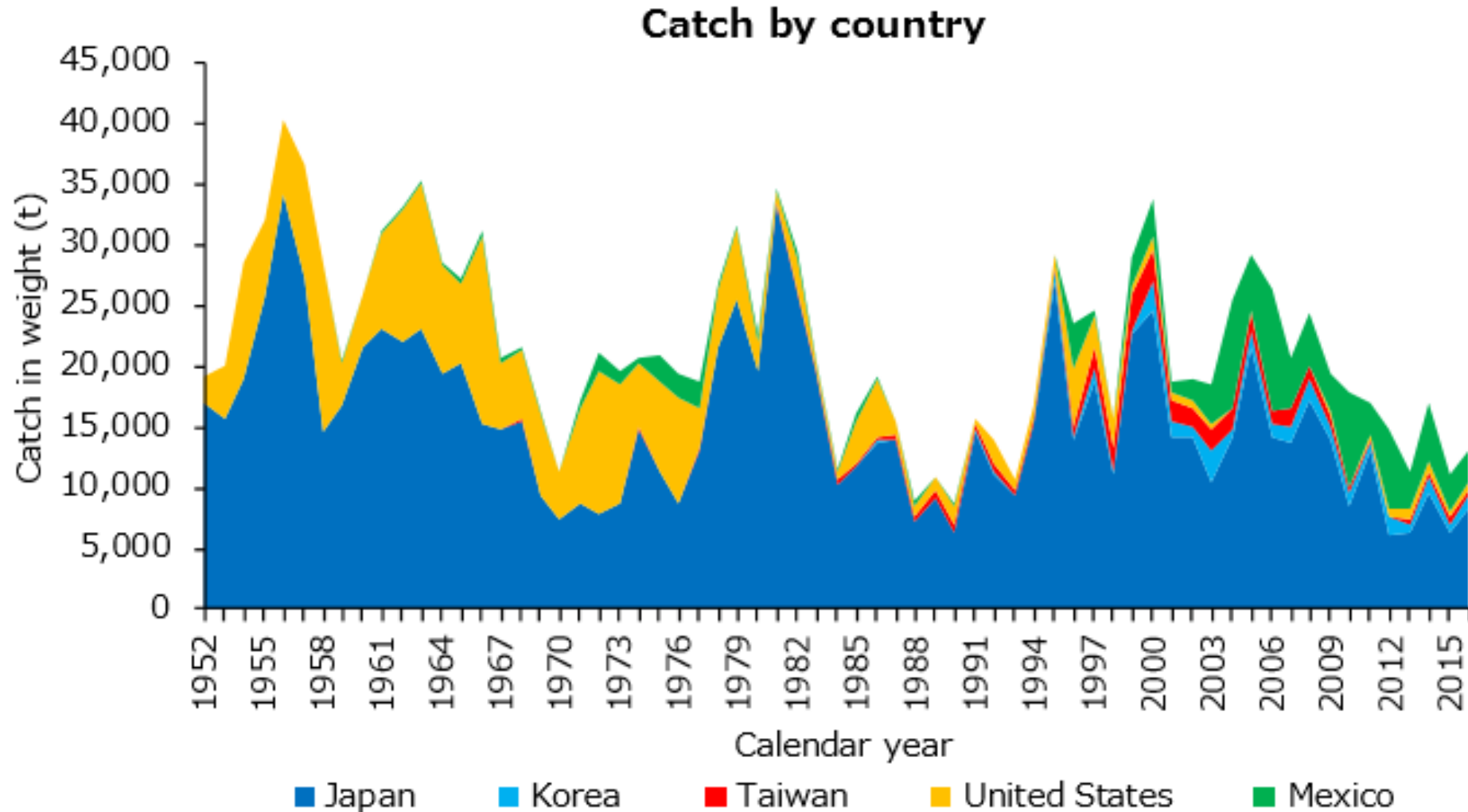
 Desiree Tommasi<sup>1,2\*</sup>,  Charles A. Stock<sup>2</sup>,  Michael A. Alexander<sup>3</sup>,  Xiaosong Yang<sup>2,4</sup>  
 Anthony Rosati<sup>2</sup> and  Gabriel A. Vecchi<sup>5,6</sup>

