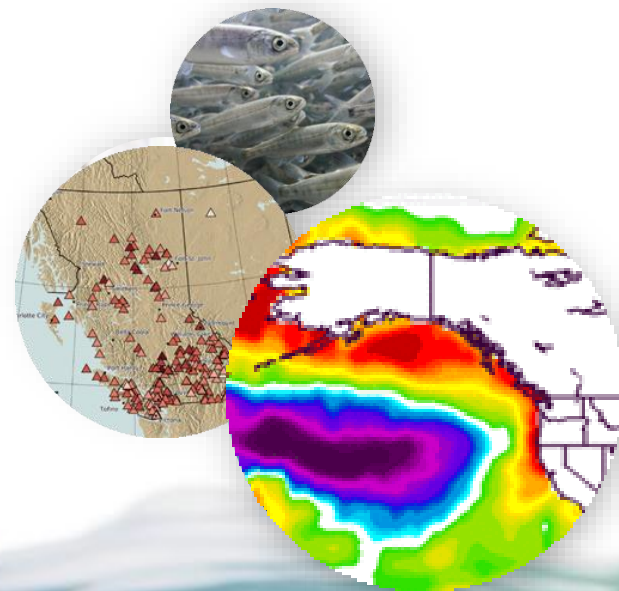


# What will influence Chilko Lake sockeye salmon as climate changes?

Yi Xu, Mike Hawkshaw, Caihong Fu, David Patterson,  
Roy Hourston, and Peter Chandler

PICES Annual Meeting

Oct 17, 2019



Fisheries and Oceans  
Canada

Pêches et Océans  
Canada

Photo credits:  
Sue Grant  
David Patterson

# Background

- 70km long x 3-5km wide
- Total area = 185 km<sup>2</sup>
- Important spawning habitat for sockeye salmon

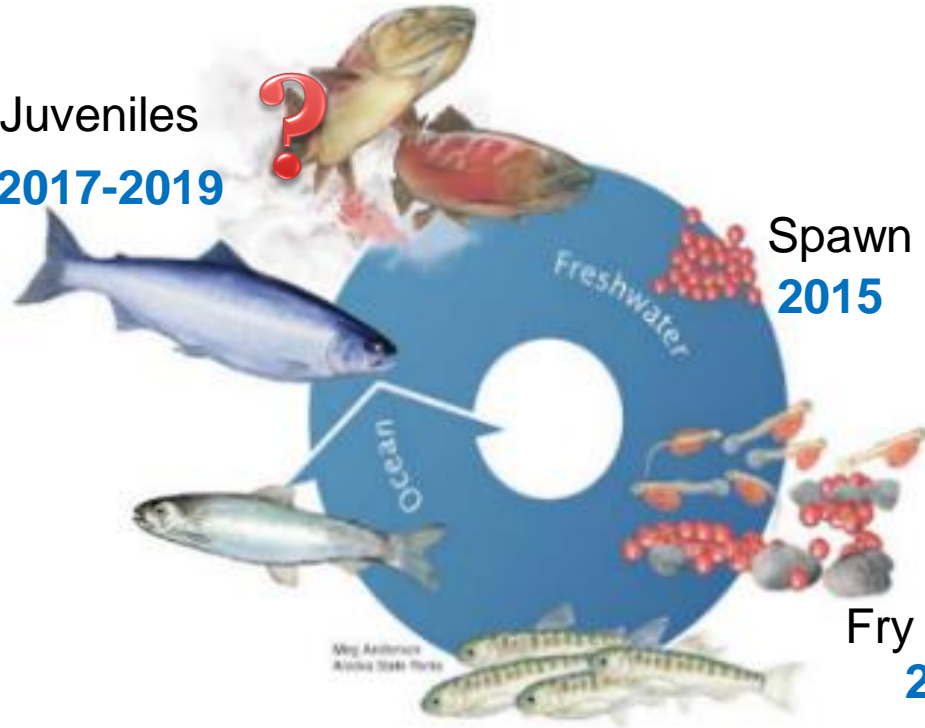
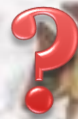


