

## Part I: Moving towards a sustainable fisheries framework for BC herring: data, models & alternative assumptions.

## Part II: Stock assessment and management advice for BC Herring stocks (2011/2012)

Steven Martell, Jake Schweigert, Jaclyn Cleary, Vivian Haist

University of British Columbia

*[martell.steve@gmail.com](mailto:martell.steve@gmail.com)*

September 6, 2011



# Contents

## 1 Sustainable Fisheries Framework

- HCAM Review
- Harvest Control Rule
- Precautionary Approach

## 2 Part I

- Analytical Methods
  - Input Data
  - Model description
- Simulation testing
- SOG Comparison
- Spawning biomass in major areas
- Discussion

## 3 Part II

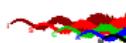
- Introduction
- 2011 Data
- Analytical Methods
- Maximum Likelihood Estimates
- Diagnostics
- Advice for management



June 2010: HCAM Review Workshop

## Terms of Reference (paraphrased)

- Herring spawn index, is  $q = 1$  assumption appropriate?
  - HCR, should CUTOFF change in concert with  $B_0$  updates?
  - What is the best way to parameterize natural mortality?
  - Are the priors appropriate and is uncertainty appropriately reflected in assessments?
  - Preference for selectivity/availability parameterization.
  - Should stock assessments be conducted on a risk-neutral or risk-averse basis?
  - Appropriate assumptions for an operating model (MSE).



## June 2010: HCAM Review Workshop

### Terms of Reference (paraphrased)

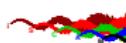
- Herring spawn index, is  $q = 1$  assumption appropriate?
  - HCR, should CUTOFF change in concert with  $B_0$  updates?
  - What is the best way to parameterize natural mortality?
  - Are the priors appropriate and is uncertainty appropriately reflected in assessments?
  - Preference for selectivity/availability parameterization.
  - Should stock assessments be conducted on a risk-neutral or risk-averse basis?
  - Appropriate assumptions for an operating model (MSE).



## Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.

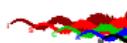
The model parameterization of  $q$  could potentially have the single greatest effect on estimation of management parameters, and as such further investigation is recommended.



## Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.

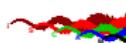
If the intention is that the CUTOFF represents 25%  $B_0$  then it should be updated in conjunction with stock assessment updates.



## Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.

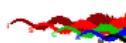
Estimates of MSY based reference points are sensitive to the assumed form of the recruitment model and allocation to gears with different selectivities.



## Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.

Note that MLE estimates of  $\sigma_R$  are biased; values from the joint posterior distribution are unbiased.



# Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.



# Summary of Panel Recommendations

- ① Assumption that  $q = 1$  was inappropriate.
  - ② CUTOFFS can be fixed or updated annually.
  - ③ A model based approach to estimating  $B_0$  and  $B_{MSY}$  is appropriate.
  - ④ Recruitment variation  $\sigma_R$  should be estimated within the model.
  - ⑤ Issues regarding estimation of selectivity, natural mortality and  $q$  should be explored.
  - ⑥ Science advice should be risk neutral.



## Current Harvest Control Rule

- CUTOFF set at 0.25  $B_0$  (last updated in 1996).
  - 20% exploitation rate.
  - Forecast based on poor, average, good recruitment.

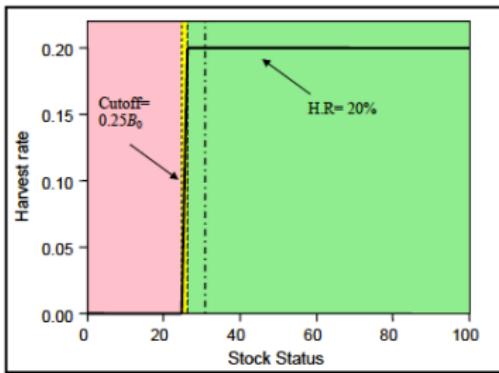
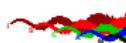
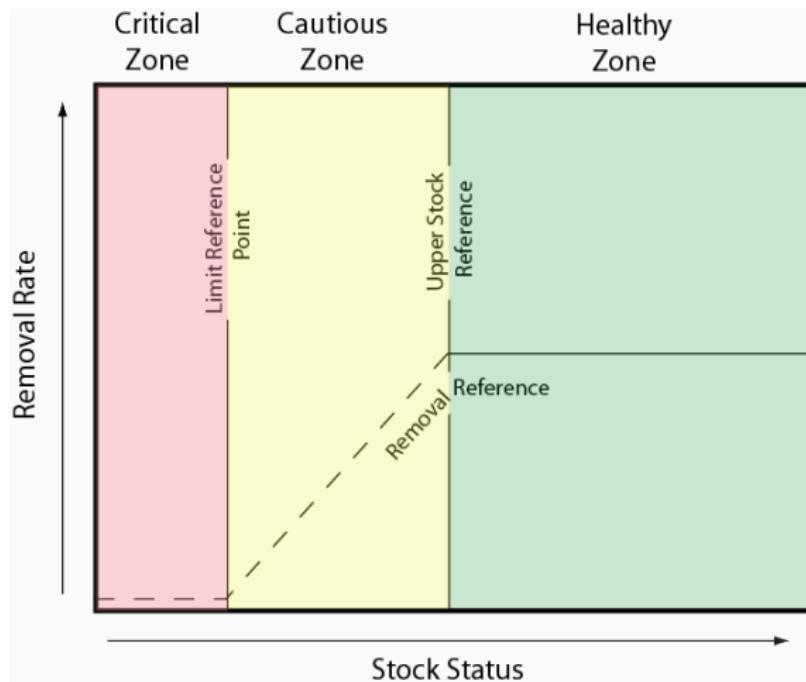


Figure: HCR for herring stocks.



## Harvest Strategy Compliant with Precautionary Approach



**Figure:** Fisheries management framework consistent with a precautionary approach.

## Key elements for the new framework

## Reference points

- Limit Reference Point (LRP) & Upper Stock Reference (USR) requires knowledge of stock productivity and population scale.
  - Removal Rate requires knowledge of stock productivity.
  - MSY-based reference points require *a priori* allocation to different gears.

## Risk & Decision making

- Onus on being able to reliably determine stock status (informative data).



# Contents

## 1 Sustainable Fisheries Framework

- HCAM Review
- Harvest Control Rule
- Precautionary Approach

## 2 Part I

- Analytical Methods
  - Input Data
  - Model description
- Simulation testing
- SOG Comparison
- Spawning biomass in major areas
- Discussion

## 3 Part II

- Introduction
- 2011 Data
- Analytical Methods
- Maximum Likelihood Estimates
- Diagnostics
- Advice for management



# Input data

The input data for  $iSCA_M$  is the same as HCAM:

- Catch by gear,
- Spawn survey index,
- Age-composition data for all gears,
- Empirical weight-at-age data.



# Integrated Statistical Catch Age Model ( $^i\text{SCAM}$ )

- The model is based on a statistical catch-age framework first developed by Fournier and Archibald (1982).
- Flexible options for modelling selectivity, natural mortality, & survey catchability.
- Integrated framework: joint estimation of policy parameters (e.g., reference points).
- Model is implemented in AD Model Builder ADMB Project (2009), and the source code is maintained at:  
<http://code.google.com/p/iscam-project/>



## Assumptions I

## Error distributions

- Observation errors in catch are lognormal &  $\sigma$  is known.
  - Errors in spawn survey are lognormal &  $\sigma$  is unknown.
  - Recruitment deviations are lognormal &  $\sigma$  is unknown.
  - Age-composition residuals follow a multivariate-logistic distribution.

# Selectivity

- Seine gears: asymptotic and time invariant.
  - Gillnet gear: parametric logistic function with weight anomalies as a covariate.



## Assumptions II

## Structural assumptions

- Age-2 recruitment with a Beverton-Holt model.
  - Fishing & natural mortality occur simultaneously (Baranov catch equation).
  - Natural mortality is age-independent.
  - Natural mortality can vary over time (random walk,  $\sigma = 0.1$ ).
  - 100% of the total mortality occurs before spawning.
  - Fecundity is proportional to mature biomass.

## Equilibrium & MSY-based reference points

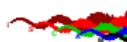
- $B_o$  is based on average  $M$  and average fecundity-at-age.
  - $B_{MSY}$  is based on average ( $M$ ) and fecundity in terminal year.



# Objective function

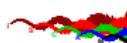
Major components of the objective function

- ① Likelihoods for data.
- ② Likelihoods for structural assumptions.
- ③ Phased penalties to ensure regular solution.
- ④ Prior densities for model parameters.



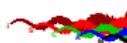
# Likelihoods for data

- Normal density functions for:
  - catch residuals (log-scale) with fixed  $\sigma^2$ ,
  - spawn survey residuals (log-scale) with estimated  $\sigma^2$ .
  
- Multivariate logistic function for age-composition evaluated at the conditional MLE of  $\sigma^2$ .
  - age-proportions < 2% are pooled into adjacent age class.



# Likelihoods for data

- Normal density functions for:
  - catch residuals (log-scale) with fixed  $\sigma^2$ ,
  - spawn survey residuals (log-scale) with estimated  $\sigma^2$ .
  
- Multivariate logistic function for age-composition evaluated at the conditional MLE of  $\sigma^2$ .
  - age-proportions < 2% are pooled into adjacent age class.



# Structural Assumptions

- Stock-recruitment

$$\ln \ell = n \ln(\tau) + \frac{\sum_t \delta_t^2}{2\tau^2},$$
$$\delta_t = \ln(N_{2,t}) - \ln(f(SB_t))$$

- Natural mortality (random walk)

$$M_{t+1} = M_t \exp(\varphi_t)$$

$$\ln \ell = n \ln(\sigma) + \frac{\sum_{t=2}^T (\varphi_t - \varphi_{t-1})^2}{2\sigma^2}$$



# Structural Assumptions

- Stock-recruitment

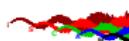
$$\ln \ell = n \ln(\tau) + \frac{\sum_t \delta_t^2}{2\tau^2},$$

$$\delta_t = \ln(N_{2,t}) - \ln(f(SB_t))$$

- Natural mortality (random walk)

$$M_{t+1} = M_t \exp(\varphi_t)$$

$$\ln \ell = n \ln(\sigma) + \frac{\sum_{t=2}^T (\varphi_t - \varphi_{t-1})^2}{2\sigma^2}$$



# Phased Penalties

- Mean fishing mortality rate:

$$\ln(\sigma_{\bar{F}}) + \frac{(\ln(\bar{F}) - \ln(0.2))^2}{2\sigma_{\bar{F}}^2}, \quad \sigma_{\bar{F}}^{(1-3)} = 0.05, \quad \sigma_{\bar{F}}^{(4)} = 2.0$$

- Deviations in average recruitment:

$$\ln(\sigma_\omega) + \frac{\sum_t \omega_t^2}{2\sigma_\omega^2}, \quad \sigma_\omega^{(1-3)} = 0.0707, \quad \sigma_\omega^{(4)} = 2.0$$

$$\ln(\sigma_{\ddot{\omega}}) + \frac{\sum_t \ddot{\omega}_t^2}{2\sigma_{\ddot{\omega}}^2}, \quad \sigma_{\ddot{\omega}}^{(1-3)} = 0.0707, \quad \sigma_{\ddot{\omega}}^{(4)} = 2.0$$



## Phased Penalties

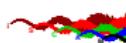
- Mean fishing mortality rate:

$$\ln(\sigma_{\bar{F}}) + \frac{(\ln(\bar{F}) - \ln(0.2))^2}{2\sigma_{\bar{F}}^2}, \quad \sigma_{\bar{F}}^{(1-3)} = 0.05, \quad \sigma_{\bar{F}}^{(4)} = 2.0$$

- Deviations in average recruitment:

$$\ln(\sigma_\omega) + \frac{\sum_t \omega_t^2}{2\sigma_\omega^2}, \quad \sigma_\omega^{(1-3)} = 0.0707, \quad \sigma_\omega^{(4)} = 2.0$$

$$\ln(\sigma_{\ddot{\omega}}) + \frac{\sum_t \dot{\omega}_t^2}{2\sigma_{\ddot{\omega}}^2}, \quad \sigma_{\ddot{\omega}}^{(1-3)} = 0.0707, \quad \sigma_{\ddot{\omega}}^{(4)} = 2.0$$



# Priors I

Table: Prior distributions for key model parameters.

Parameter	Distribution	P1	P2
$\ln(R_0)$	Uniform	-5.0	15
Steepness	Beta	10.0	4.925373
Natural mortality ( $\ln(M)$ )	Normal	-0.7985077	0.2
Rbar	Uniform	-5.0	15
Rinit	Uniform	-5.0	15
Variance ratio ( $\rho$ )	Beta	17.08696	39.0559
Precision	Gamma	25.0	28.75
Survey $\ln(q)$	Normal	-0.569	0.274



Priors II

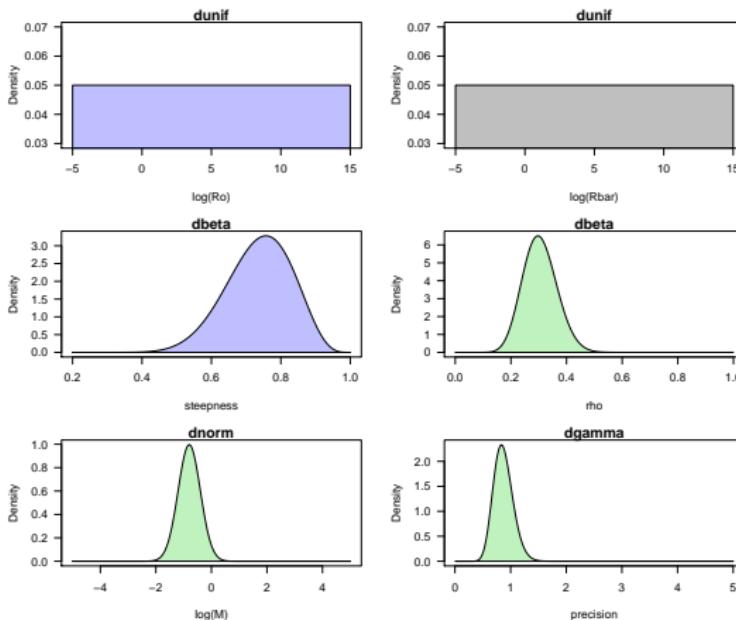
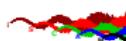
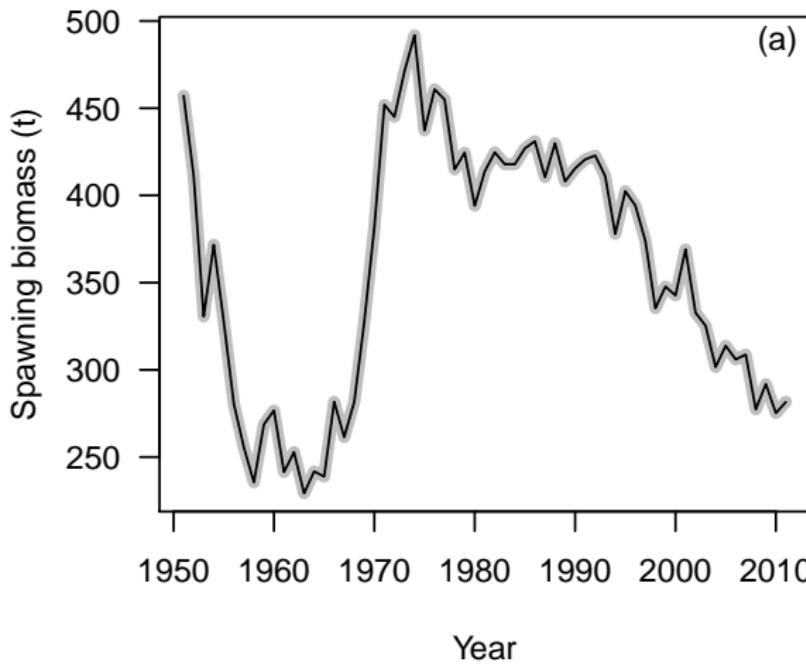


Figure: Prior densities for leading model parameters.