- skillful multiannual predictions in spawning region LMEs

Tercile  
● lower  
● upper

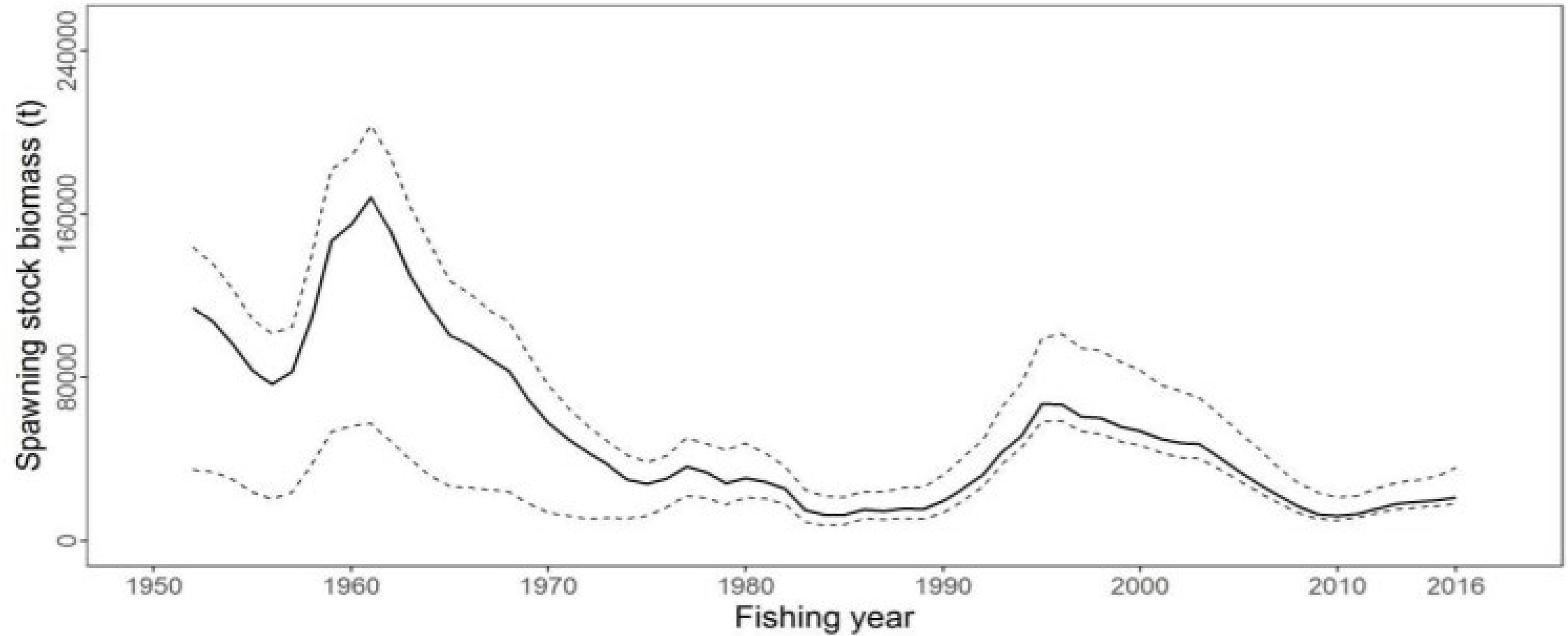


# Pacific Bluefin Tuna Catch by Country





# Pacific Bluefin Biomass



# Pacific Bluefin Tuna Harvest Control

- If the SSB projection indicates that the probability of achieving the initial rebuilding target by 2024 is less than 60%, management measures will be modified...
- If the SSB projection indicates that the probability of achieving the initial rebuilding target by 2024 is at 75% or larger, the WCPFC may increase their catch limits

# Pacific Bluefin Tuna Harvest Control

- Probabilities of achieving rebuilding target depend on stock projections
- Stock projections are sensitive to recruitment assumption
- Projections are run with average and low recruitment scenarios (resampling from 1980-1989 low recruitment period)

# Pacific Bluefin Tuna Case Study

- Are multi-annual, probabilistic recruitment forecasts skillful?
- Focused on probability of recruitment being below average (lower tercile)