# Life History

Recruitment  
**2019**



Juveniles  
**2017-2019**



Spawn (eggs)  
**2015**

Fry emergence  
**2016**

Data Available

Spawners/Recruits 1948-2019

Juvenile 1949-2018

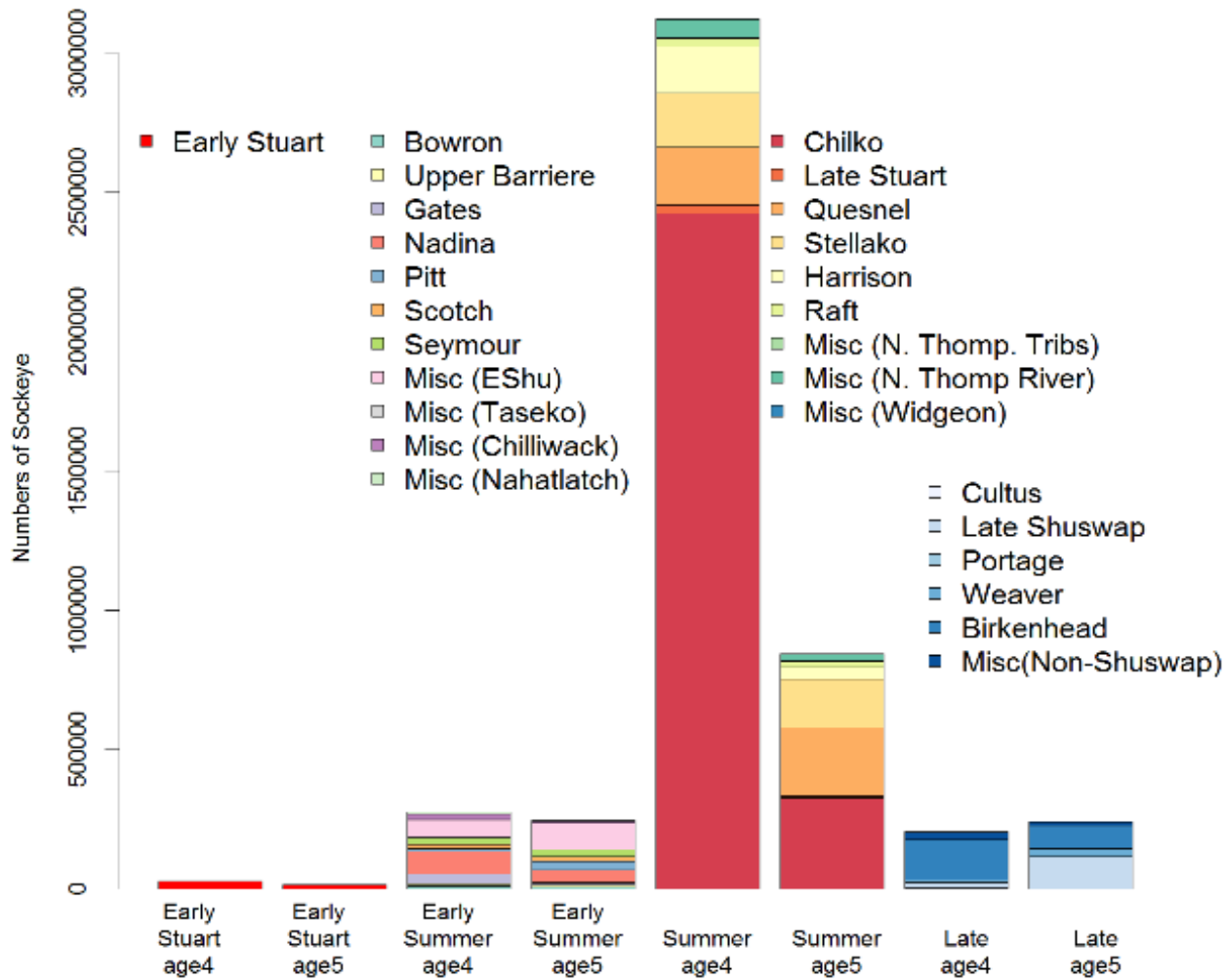
Smolts

**2017**



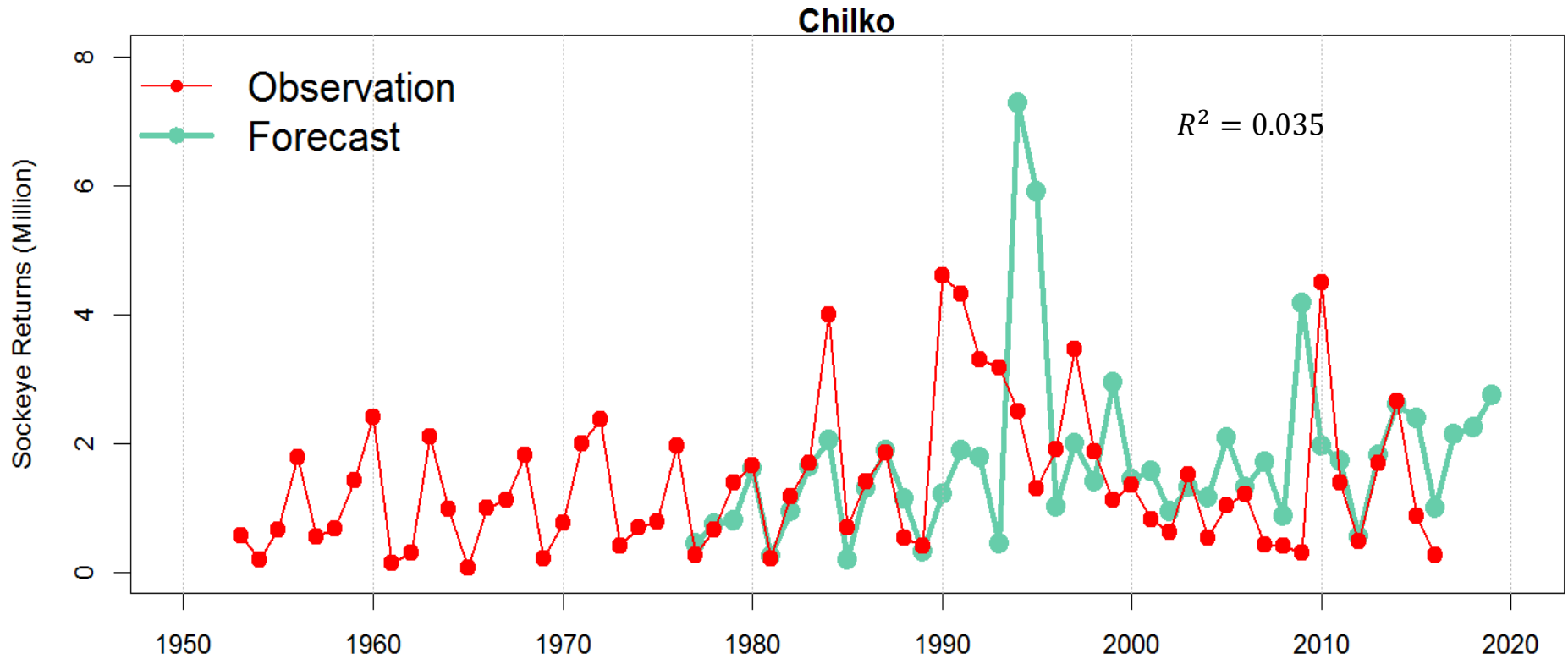
# Background

## 2019 Sockeye Pre-season Forecast



(DFO, 2019)

# Historical Pre-season Forecast



## Current Forecast Model

- Biological model (Power model) with one environmental variable: SST @ Pine Island
- Selected from 9 models (including Ricker models, Power models and Larkin models)
- Environmental co-varies considered: SST @ Entrance Island, Fraser River discharge and PDO

## Objectives

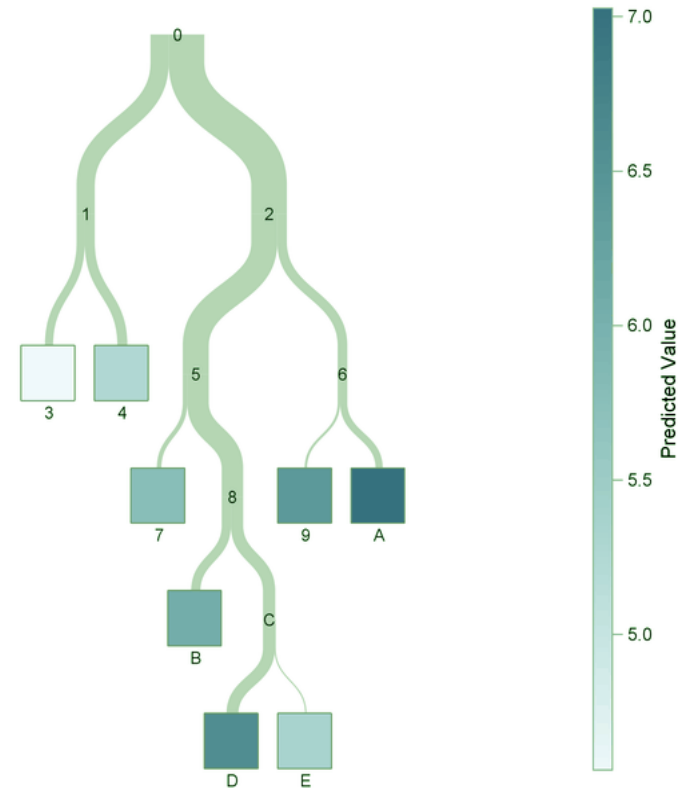
- Collect additional environmental info from freshwater and ocean
- Develop a quantitative predictive model of the influence of multiple environmental variables on sockeye recruitment
- Identify key environmental variable(s)
- Evaluate model performance by comparing predictions with available fisheries data
- Application: update forecast with new method

# Data

- Fisheries Data (Same as what was used in the 2019 forecast)
  - Spawners and Juveniles (DFO)
  - Recruits (Pacific Salmon Commission)
  
- Environmental Data
  - River: discharge, **temperature** (DFO)
  - Ocean: SST (lighthouses and **COBE model**), **SSS (lighthouses)**, **regional upwelling and downwelling favored wind stress** (DFO and NOAA)
  - Ocean/Climate Indices: PDO, **NPGO, MEI, NOI, ALPI, Bifurcation index** (NOAA and DFO)

# Model Boosted Regression Trees (BRT)

- A Tree-based method combines two algorithms
  - Regression Trees (models that relate a response to their predictors by recursive binary splits)
  - Boosting (an adaptive method for combining many simple models to give improved predictive performance)
- Available in R
  - Package name: “dismo” Version 1.1-4 and “gbm” Version 2.1.5
  - References (De’ath, 2007; User manual Elith et al., 2008)