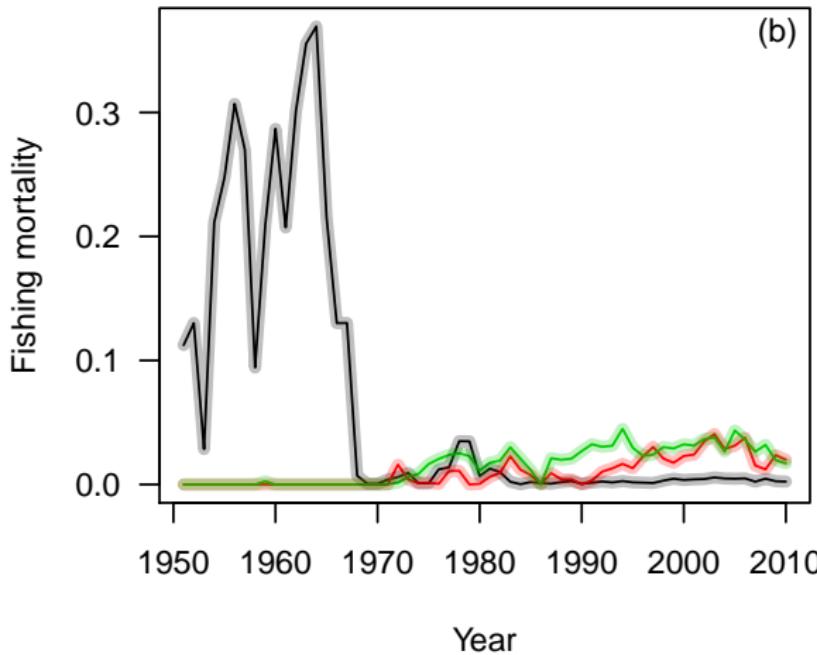
# Simulation testing

Estimation performance with perfect information.



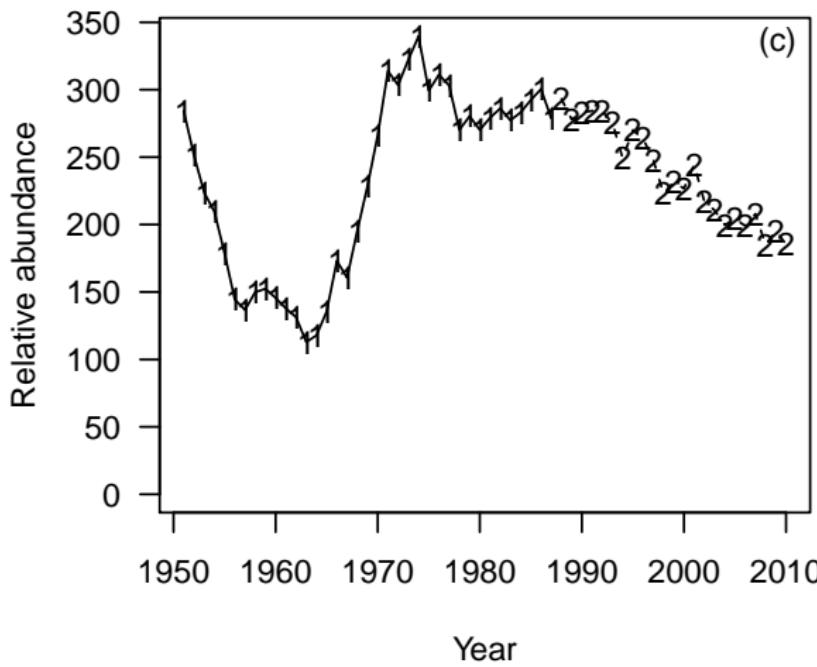
# Simulation testing

Estimation performance with perfect information.



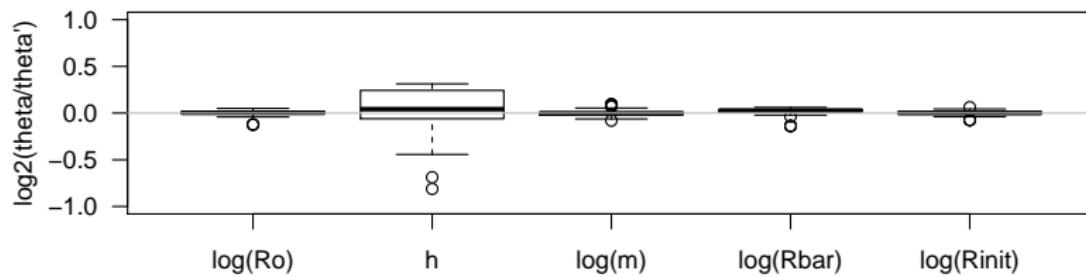
# Simulation testing

Estimation performance with perfect information.



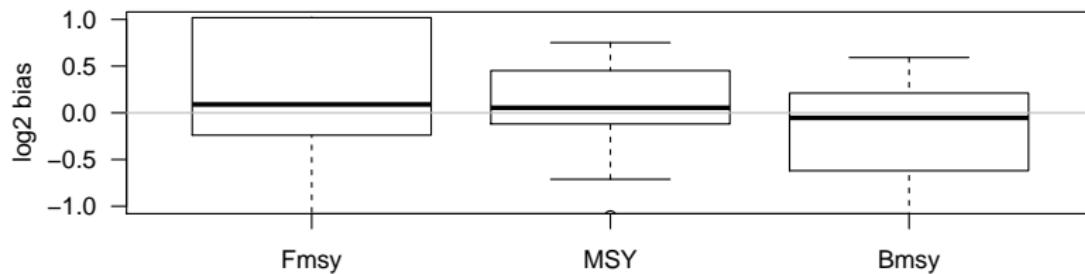
# Precision & Bias

Bias ratios for key model parameters based on 50 simulated data sets.



# Precision & Bias

Bias ratios for key model parameters based on 50 simulated data sets.

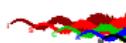


# Strait of Georgia

Objective: set up  $iSCA_M \sim HCAM$  & compare.

## Significant differences between $iSCA_M$ & HCAM

- Likelihood for age-comps.
- Pooling of age-proportions less than 2% into adjacent cohort.
- Conditional MLE for survey  $q$ .
- Estimation of total variance and variance partitioning parameter  $(\vartheta, \rho)$ .
- Prior for steepness ( $h \sim \text{Beta}$  in  $iSCA_M$ )

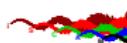


# Strait of Georgia

Objective: set up  $iSCA_M \sim HCAM$  & compare.

## Significant differences between $iSCA_M$ & HCAM

- Likelihood for age-comps.
- Pooling of age-proportions less than 2% into adjacent cohort.
- Conditional MLE for survey  $q$ .
- Estimation of total variance and variance partitioning parameter  $(\vartheta, \rho)$ .
- Prior for steepness ( $h \sim \text{Beta}$  in  $iSCA_M$ )



# Strait of Georgia

Objective: set up  $iSCA_M \sim HCAM$  & compare.

## Significant differences between $iSCA_M$ & HCAM

- Likelihood for age-comps.
- Pooling of age-proportions less than 2% into adjacent cohort.
- Conditional MLE for survey  $q$ .
- Estimation of total variance and variance partitioning parameter  $(\vartheta, \rho)$ .
- Prior for steepness ( $h \sim \text{Beta}$  in  $iSCA_M$ )

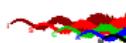


# Strait of Georgia

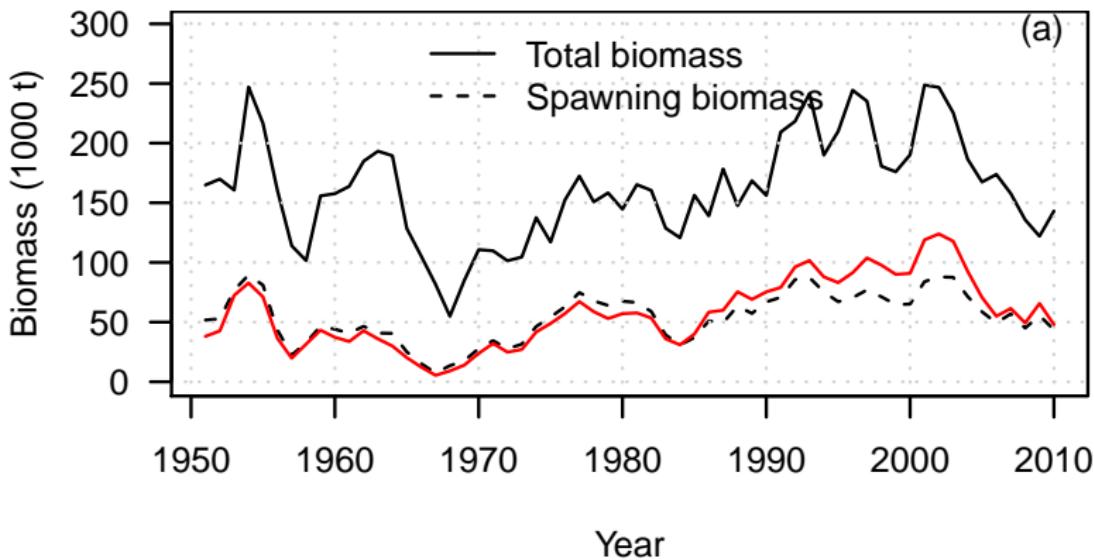
Objective: set up  $iSCA_M \sim HCAM$  & compare.

## Significant differences between $iSCA_M$ & HCAM

- Likelihood for age-comps.
- Pooling of age-proportions less than 2% into adjacent cohort.
- Conditional MLE for survey  $q$ .
- Estimation of total variance and variance partitioning parameter  $(\vartheta, \rho)$ .
- Prior for steepness ( $h \sim \text{Beta}$  in  $iSCA_M$ )



# SOG Spawning biomass



**Figure:** Total biomass at the start of the year, spawning biomass after fishing. HCAM (2010) spawning biomass shown in red.



# SOG Spawning biomass

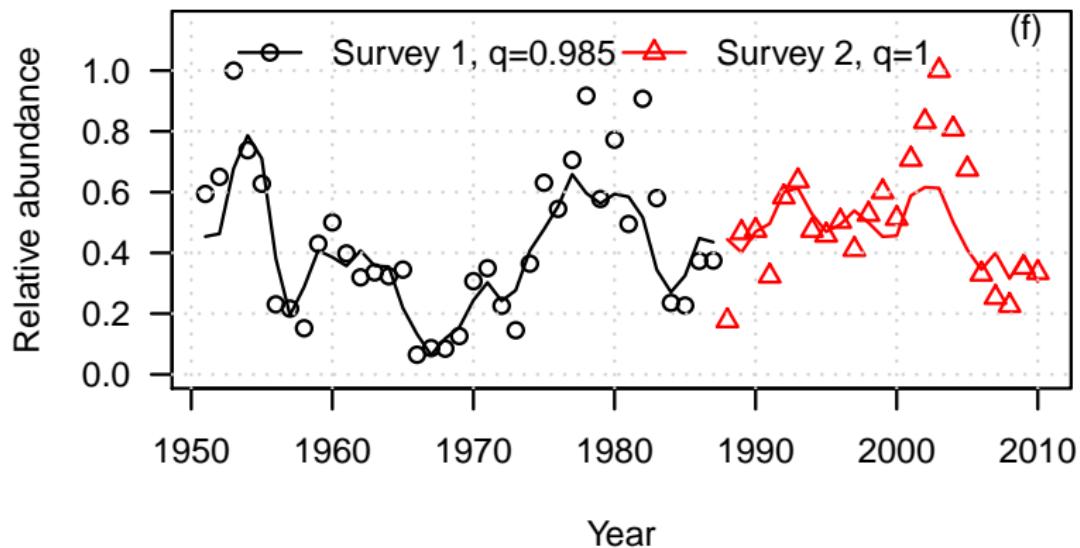
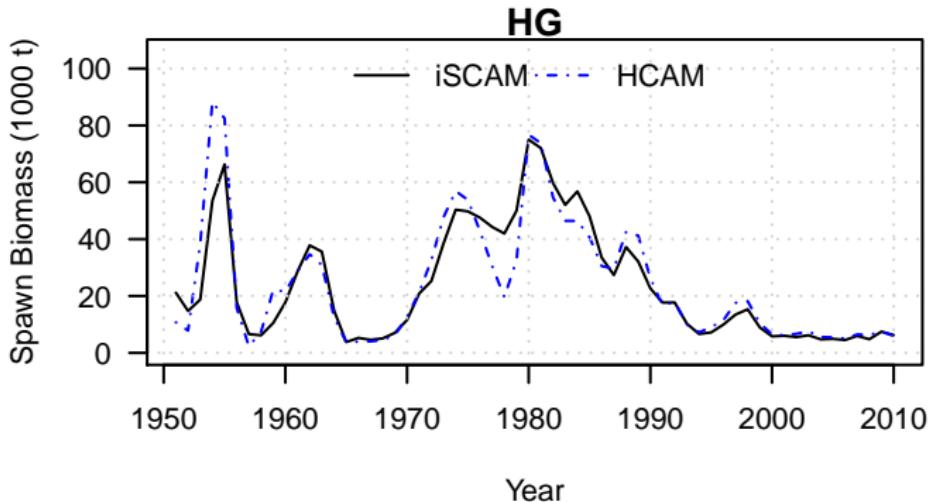


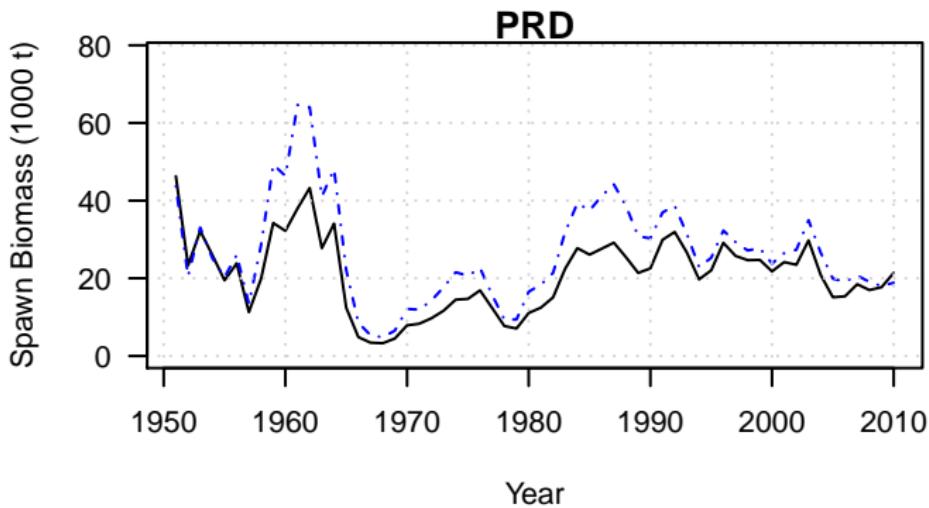
Figure: Observed and predicted spawn survey data for surface (black) and dive (red) surveys.