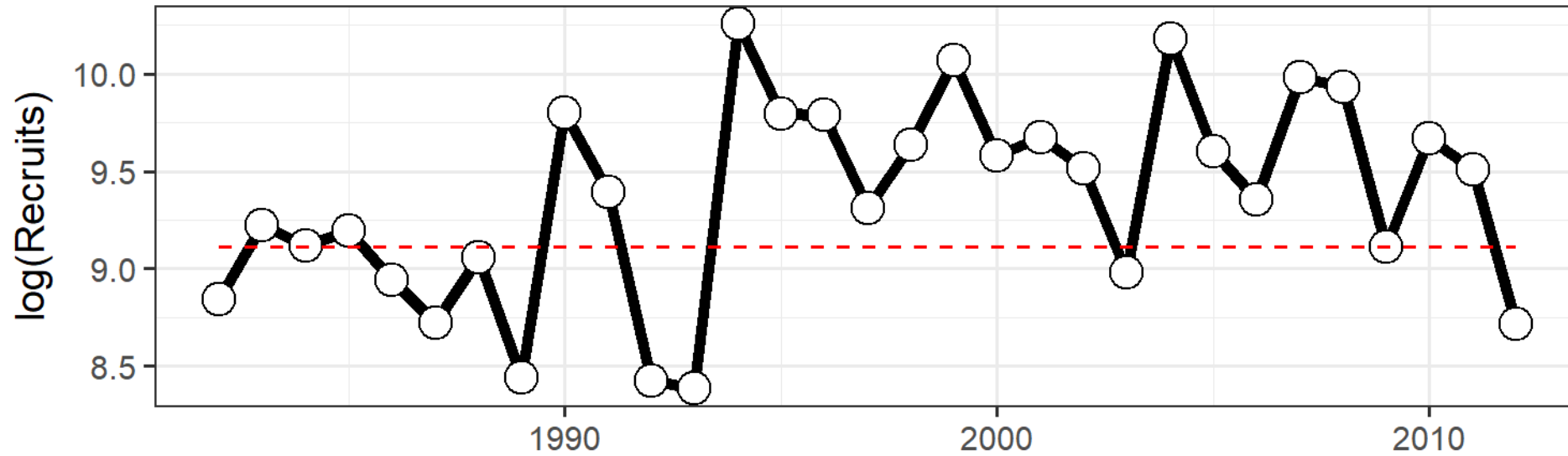
# Pacific Bluefin Tuna Case Study



SST predictions 1 to 10 years into the future for  
1991 to 2012 from GFDL CMIP5 decadal  
experiment  
Initialized between Jan 1<sup>st</sup> 1982 to Jan 1<sup>st</sup> 2012  
10 ensemble members