$\log(\text{Recruits}) \sim \text{BRT}(\text{Spawners/juveniles, environmental variables})$



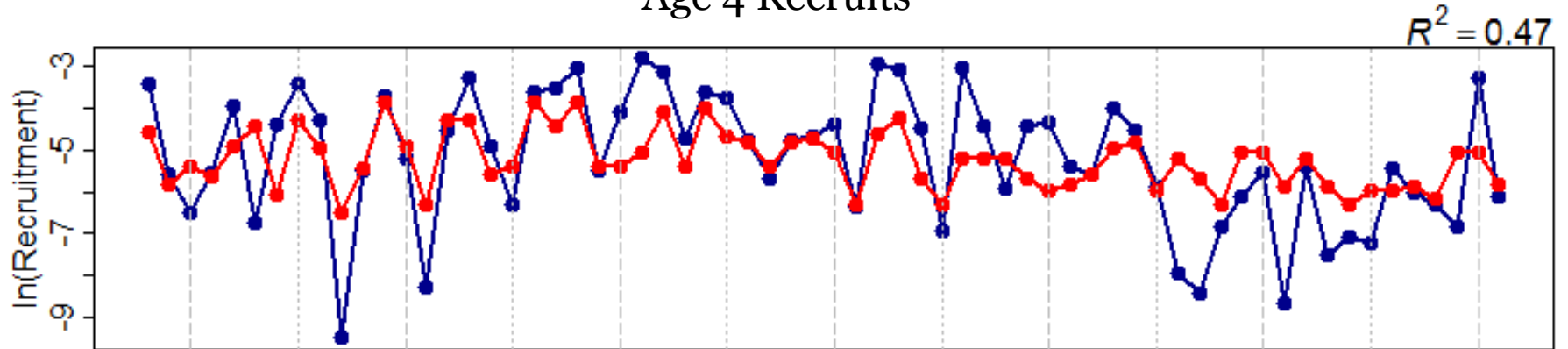
## Model Boosted Regression Trees (BRT)

	Current Model	BRT Model
Model setup	Parametric	Non-parametric
Relationship linearity	Linear (Treated Linear) only	Linear or Non-linear
Numbers of environmental variables considered	None (Naïve/biological model/Sibling model) One ( biological-env model)	Multiple
Data Structure	Normal	Normal or Skewed
Sensitivity to outliers	Somewhat	No
Sensitivity to scale	Yes	No
Ability of handling Missing Data	No	Yes