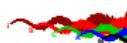
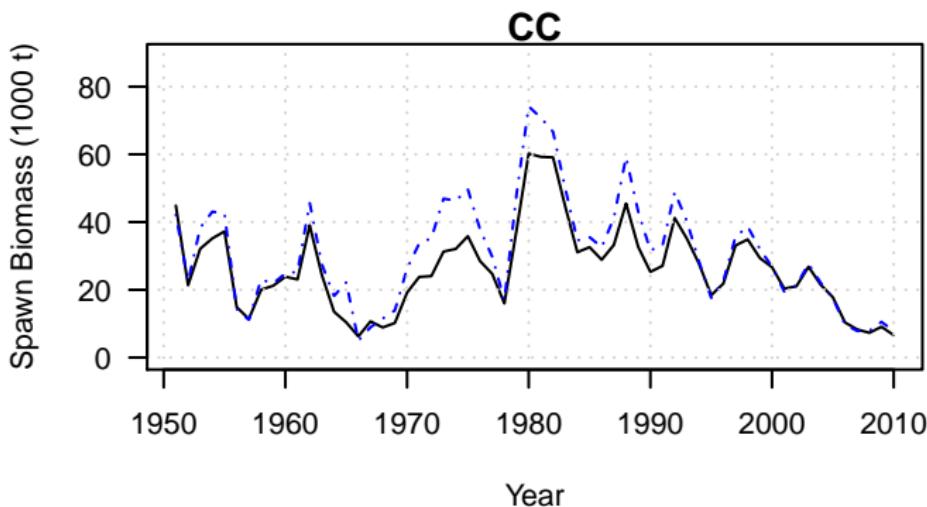
# Spawning biomass in HG



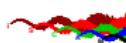
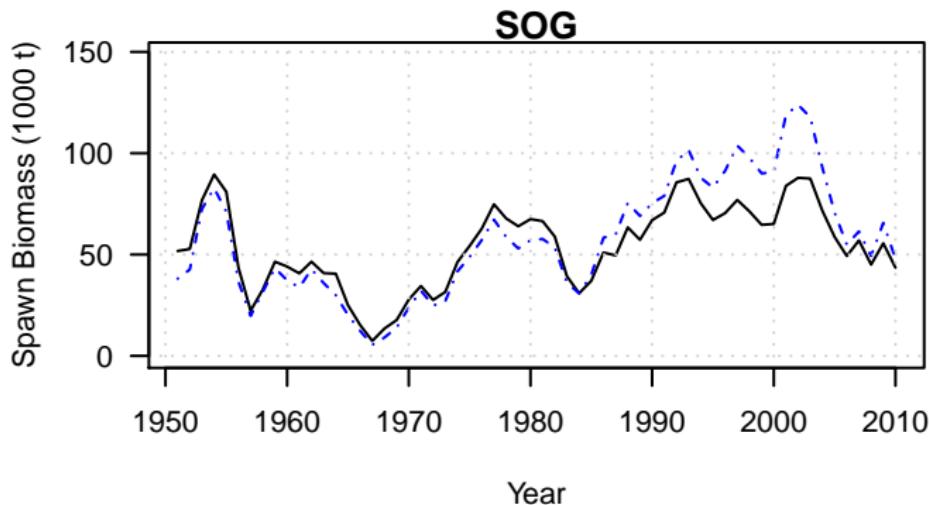
# Spawning biomass in PRD



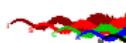
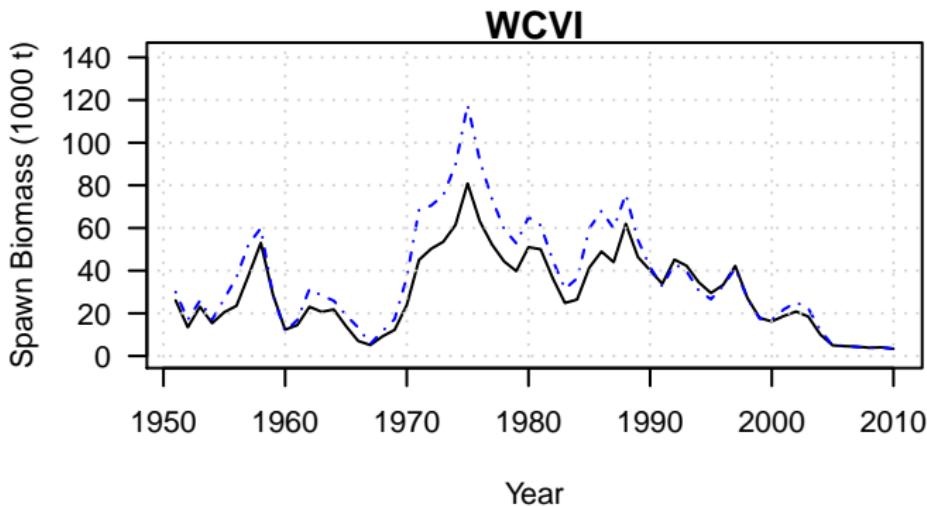
# Spawning biomass in CC



# Spawning biomass in SOG



# Spawning biomass in WCVI



# Discussion

- Slight bias in MSY reference points and steepness; likely due to lack of contrast in simulated data.
- Despite differences between assessment platforms there is a remarkable correspondence in spawning biomass estimates.
- Significant differences in:
  - weighting of age-composition data,
  - pooling of age-composition samples (<2%),
  - conditional MLE for dive survey  $q$  with a very informative prior,
  - prior for steepness.
- MSY based reference points require unbiased estimates of selectivity parameters, and allocation of catch to each gear must be established *a priori*.



# Discussion

- Slight bias in MSY reference points and steepness; likely due to lack of contrast in simulated data.
- Despite differences between assessment platforms there is a remarkable correspondence in spawning biomass estimates.
- Significant differences in:
  - weighting of age-composition data,
  - pooling of age-composition samples (<2%),
  - conditional MLE for dive survey  $q$  with a very informative prior,
  - prior for steepness.
- MSY based reference points require unbiased estimates of selectivity parameters, and allocation of catch to each gear must be established *a priori*.



# Discussion

- Slight bias in MSY reference points and steepness; likely due to lack of contrast in simulated data.
- Despite differences between assessment platforms there is a remarkable correspondence in spawning biomass estimates.
- Significant differences in:
  - weighting of age-composition data,
  - pooling of age-composition samples (<2%),
  - conditional MLE for dive survey  $q$  with a very informative prior,
  - prior for steepness.
- MSY based reference points require unbiased estimates of selectivity parameters, and allocation of catch to each gear must be established *a priori*.



# Discussion

- Slight bias in MSY reference points and steepness; likely due to lack of contrast in simulated data.
- Despite differences between assessment platforms there is a remarkable correspondence in spawning biomass estimates.
- Significant differences in:
  - weighting of age-composition data,
  - pooling of age-composition samples (<2%),
  - conditional MLE for dive survey  $q$  with a very informative prior,
  - prior for steepness.
- MSY based reference points require unbiased estimates of selectivity parameters, and allocation of catch to each gear must be established *a priori*.



# Contents

- 1 Sustainable Fisheries Framework
  - HCAM Review
  - Harvest Control Rule
  - Precautionary Approach
- 2 Part I
  - Analytical Methods
    - Input Data
    - Model description
  - Simulation testing
  - SOG Comparison
  - Spawning biomass in major areas
  - Discussion
- 3 Part II
  - Introduction
  - 2011 Data
  - Analytical Methods
  - Maximum Likelihood Estimates
  - Diagnostics
  - Advice for management



# Introduction

## Objectives:

- ① Data used in the 2011 assessment.
- ② Overview of the analytical methods.
- ③ Present the 2011 stock assessment.
- ④ Describe & present the catch forecasts for 2012.



# Data used in the 2011 stock assessment

- Catch by gear type.
- Spawn survey data.
- Age-composition data.
- Empirical weight-at-age data.



# Catch by gear (1950:2011)

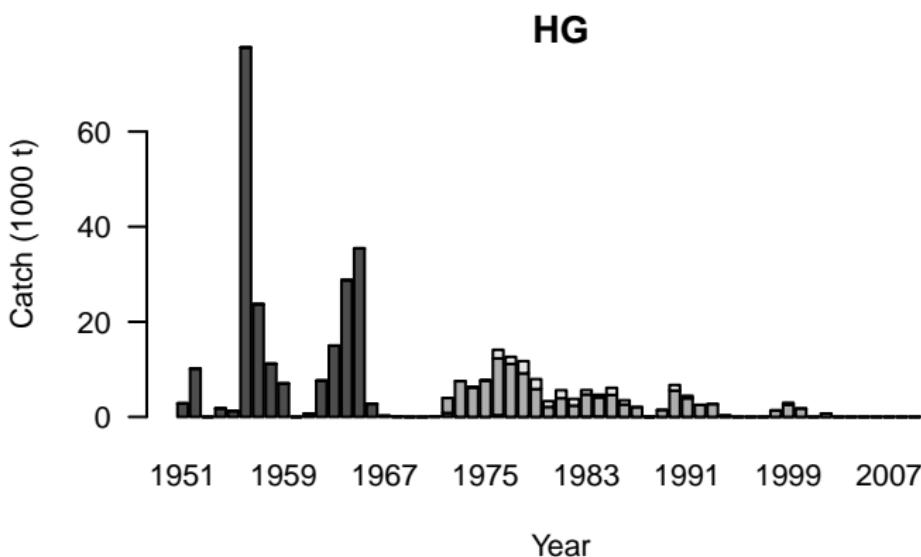


Figure: Catch by gear for Haida Gwaii.



# Catch by gear (1950:2011)

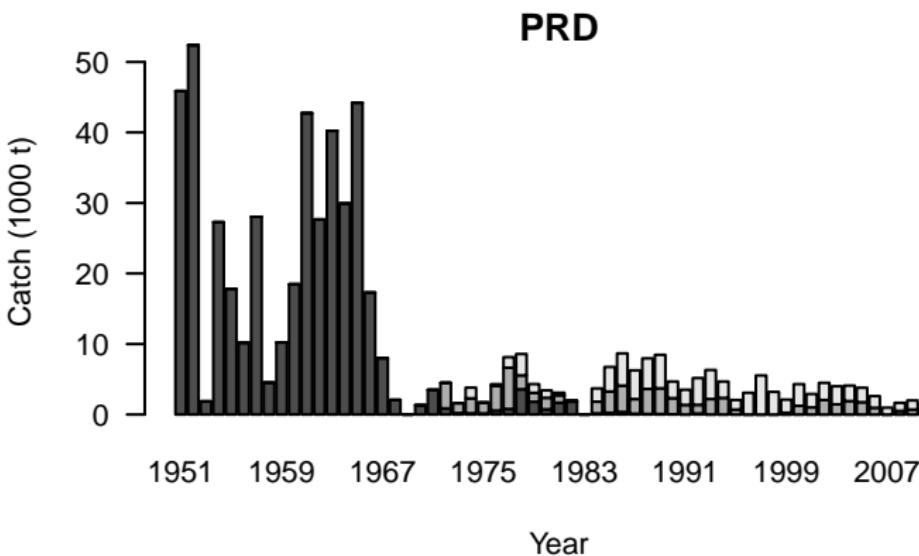
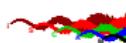


Figure: Catch by gear for Prince Rupert District.



# Catch by gear (1950:2011)

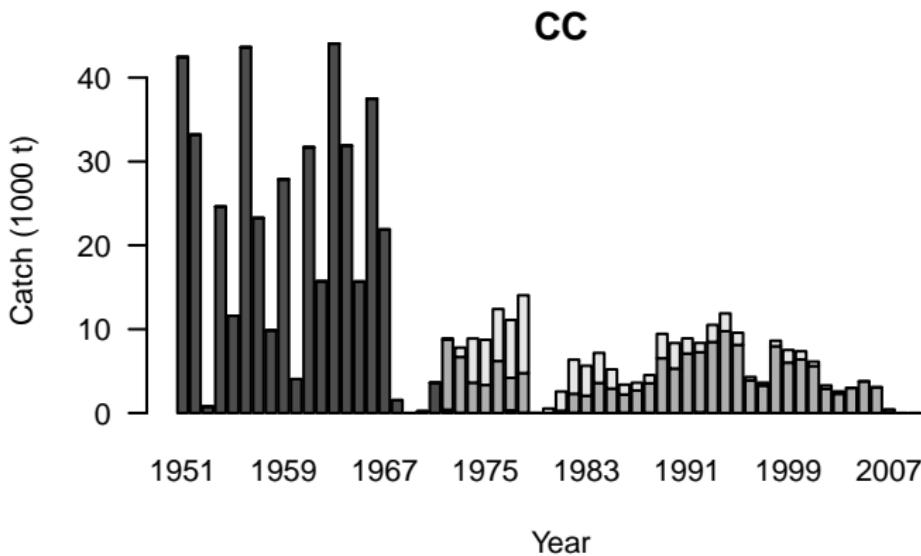


Figure: Catch by gear for Central Coast.



# Catch by gear (1950:2011)

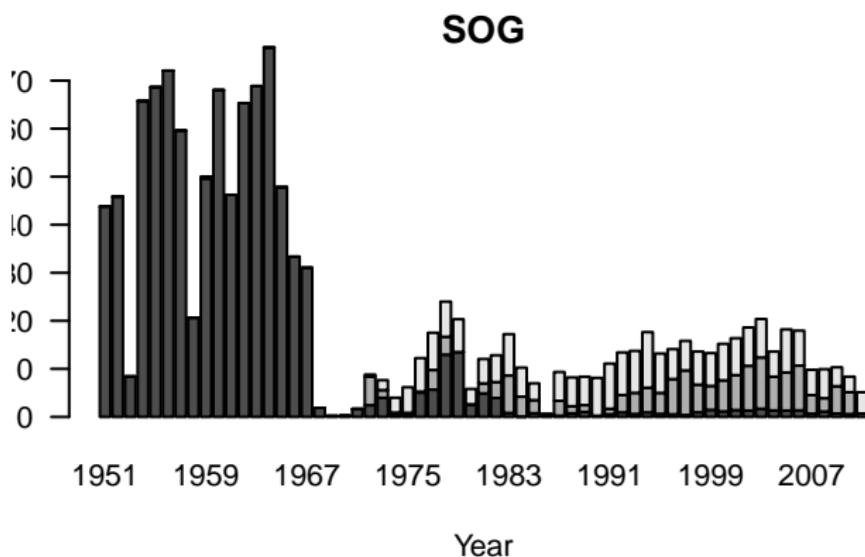


Figure: Catch by gear for Strait of Georgia.



# Catch by gear (1950:2011)

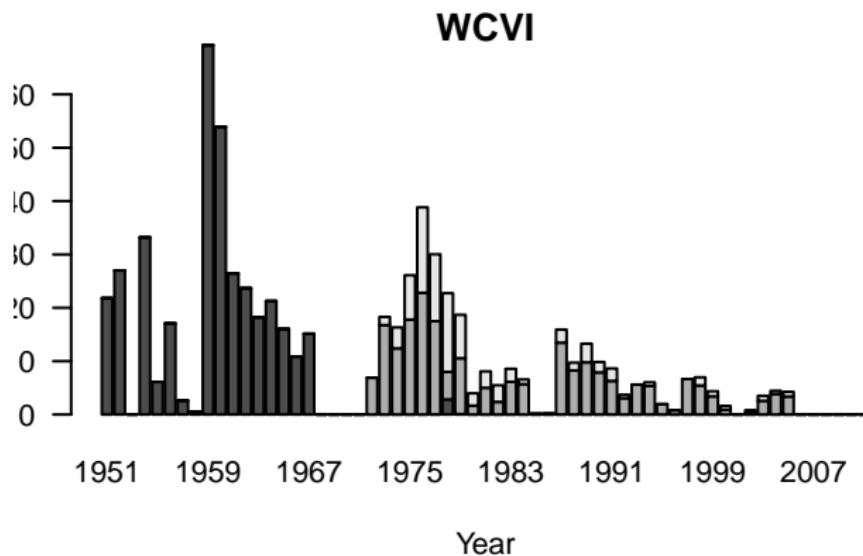
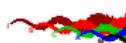


Figure: Catch by gear for West Coast of Vancouver Island.