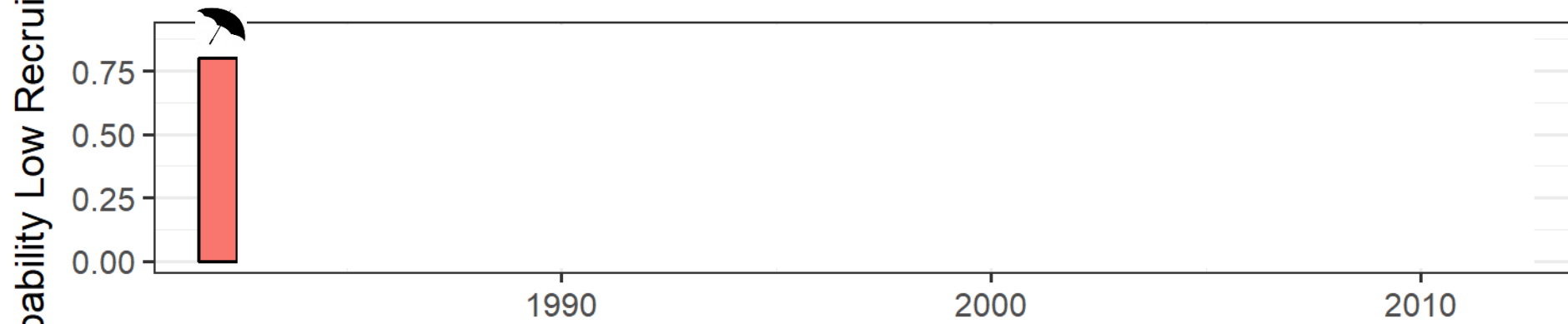
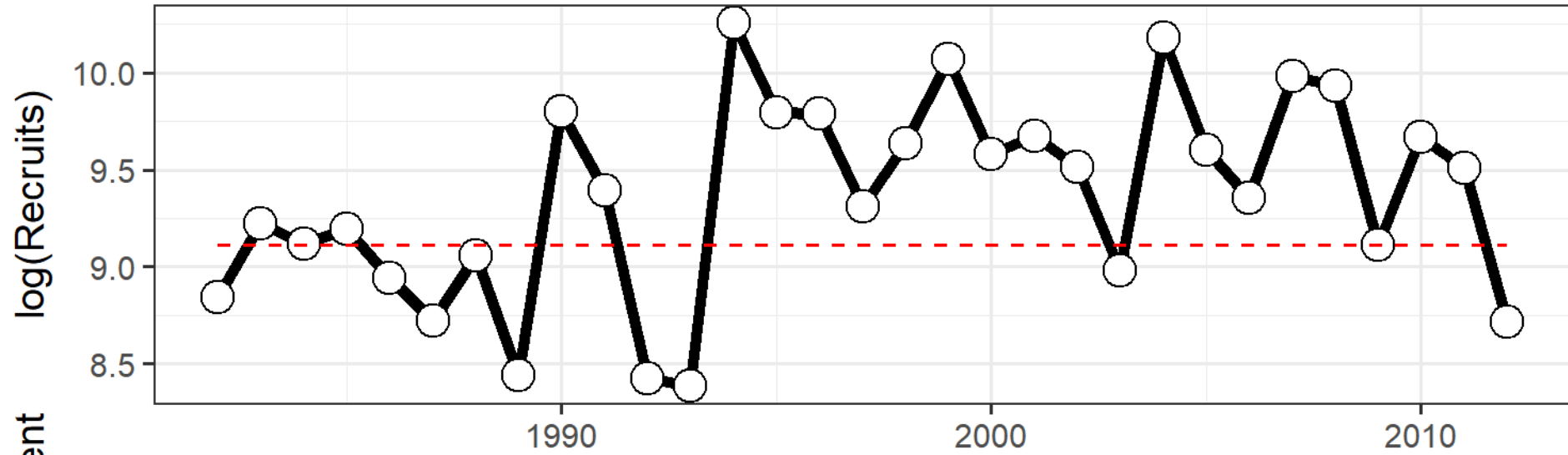
Probabilistic prediction 1 to 10  
years into the future of  
recruitment being below average