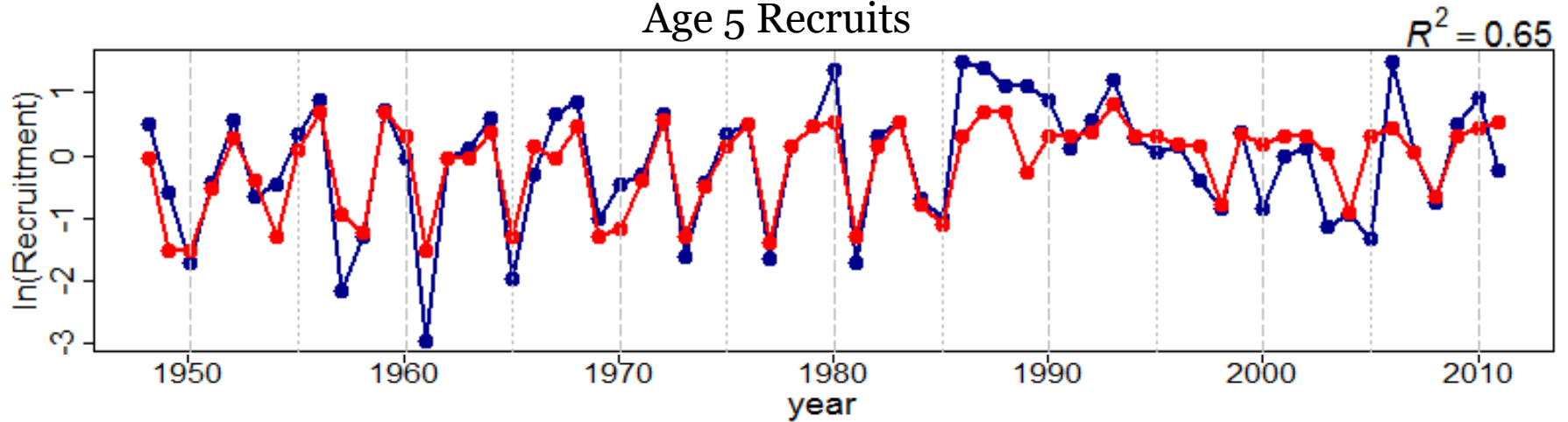
# Model Fit

— observations  
— BRT model

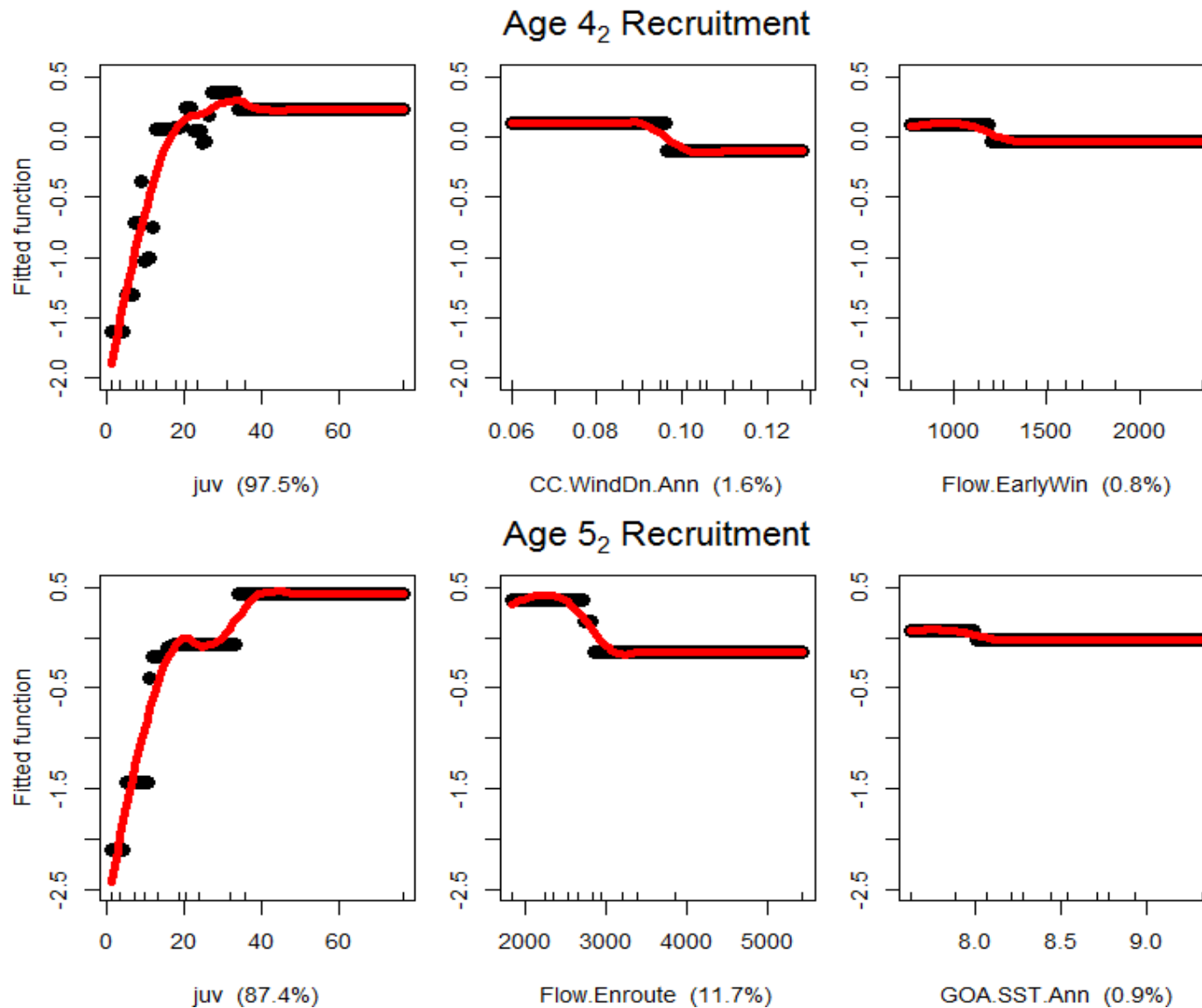