# Spawning activity in 2010

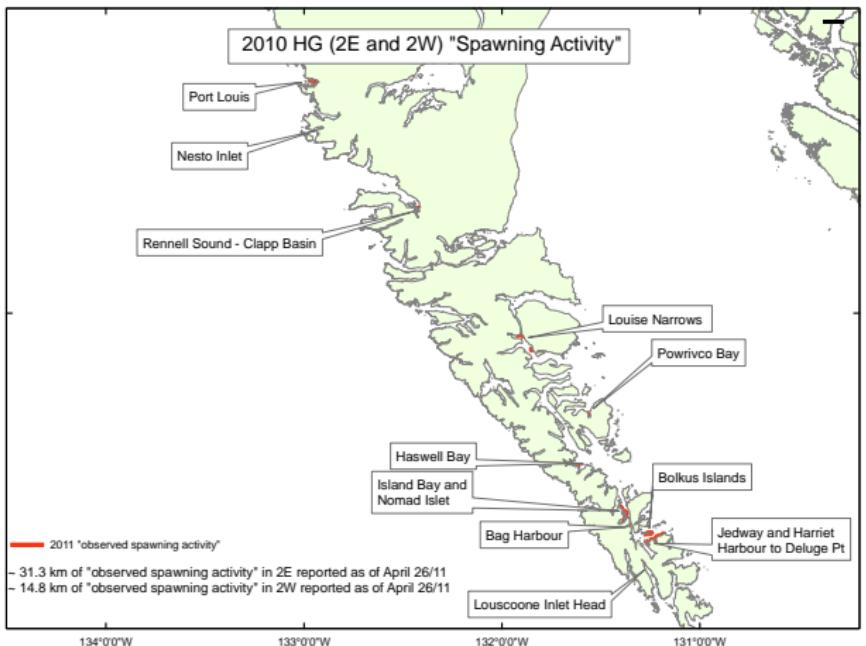


Figure: 2010 Spawning activity in Haida Gwaii.



# Spawning activity in 2010

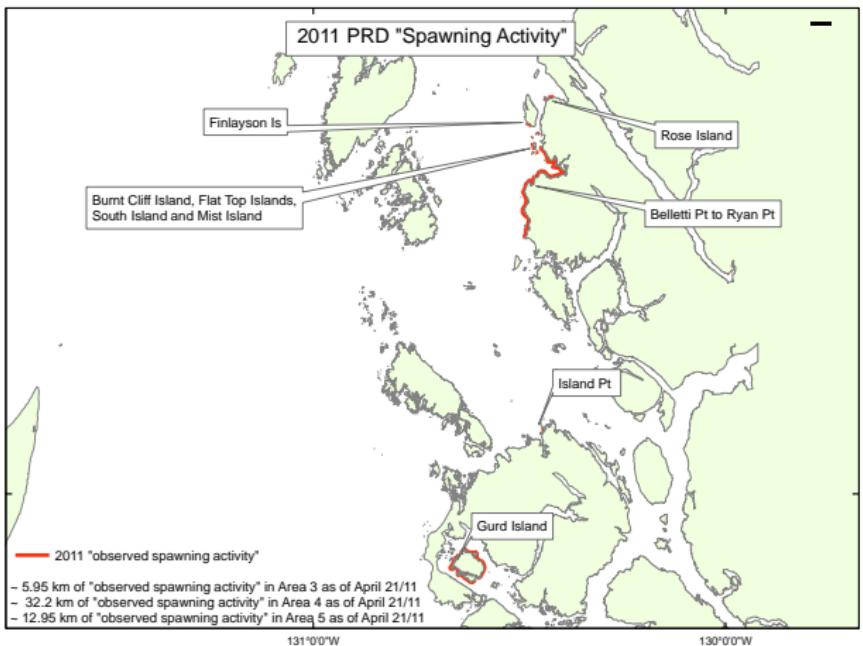


Figure: 2010 Spawning activity in Prince Rupert District.



# Spawning activity in 2010

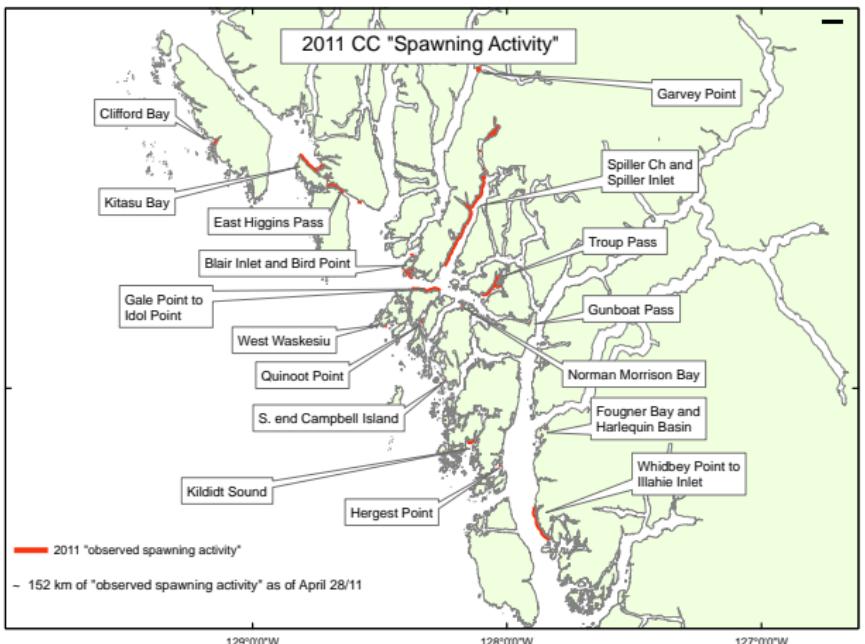


Figure: 2010 Spawning activity in Central Coast.



# Spawning activity in 2010

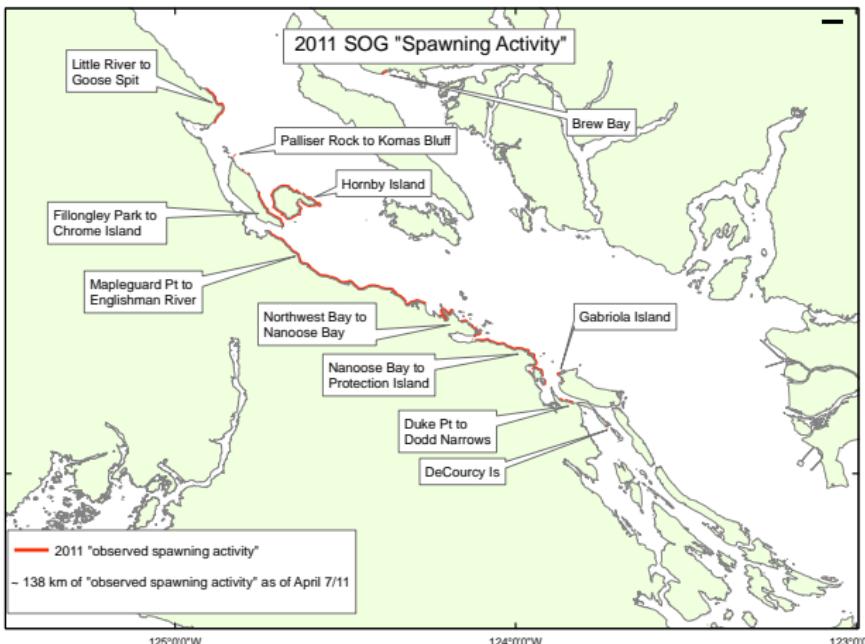


Figure: 2010 Spawning activity in Strait of Georgia.



# Spawning activity in 2010

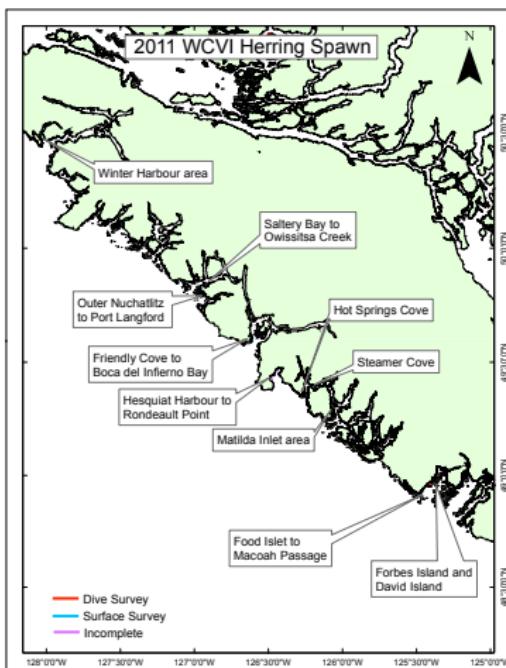


Figure: 2010 Spawning activity in West Coast Vancouver Island.



# Spawn survey time series

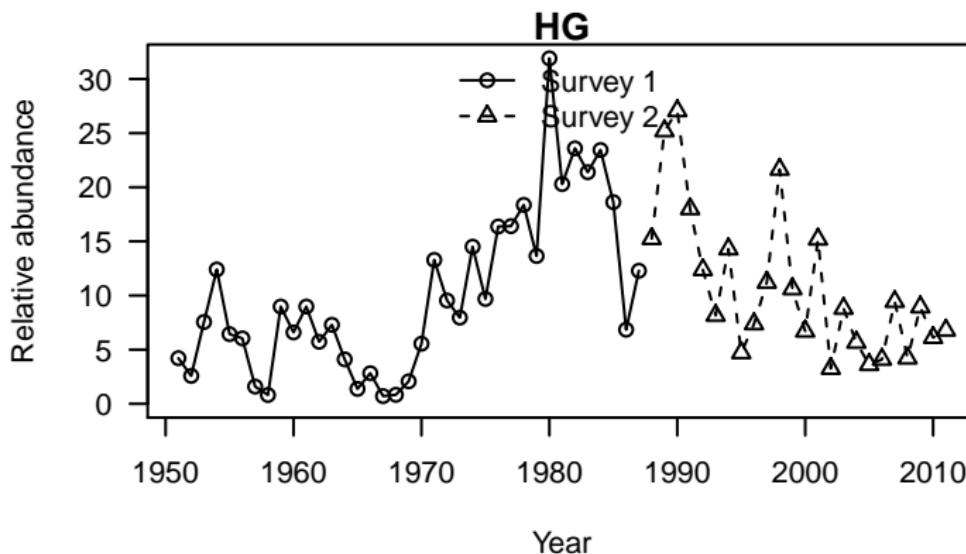


Figure: Spawn survey series in Haida Gwaii.



# Spawn survey time series

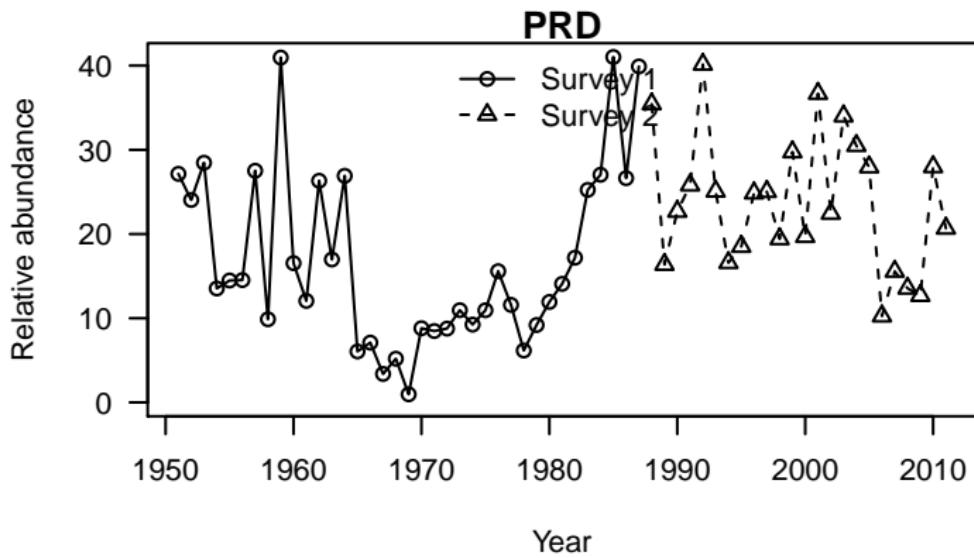
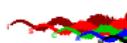


Figure: Spawn survey series in Prince Rupert District.



# Spawn survey time series

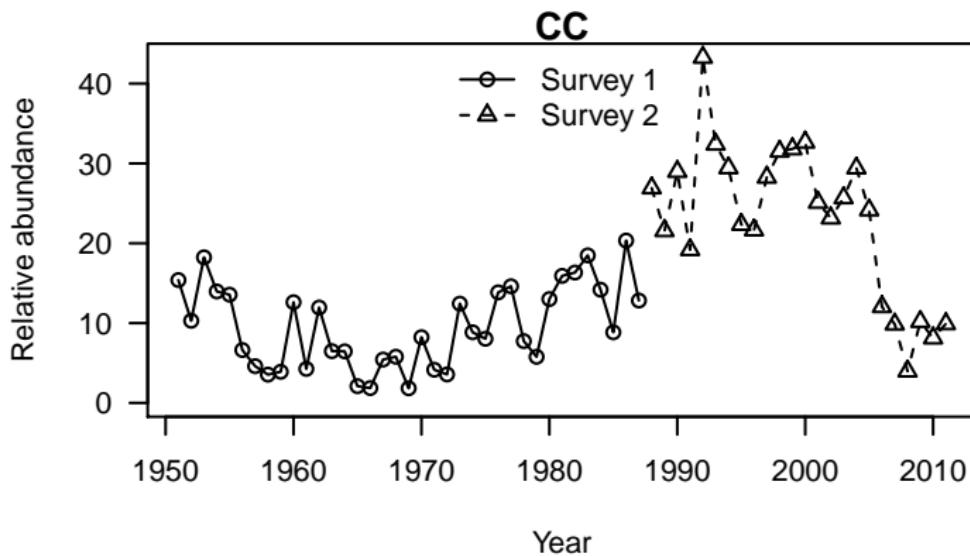
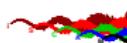


Figure: Spawn survey series in Central Coast.



# Spawn survey time series

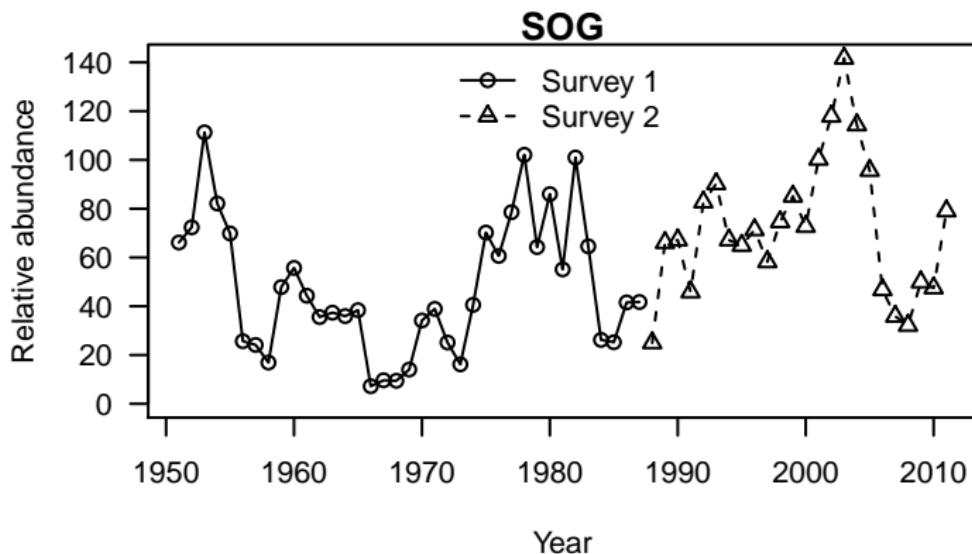
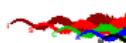


Figure: Spawn survey series in Strait of Georgia.