# Pacific Bluefin Case Study



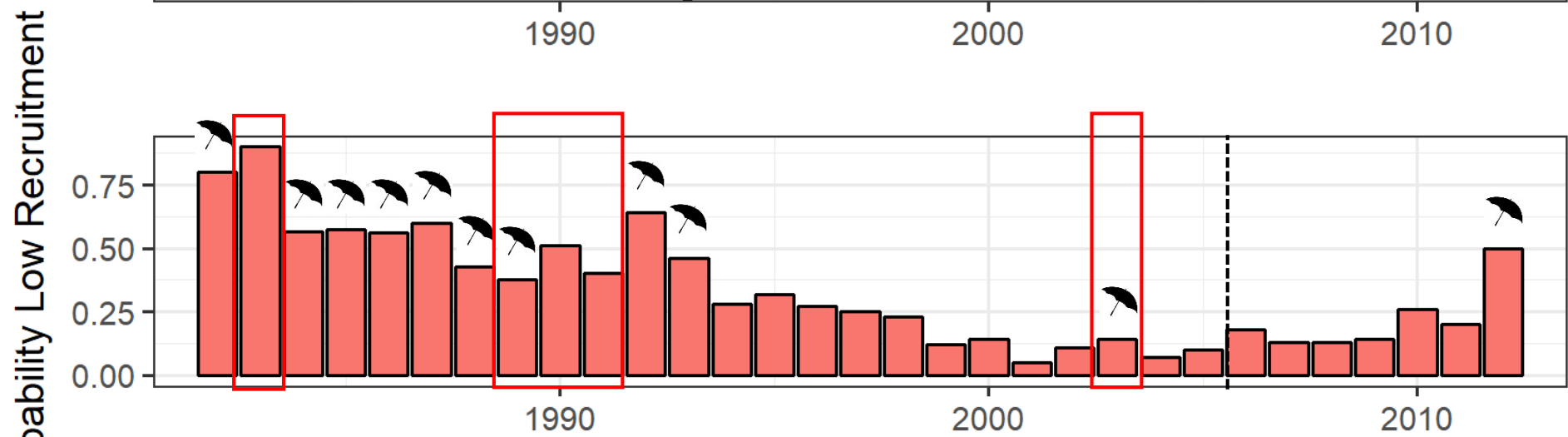
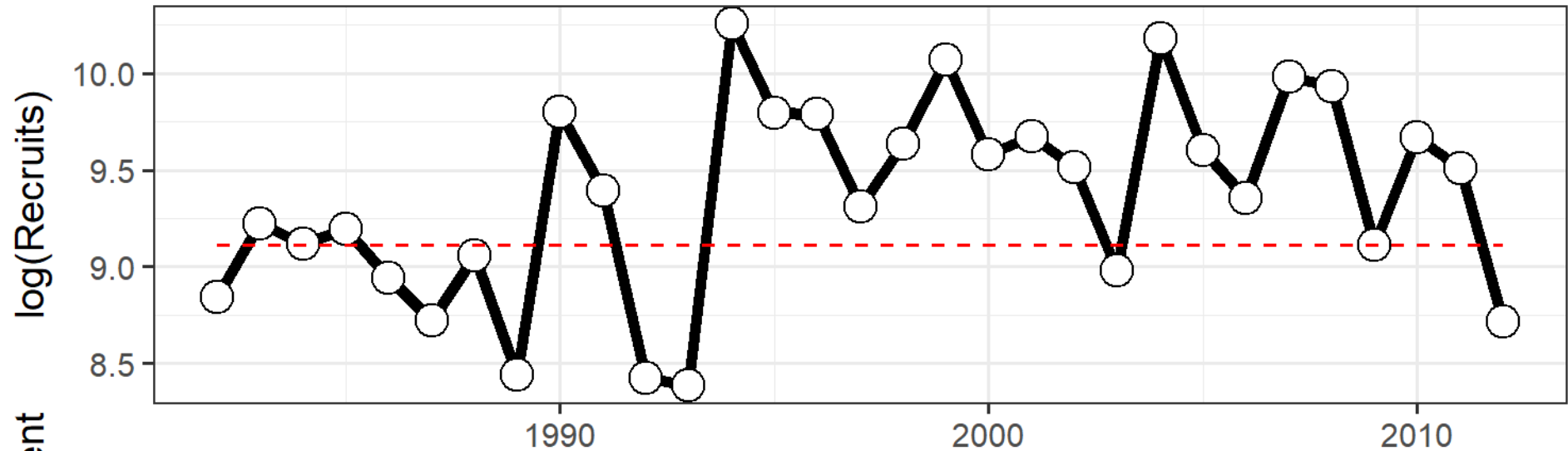