### Age 4 Recruits



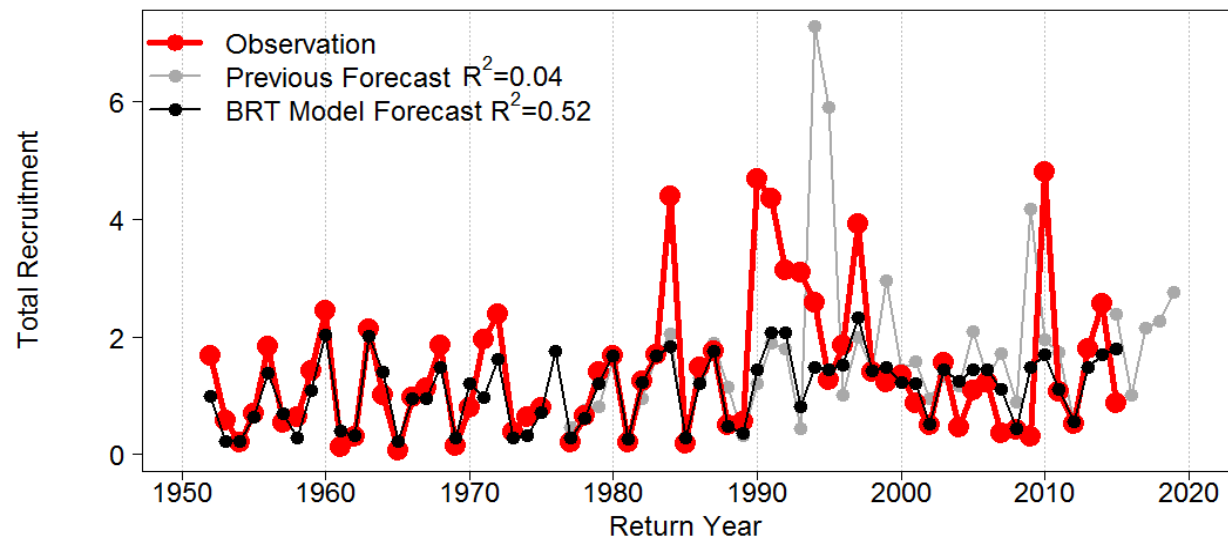
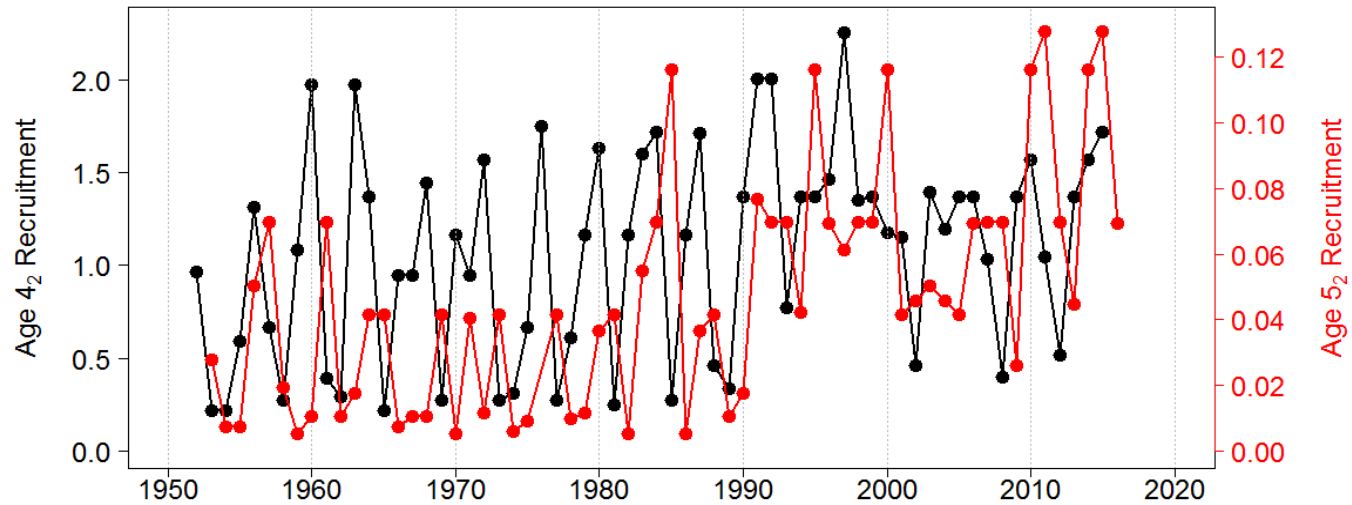
### Age 5 Recruits