# Spawn survey time series

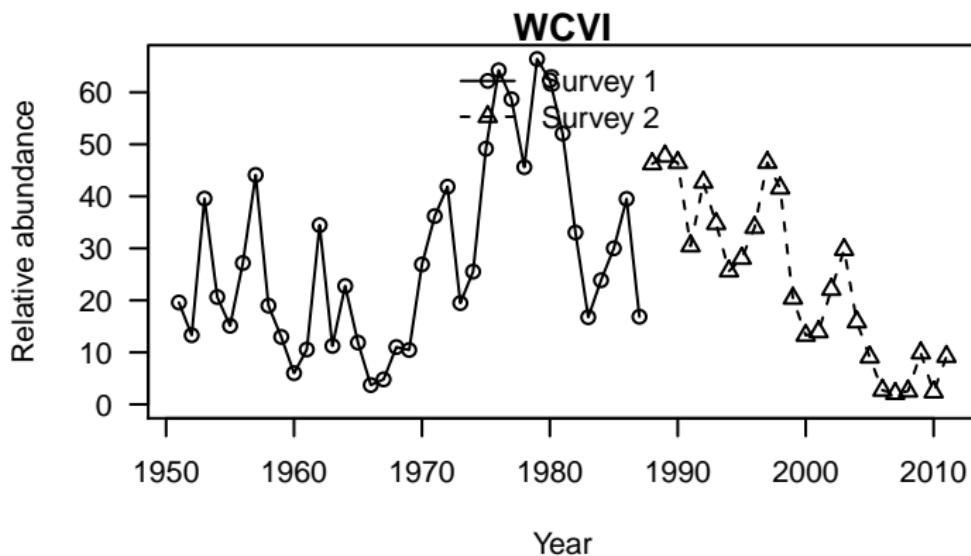


Figure: Spawn survey series in West Coast of Vancouver Island.



# Age-composition data

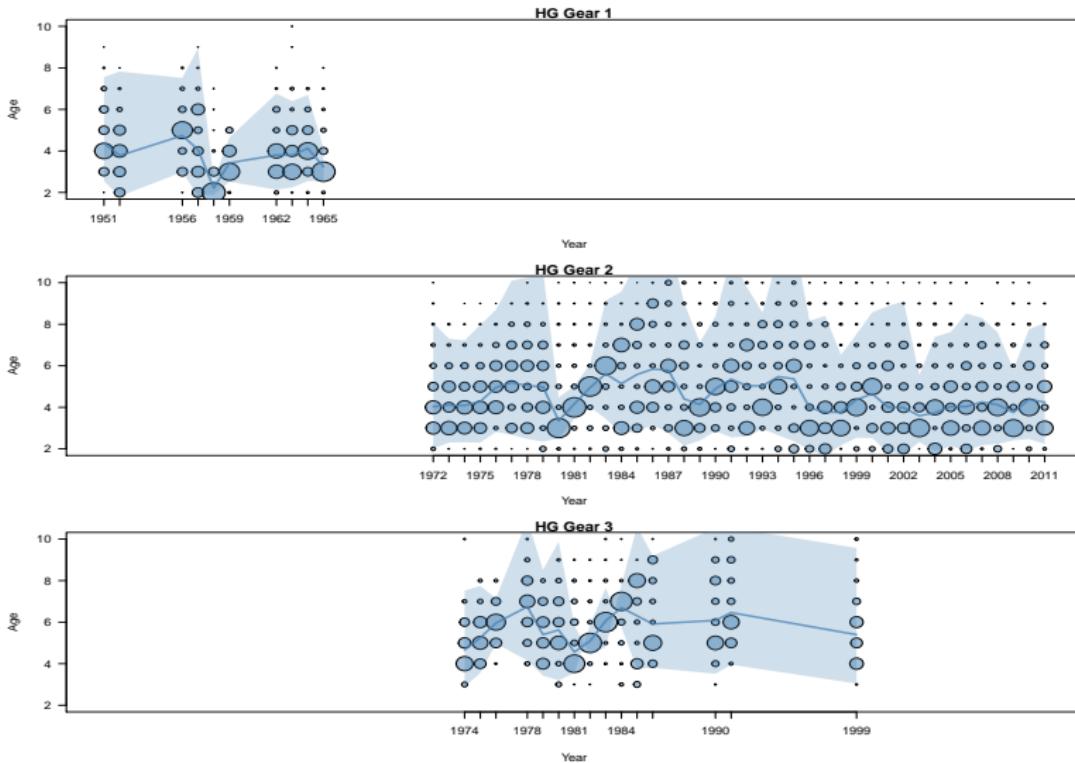
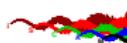


Figure: Haida Gwaii: winter seine, seine-roe, gillnet.



# Age-composition data

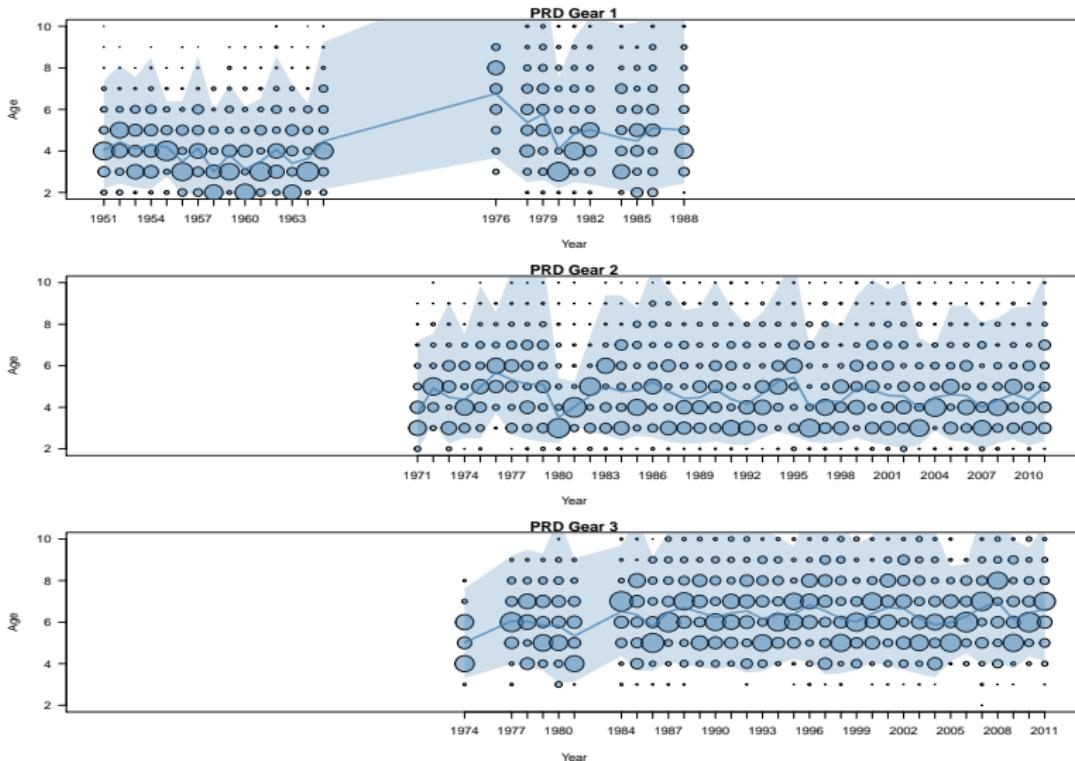


Figure: Prince Rupert District: winter seine, seine-roe, gillnet.



# Age-composition data

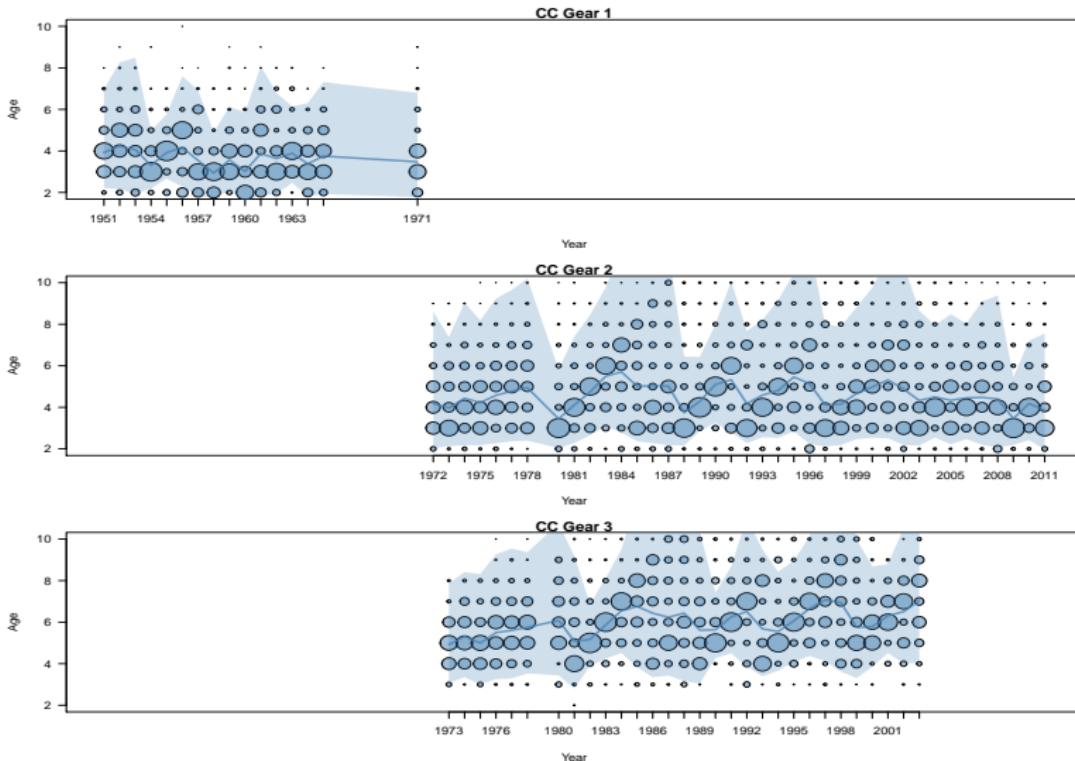
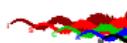


Figure: Central Coast: winter seine, seine-roe, gillnet.



# Age-composition data

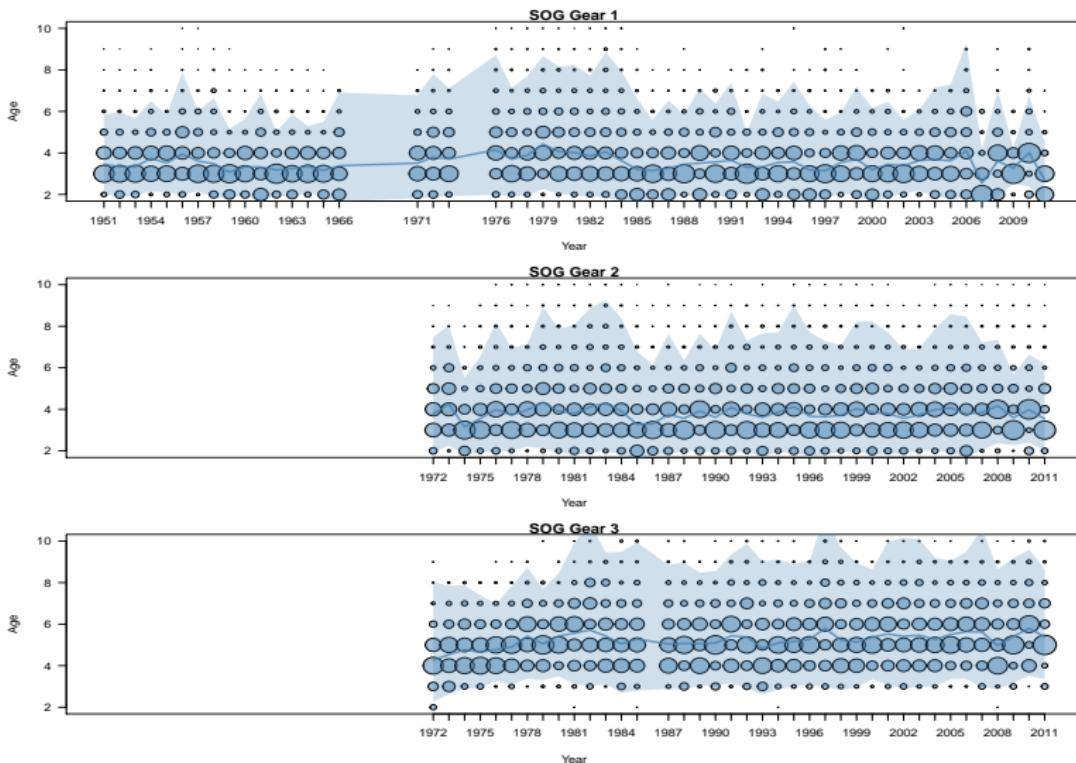
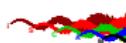


Figure: Strait of Georgia: winter seine, seine-roe, gillnet.



# Age-composition data

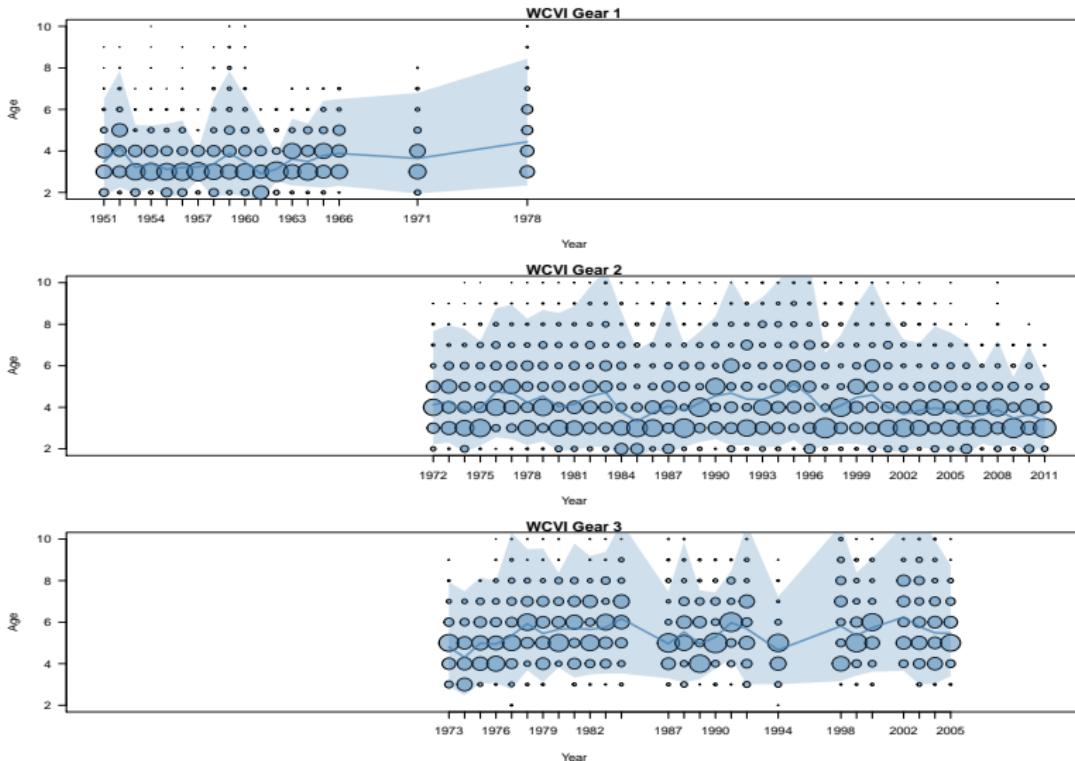


Figure: West Coast Vancouver Island: winter seine, seine-roe, gillnet.