# Recruitment Forecasts



Type █ ForecastT

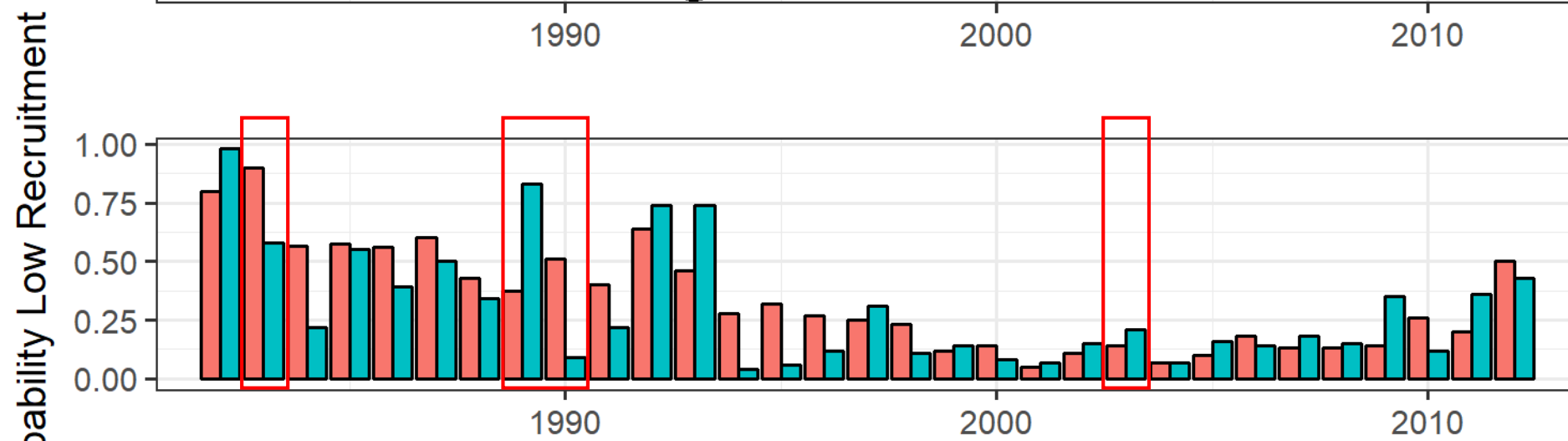
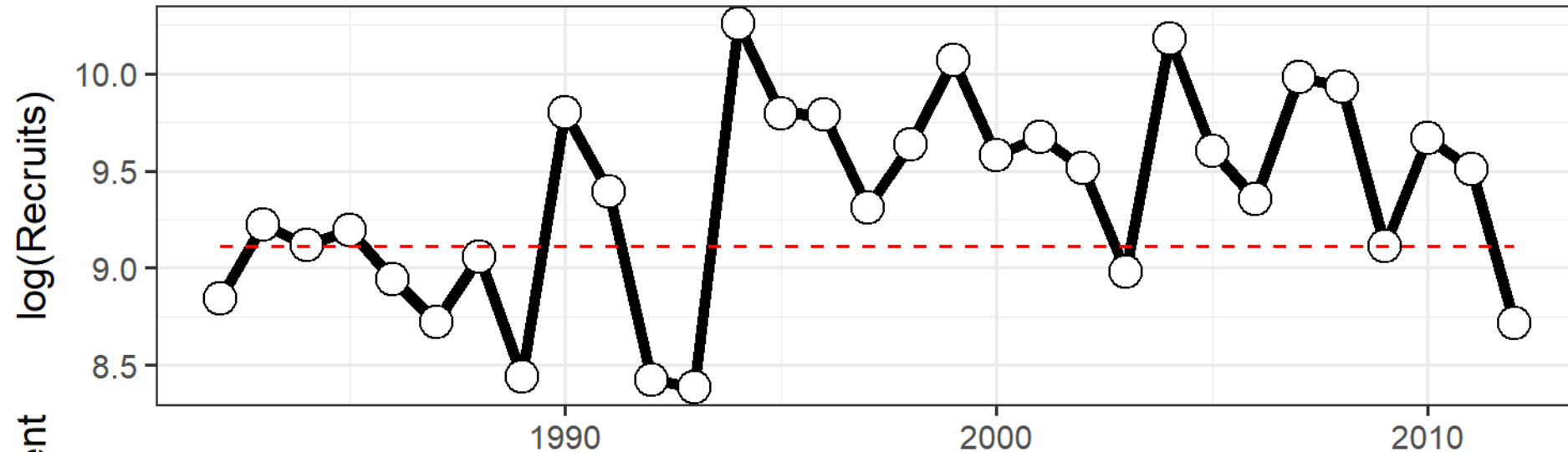
# Retrospective skill assessment



Brier Score = 0.22  
(0 to 1, lower better)

Brier Score = 0.22  
(0 to 1, lower better)