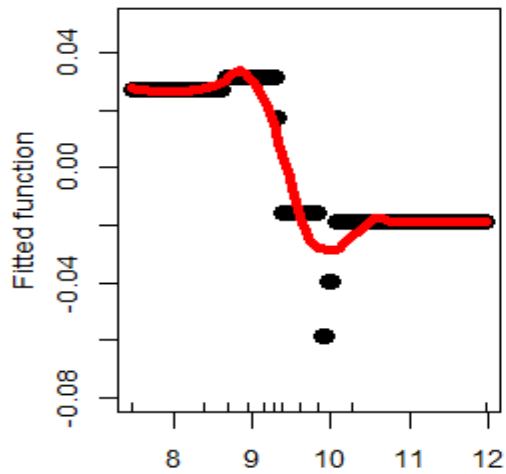
# Relative contributions



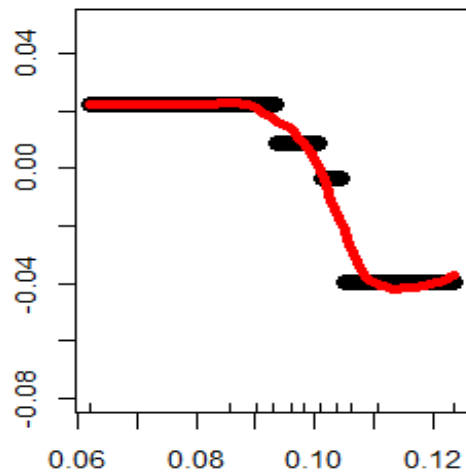
# Forecast model



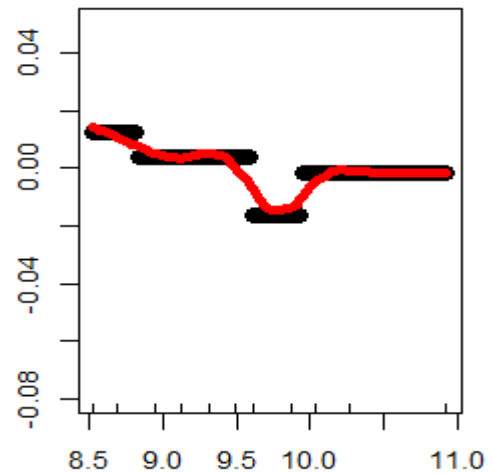
## Age 4<sub>2</sub> Proportion



EI.SST.Apr (55.8%)

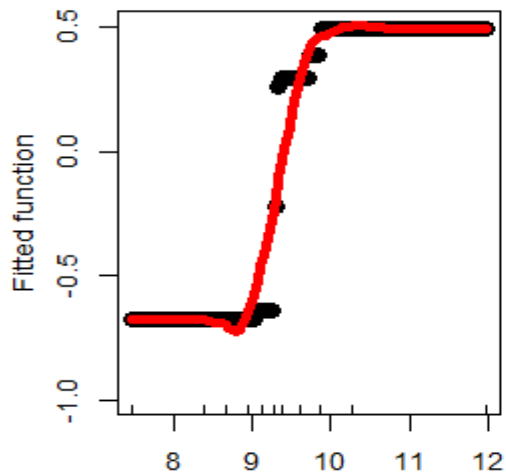


PRD.WindDn.Ann (33.6%)

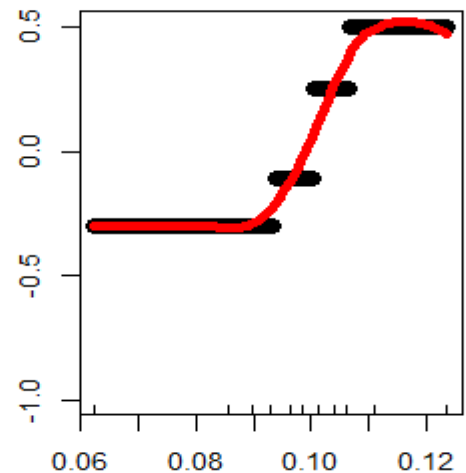


PI.SST.Jun (10.6%)