# Weight-at-age

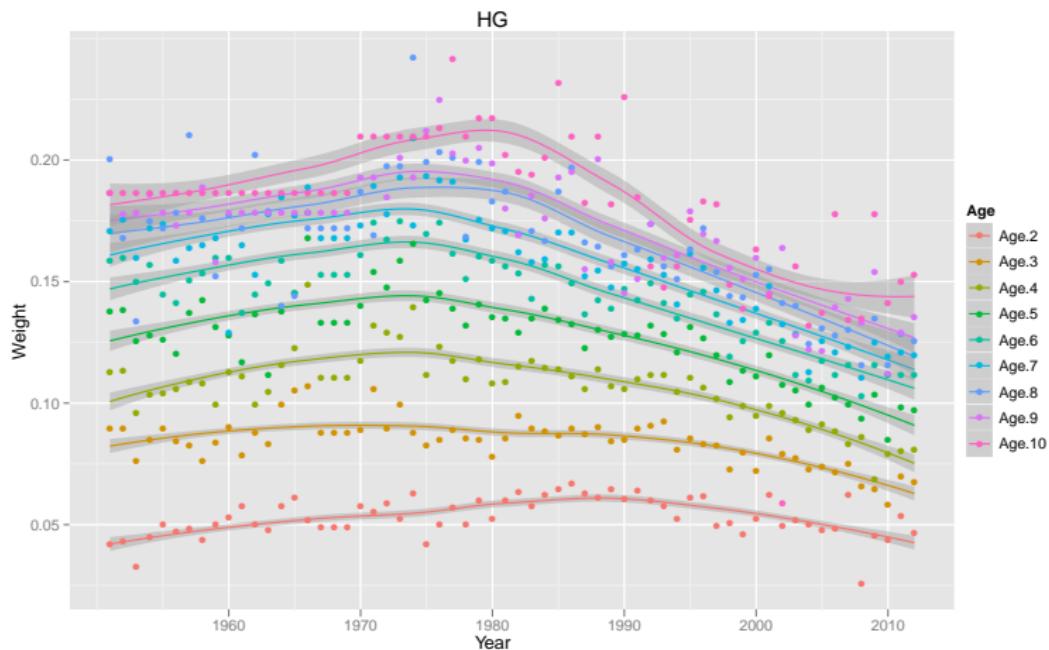


Figure: Haida Gwaii: empirical weight-at-age (kg).



## Weight-at-age

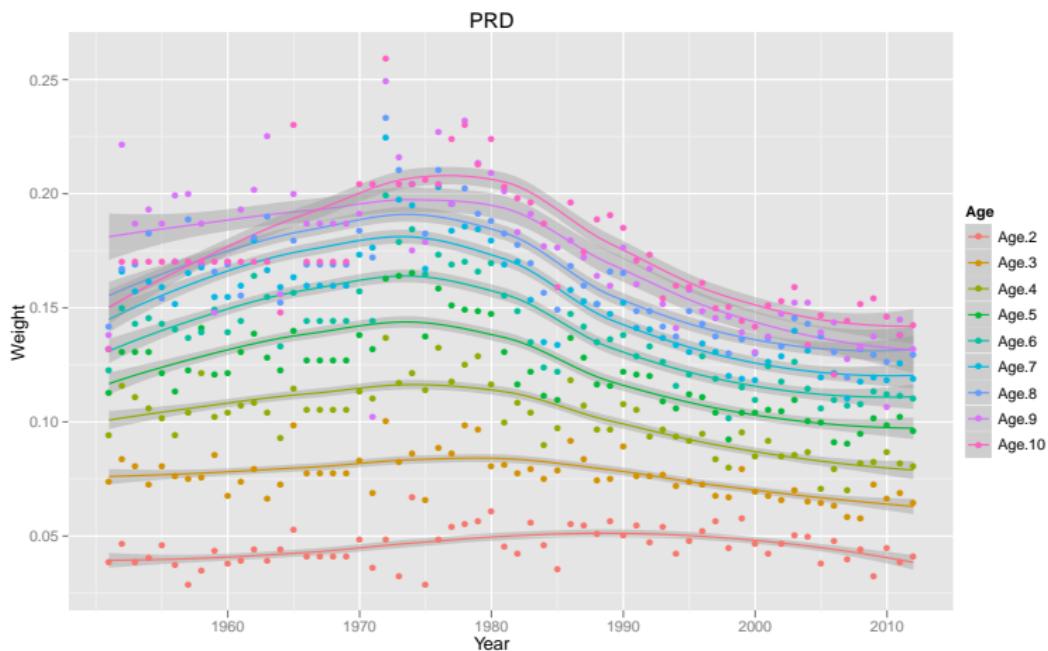


Figure: Prince Rupert District: empirical weight-at-age (kg).



# Weight-at-age

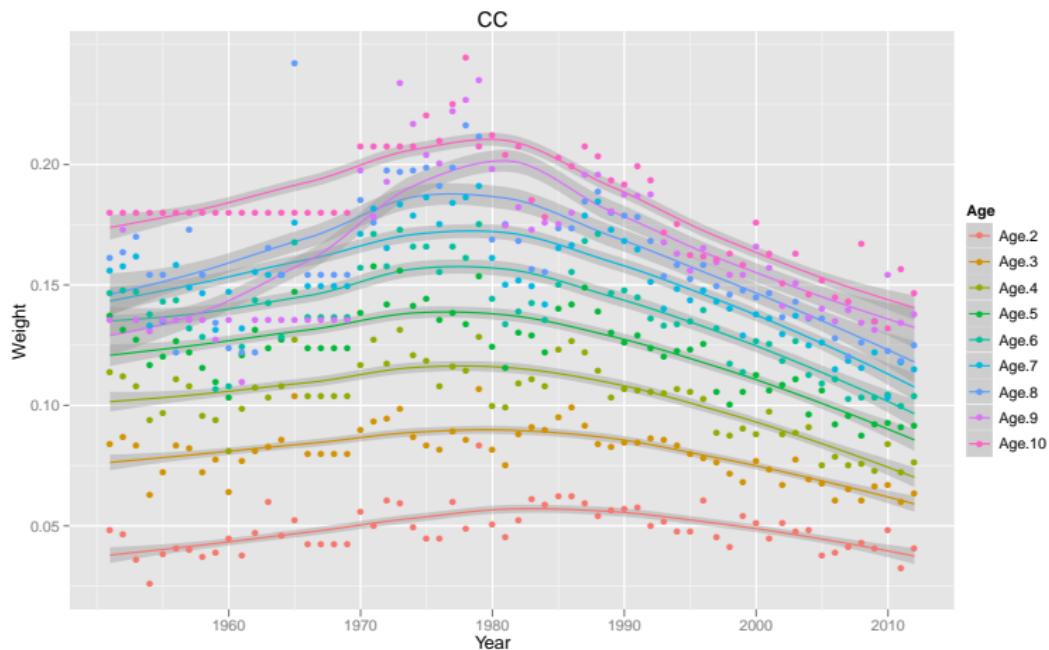


Figure: Central Coast: empirical weight-at-age (kg).



# Weight-at-age

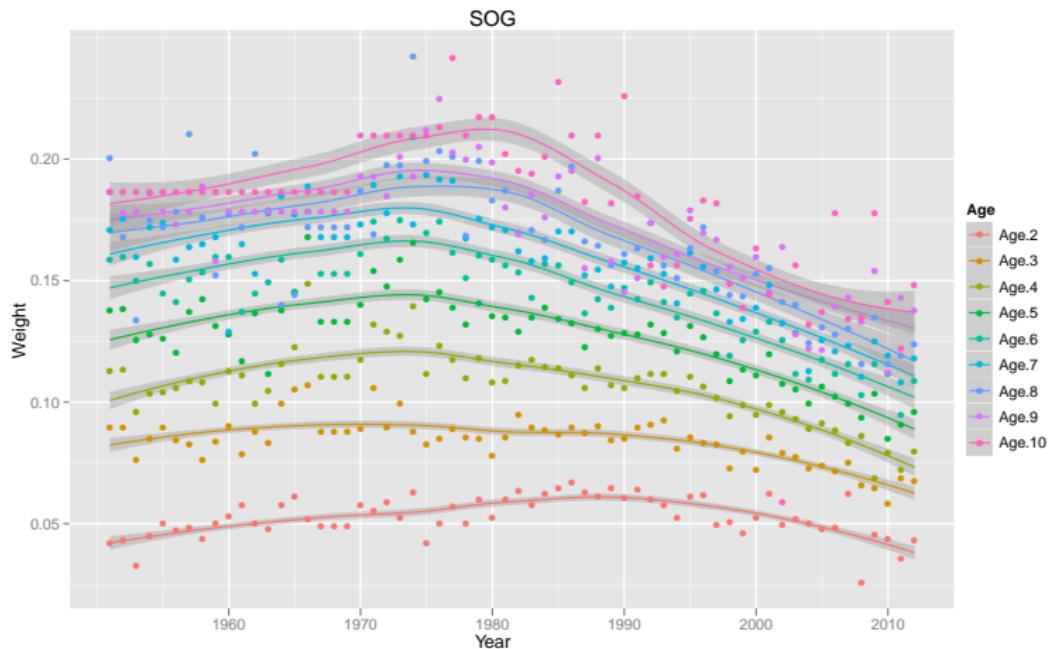


Figure: Strait of Georgia: empirical weight-at-age (kg).



# Weight-at-age

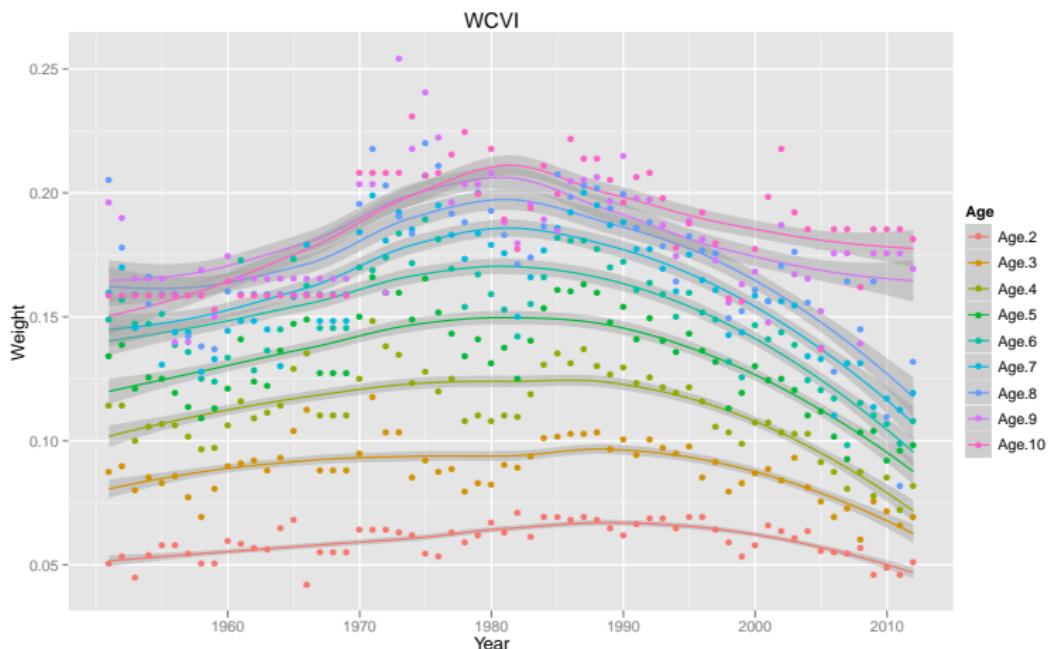
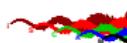


Figure: West Coast Vancouver Island: empirical weight-at-age (kg).



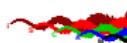
# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $CV = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $CV = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



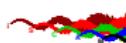
# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



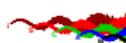
# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



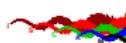
# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



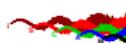
# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Analytics & assumptions

- All major and minor areas were assessed using  $i\text{SCAM}$ .
- Reported catch:  $\text{CV} = 0.005$
- Spawn survey: proportional & 100% of  $Z_t$ .
- Dive survey more precise than surface survey.
- Fecundity  $\propto$  mature weight-at-age.
- Seine gears: selectivity is asymptotic and time-invariant.
- Gillnet gear: logistic selectivity with weight-at-age covariates.
- $P(\ln(q_1), \ln(q_2)) \sim \text{Normal}(\mu = -0.569, \sigma = 0.274)$ .
- Homogenous errors in age-composition (multivariate logistic).
- Age-samples  $<0.02$  pooled in adjacent cohort.