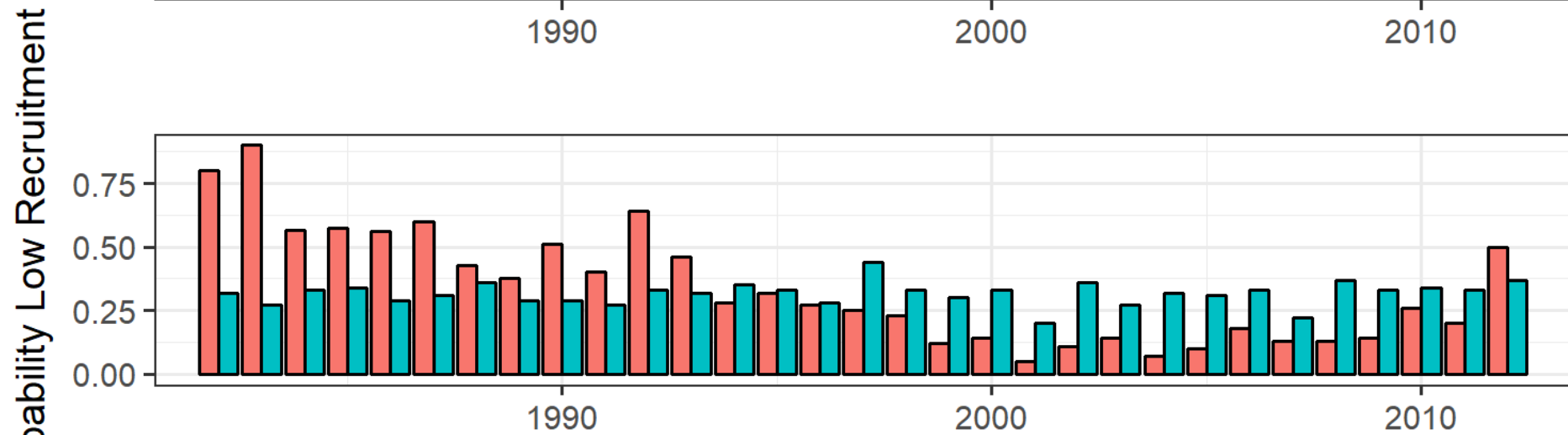
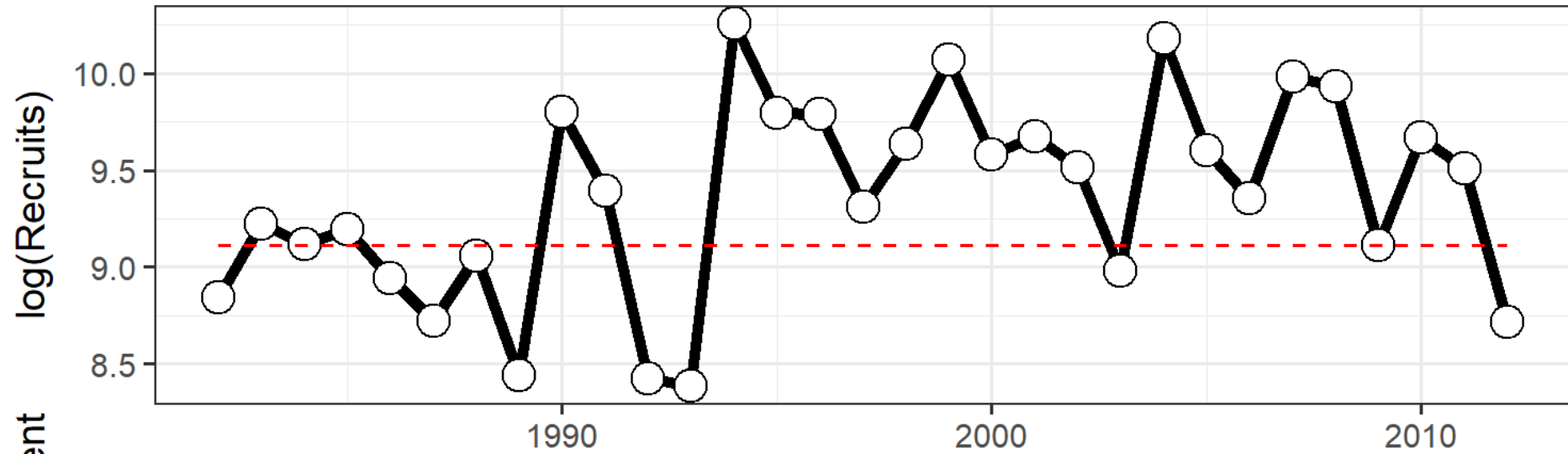
# Forecast SST vs. Perfect SST



Perfect SST Brier Score = 0.13  
(0 to 1, lower better)