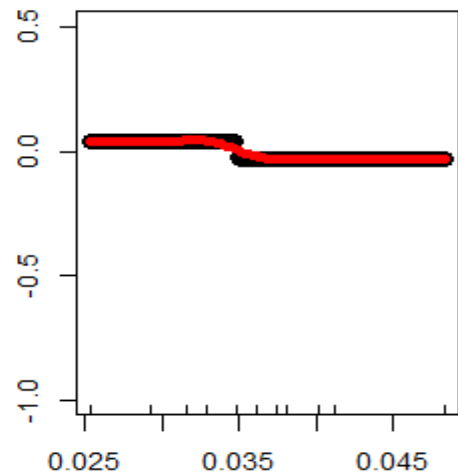
## Age 5<sub>2</sub> Proportion



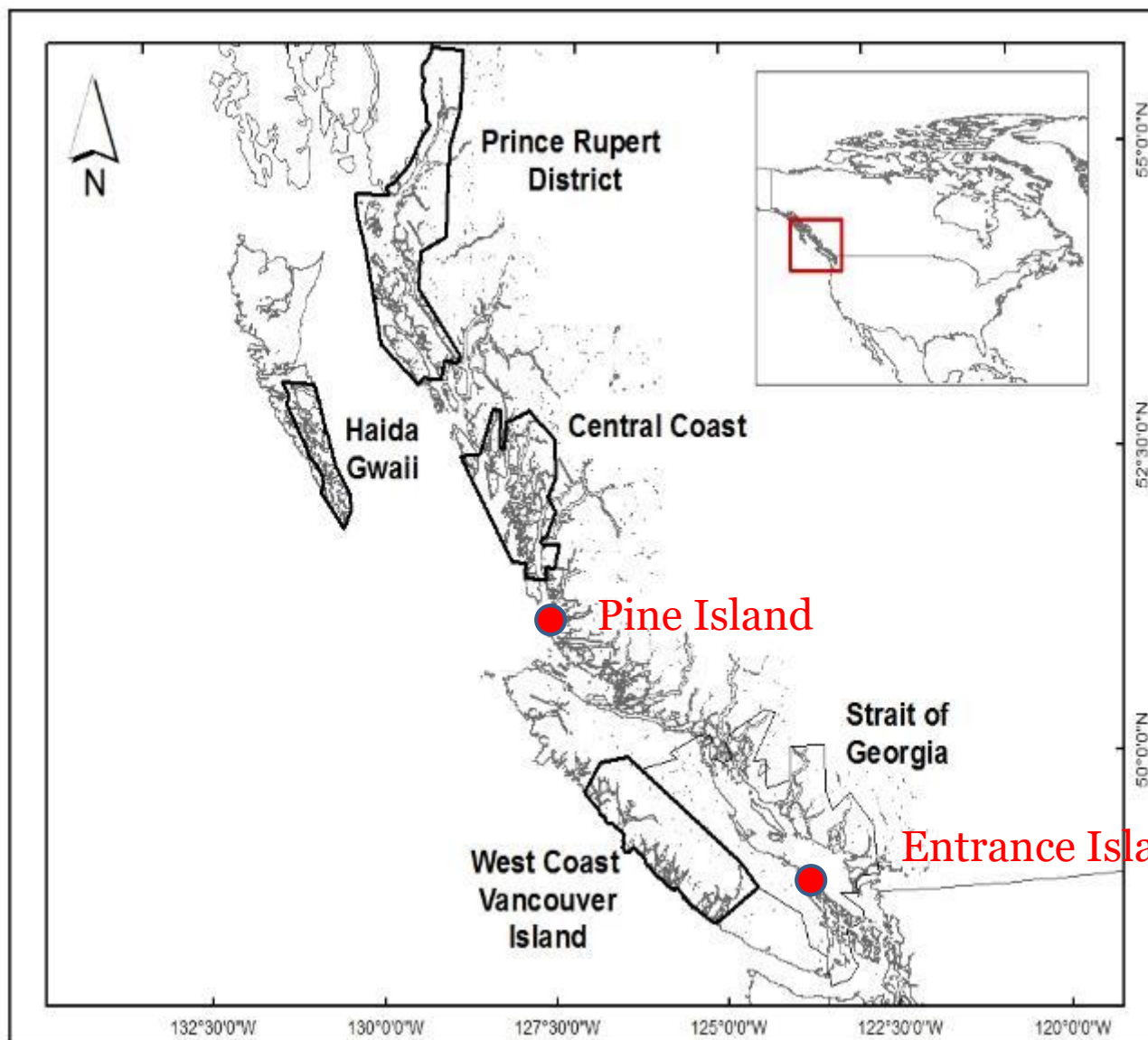
EI.SST.Apr (70.2%)



PRD.WindDn.Ann (28.6%)



CC.WindUp.Ann (1.2%)

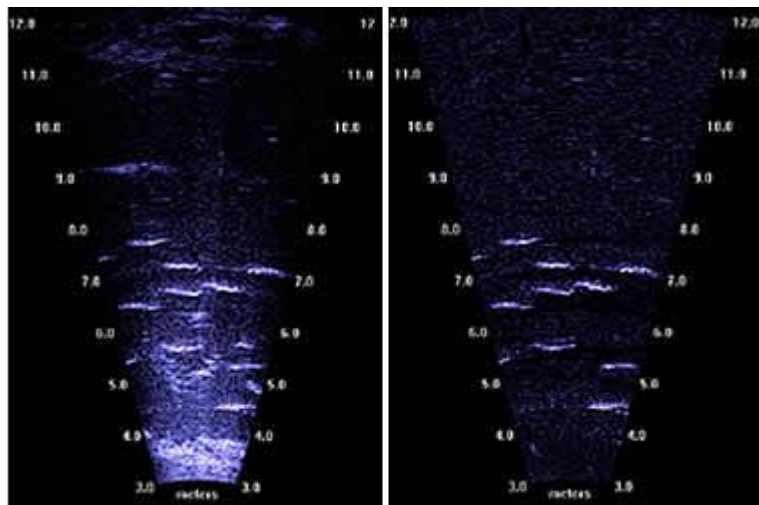


## Summary

- BRT models are developed to study age-specific stock-recruits relationship coupled with multiple environmental co-varies.
- We found that both age-4 and age-5 recruit showed a Beverton-Holt like relationship rather than Ricker/Power model.
- Environmental variables played a small role for S-R but seems to largely impact age proportion.
- These results are useful for future forecast as it seems to have better performance comparing to current forecast models.

## Future Work

- Manuscript preparation
- 2020 Fraser Sockeye Forecast
- Application: Other stocks/species
- Collaboration opportunities





## Acknowledgement

- Sockeye Data and Forecast

Timber Whitehouse, Sue Grant, Gottfried Pestal, Bronwyn MacDonald, Ann-Marie Huang, Keri Benner, Tracy Cone, Joe Tadey, Chuck Parken (DFO)  
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- Freshwater Data

David Patterson (Freshwater discharge and temperature)

- Ocean Data

Peter Chandler (Lighthouse SST and SSS), Jackie King (ALPI),  
Roy Hourston (Upwelling/Downwelling favored Wind Stress),  
Michael Malick (Bifurcation Index, NOAA)

- Others

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*Thank you!  
Merci!*