# Diagnostics, Forecasts & Catch Advice

**Diagnostics** Retrospective analysis (sequential removal of the last 10 years of data).

**Forecasts** One-year projection of 3+ biomass with poor, average, good age-3 recruitment.

**Catch advice** Based on HCR with 20% harvest rate if above cutoff.

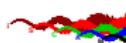


# Diagnostics, Forecasts & Catch Advice

**Diagnostics** Retrospective analysis (sequential removal of the last 10 years of data).

**Forecasts** One-year projection of 3+ biomass with poor, average, good age-3 recruitment.

**Catch advice** Based on HCR with 20% harvest rate if above cutoff.

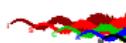


# Diagnostics, Forecasts & Catch Advice

**Diagnostics** Retrospective analysis (sequential removal of the last 10 years of data).

**Forecasts** One-year projection of 3+ biomass with poor, average, good age-3 recruitment.

**Catch advice** Based on HCR with 20% harvest rate if above cutoff.



# MLE: Spawn survey

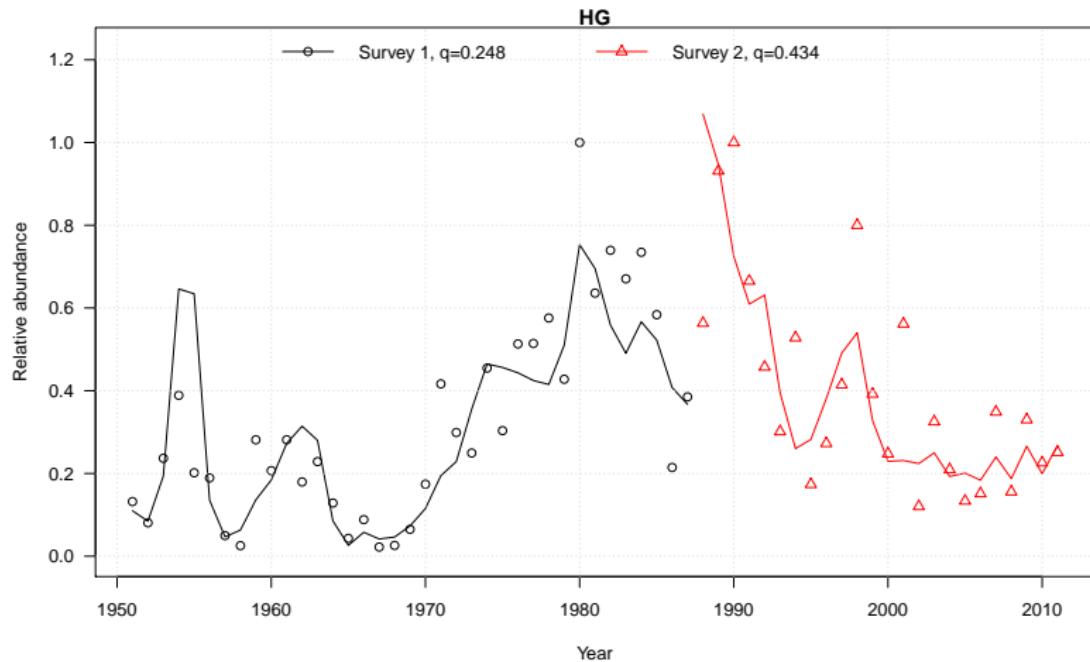


Figure: Haida Gwaii



# MLE: Spawn survey

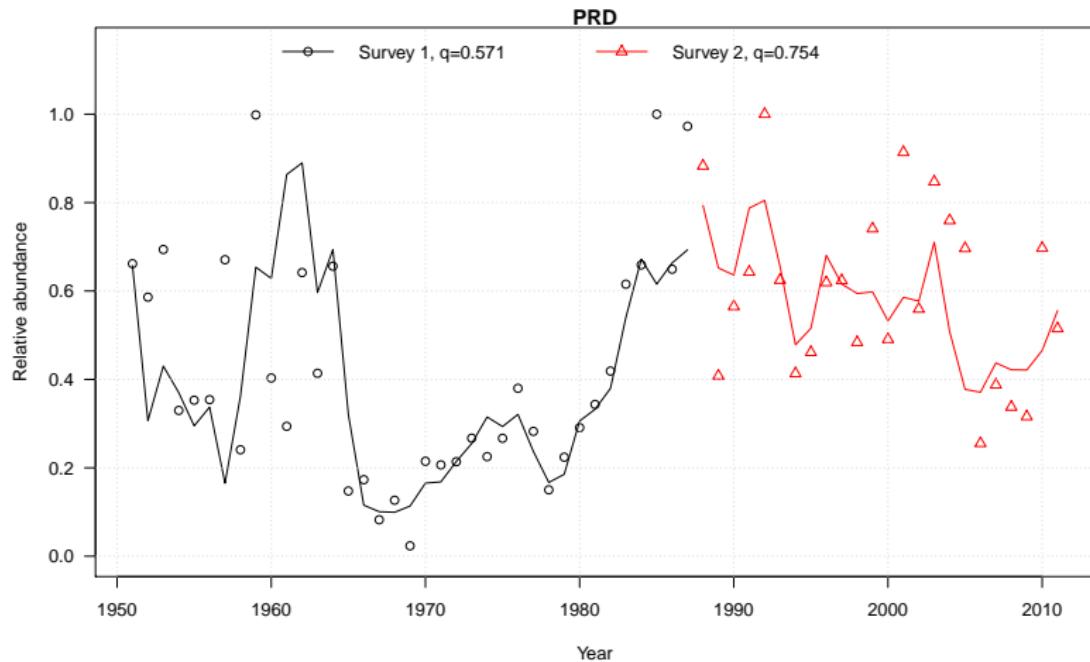


Figure: Prince Rupert District



# MLE: Spawn survey

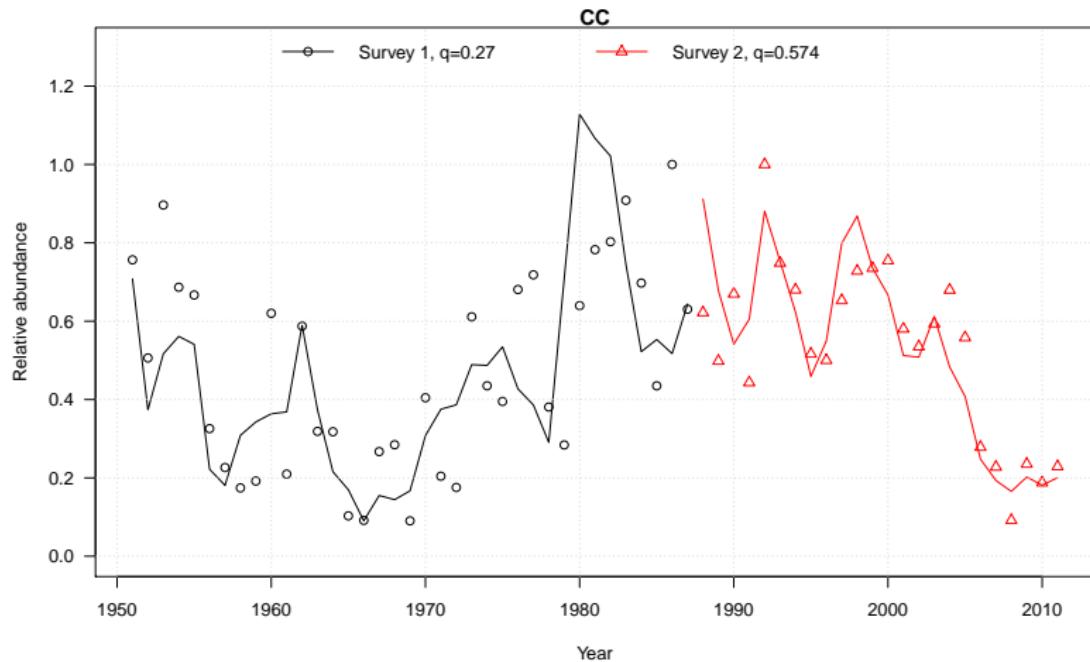


Figure: Central Coast



# MLE: Spawn survey

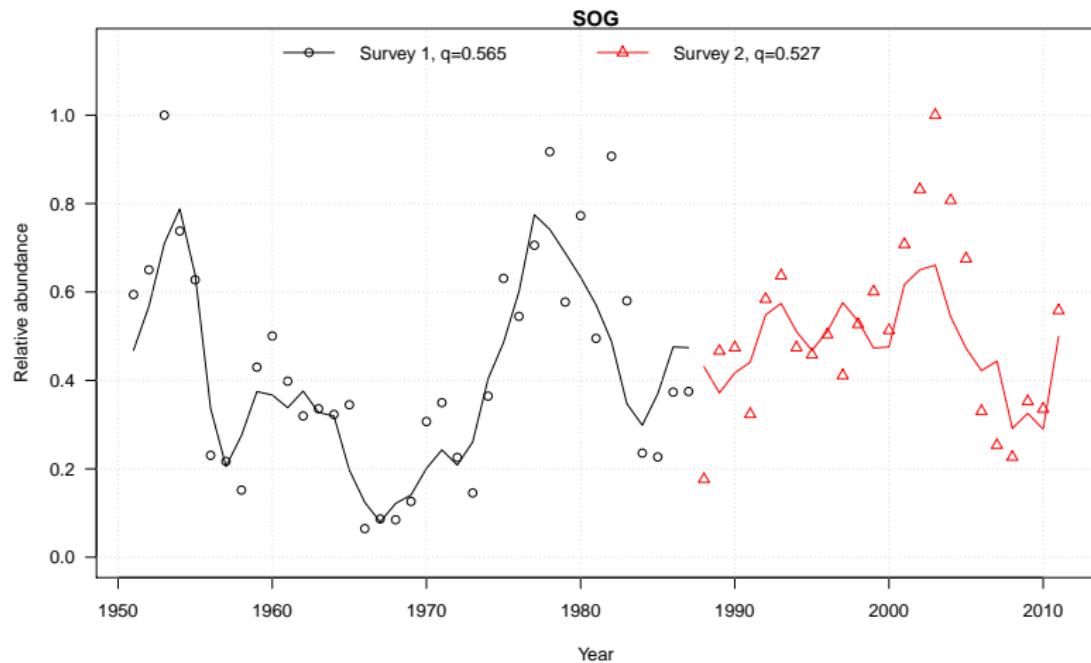


Figure: Strait of Georgia



# MLE: Spawn survey

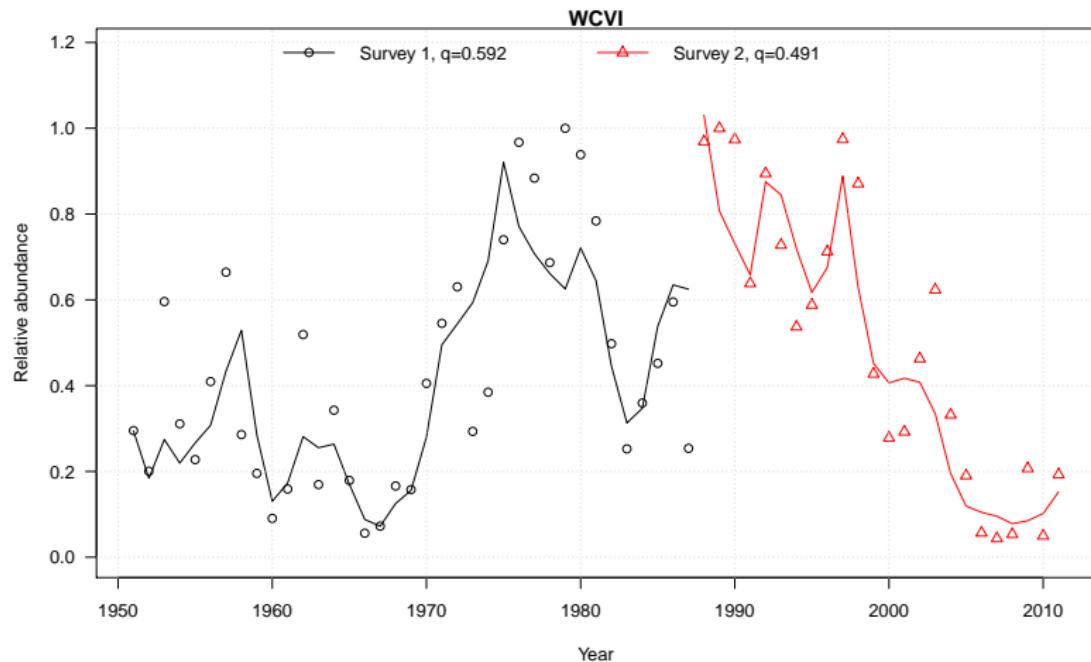
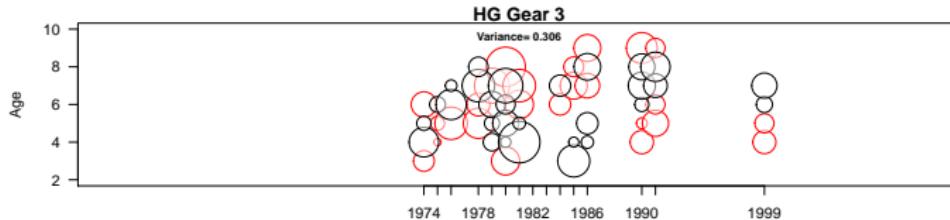
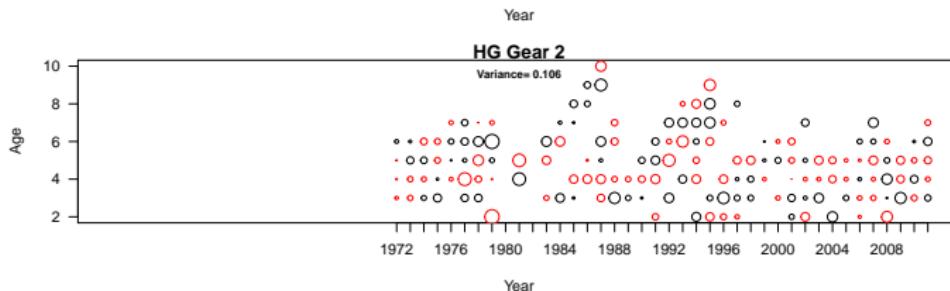
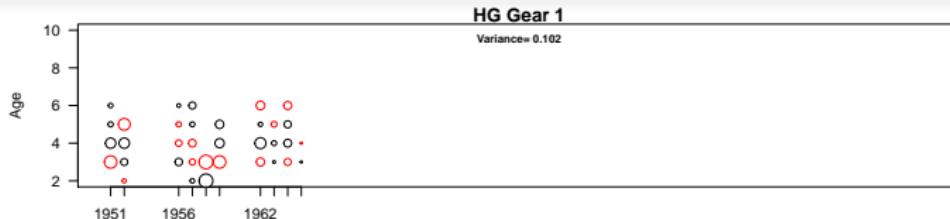


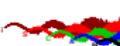
Figure: West Coast Vancouver Island



## MLE: Residuals in age composition data



## Figure: Haida Gwaii



# MLE: Residuals in age composition data

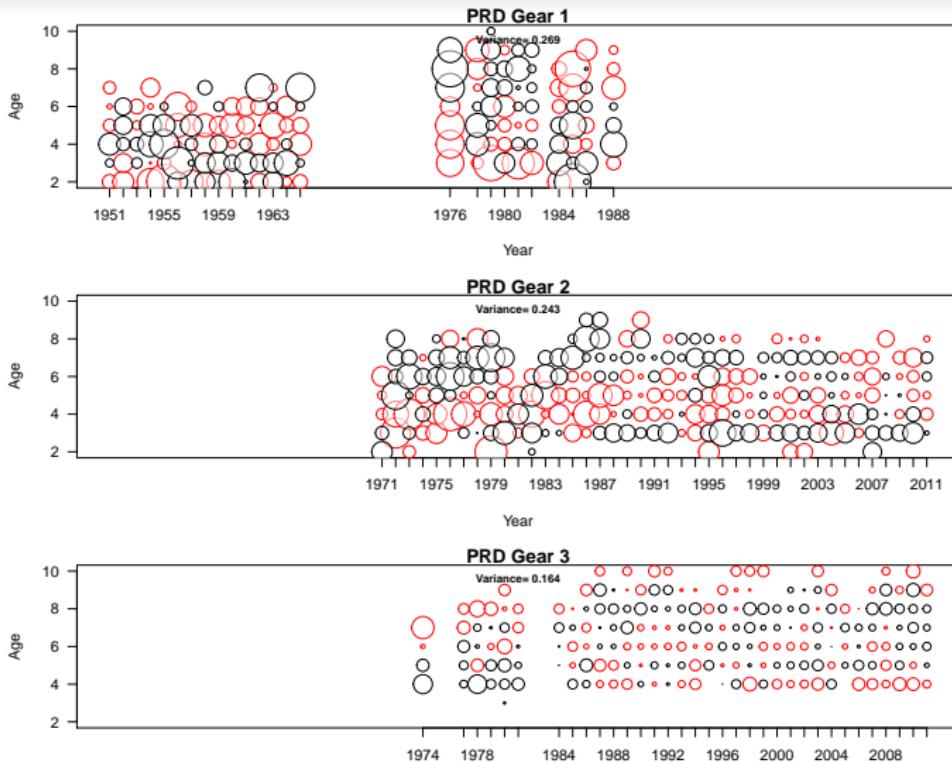
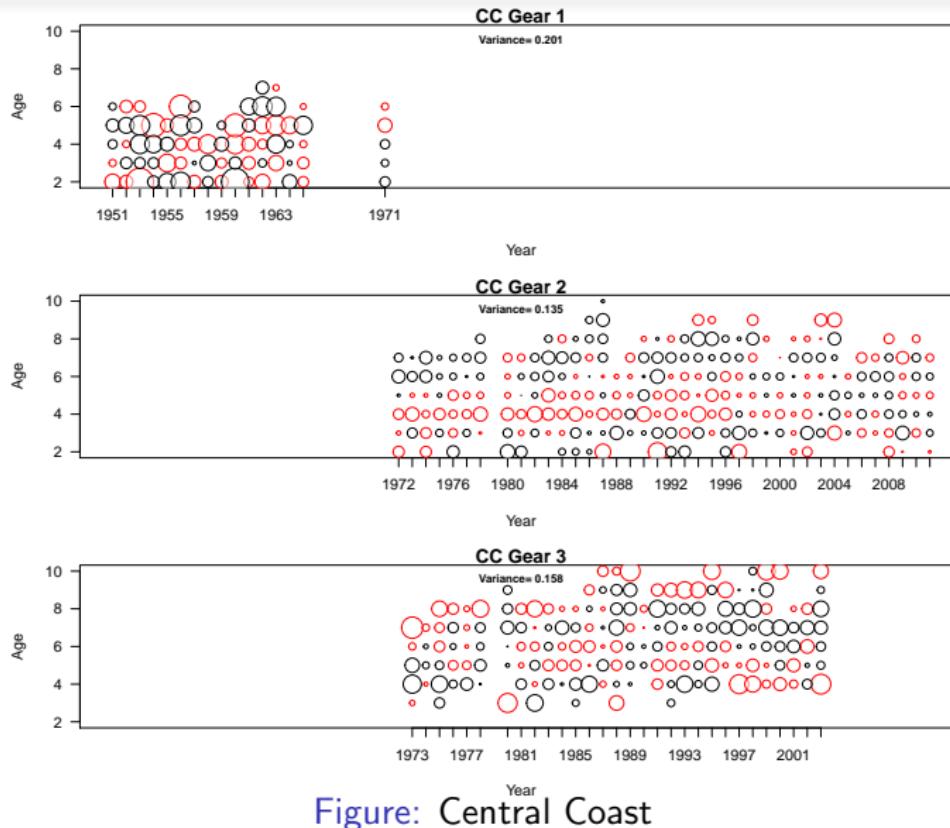