# Forecast SST vs. Average Recruitment



Type █ ForecastT █ Random

# Impact on estimate of stock status

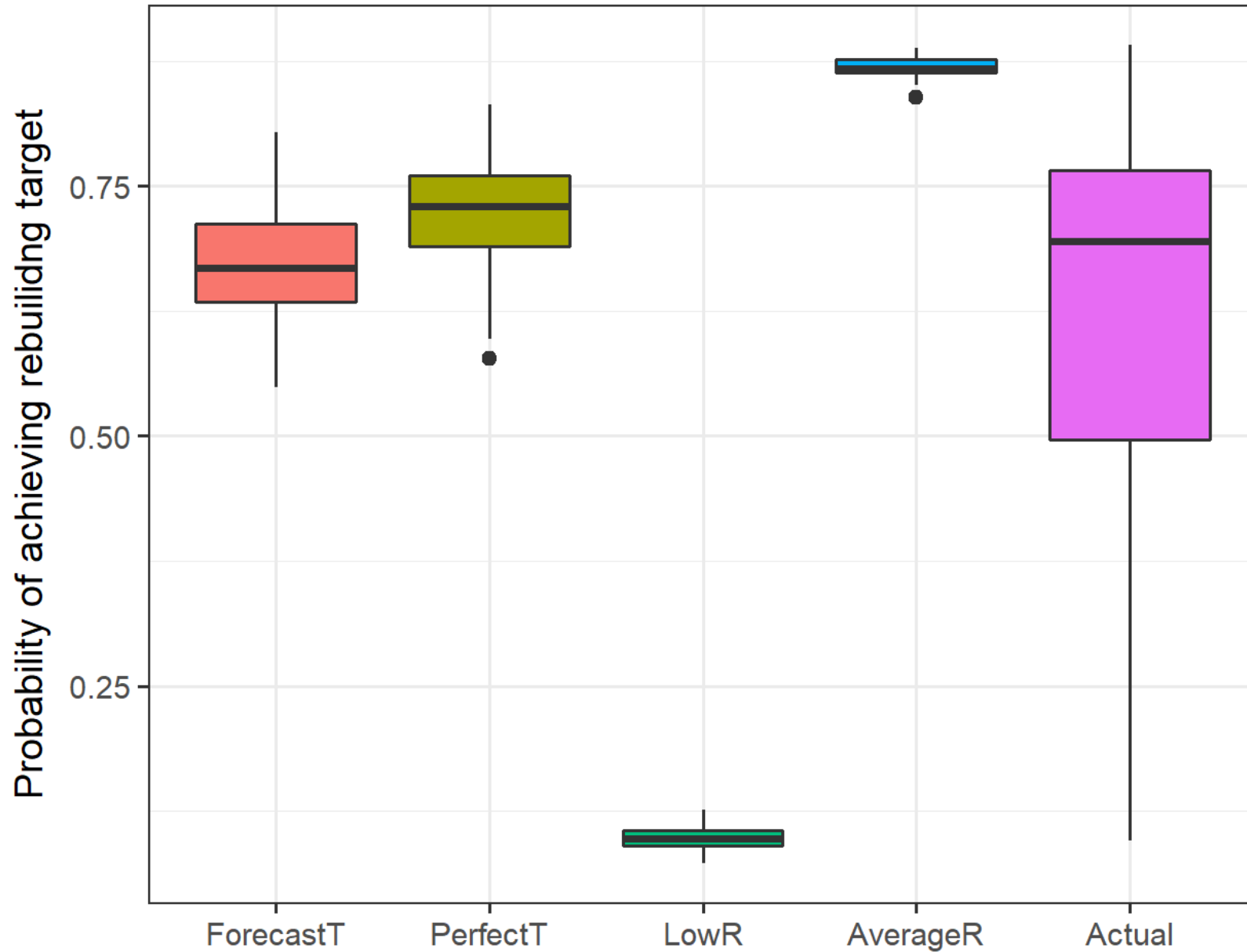
- Forced age structured population dynamics model with 5 recruitment scenarios:
  1. Actual recruits
  2. Resampling from entire recruitment time series
  3. Resampling from low recruitment period
  4. Perfect SST
  5. Forecast SST
- Compared probability of achieving rebuilding target over 8 random years across 100 simulations, each with 500 iterations per recruitment replicate

# Impact on estimate of stock status

- In SST scenarios probability of low recruitment event every year influences # of iterations forced by low recruitment period
  - 500 recruitment iterations per year
  - If probability is 0.8
  - 80% of 500 recruits sampled from low recruitment period



# Impact on estimate of stock status



# Conclusions

- Skillful recruitment forecasts informed by SST
- Larger forecast error from physical rather than biological forecast
- Mechanisms of SST predictability in the region need to be investigated
- Use of SST informed forecast may reduce bias in stock status estimate
- However, SST-informed projections of stock status appear over-confident

Thank you!



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