Figure: Prince Rupert District



# MLE: Residuals in age composition data



# MLE: Residuals in age composition data

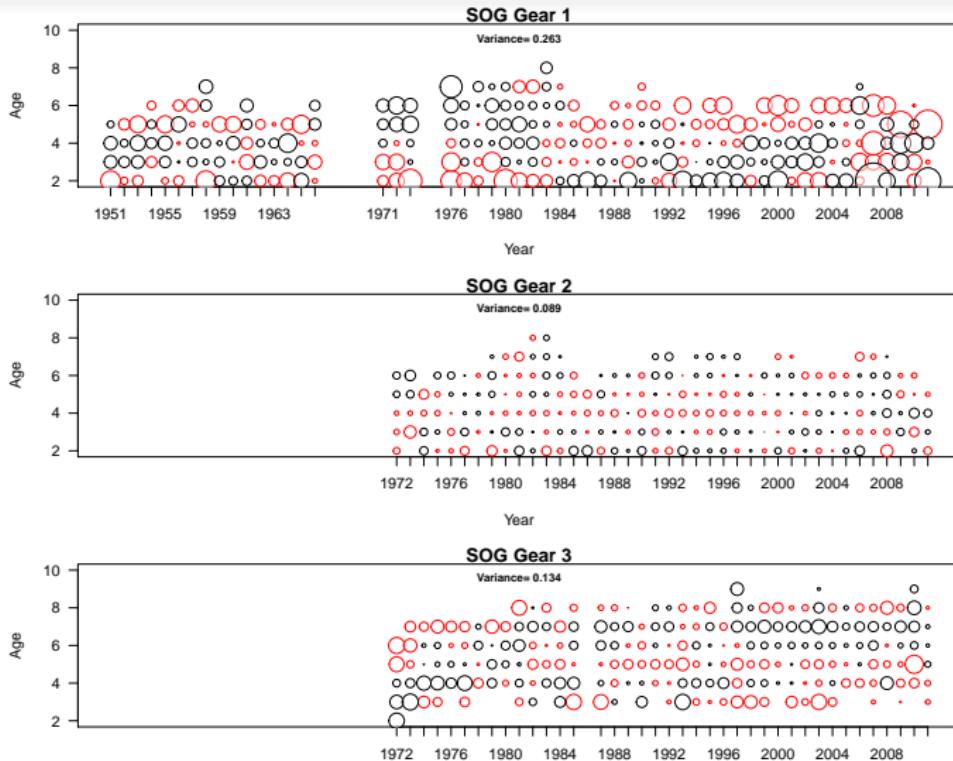


Figure: Strait of Georgia



# MLE: Residuals in age composition data

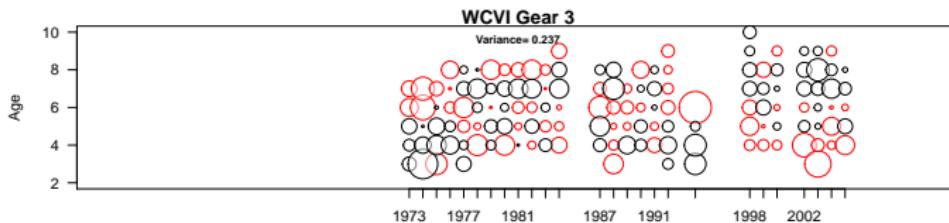
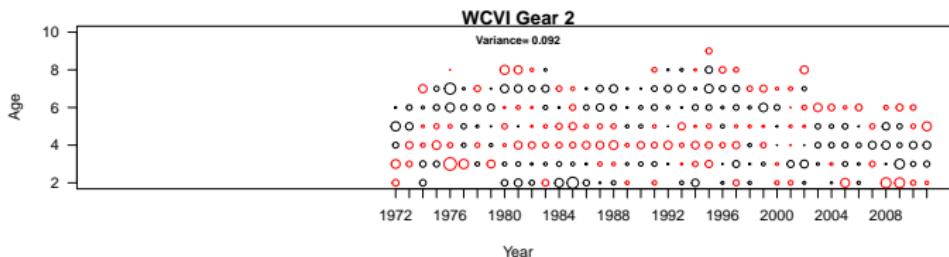
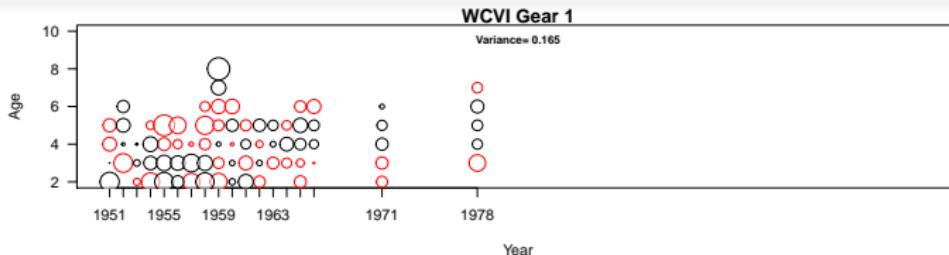


Figure: West Coast Vancouver Island



# MLE: Mortality

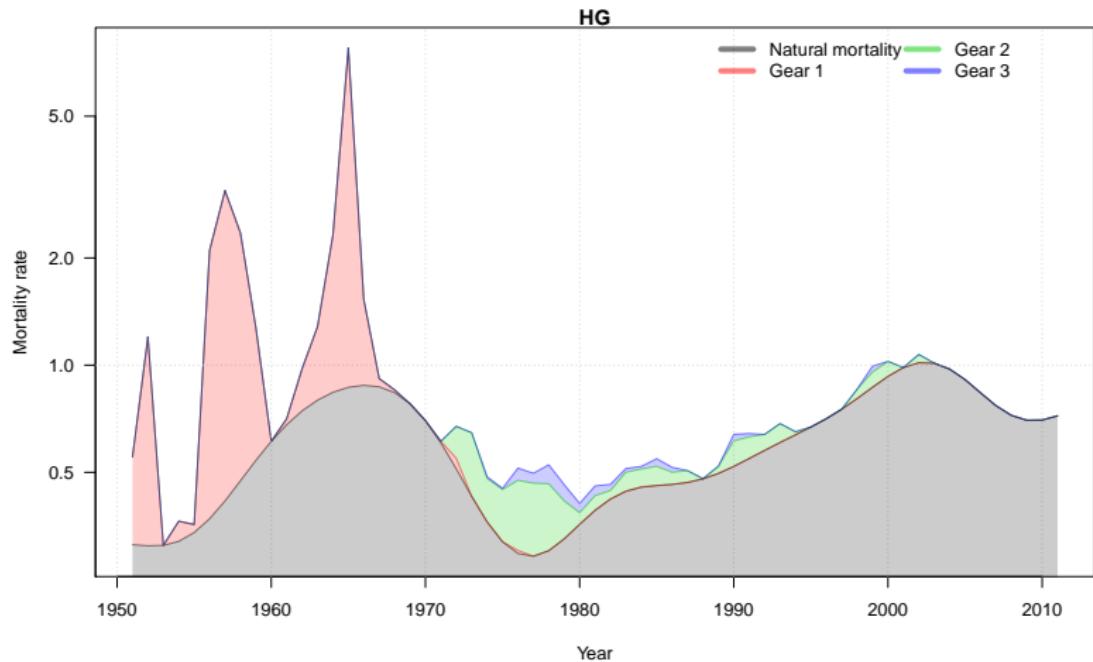


Figure: Haida Gwaii



# MLE: Mortality

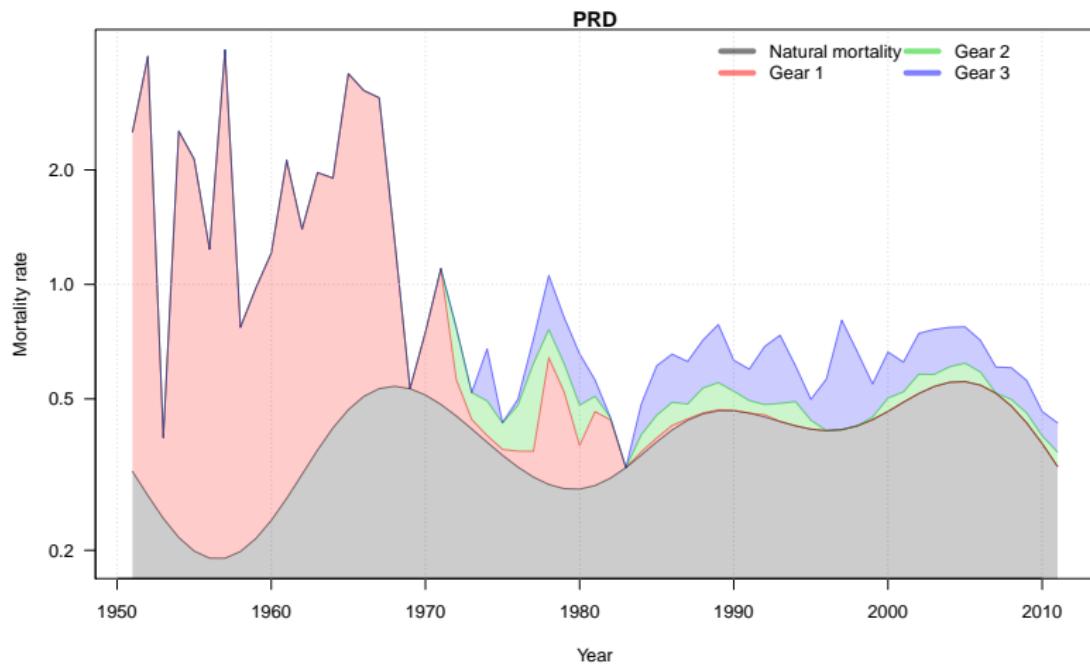


Figure: Prince Rupert District



# MLE: Mortality

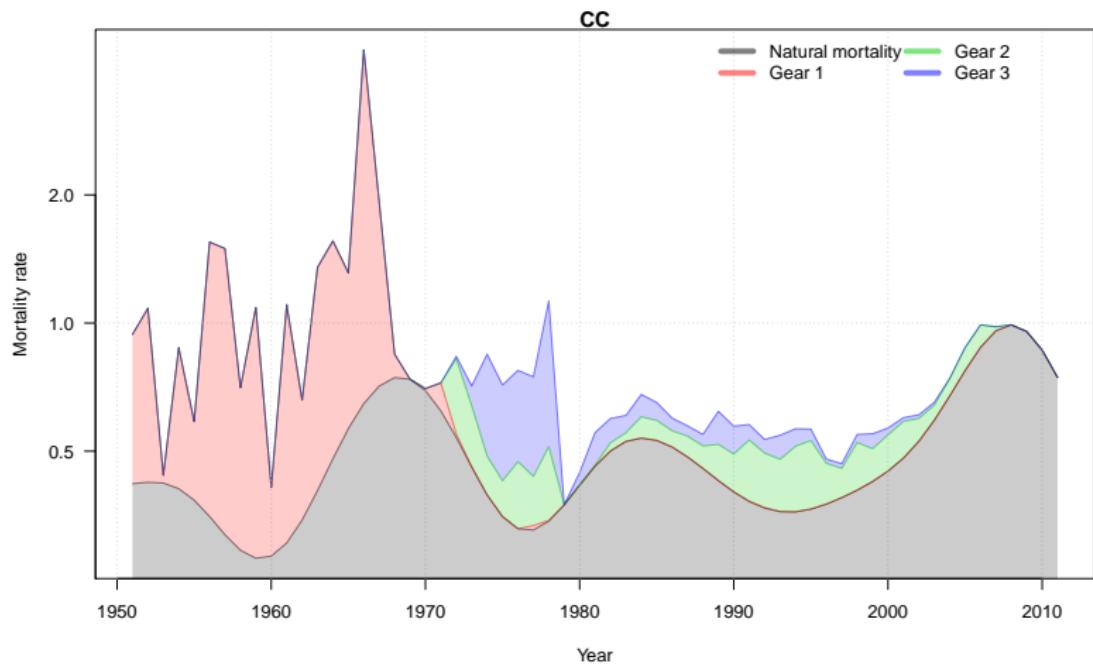


Figure: Central Coast



# MLE: Mortality

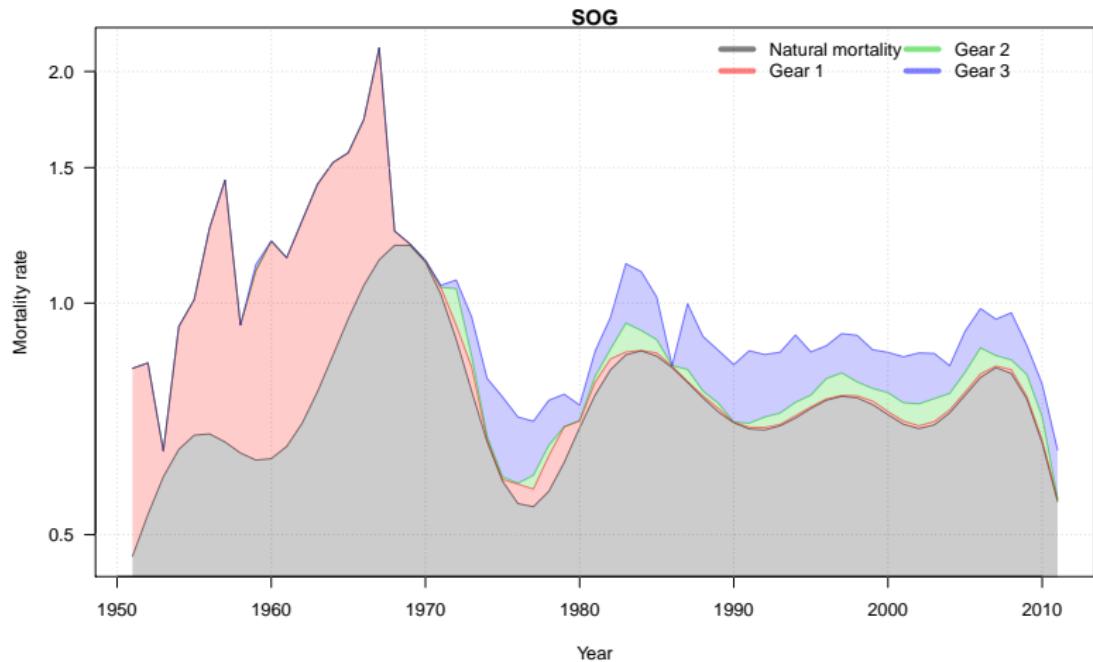


Figure: Strait of Georgia



# MLE: Mortality

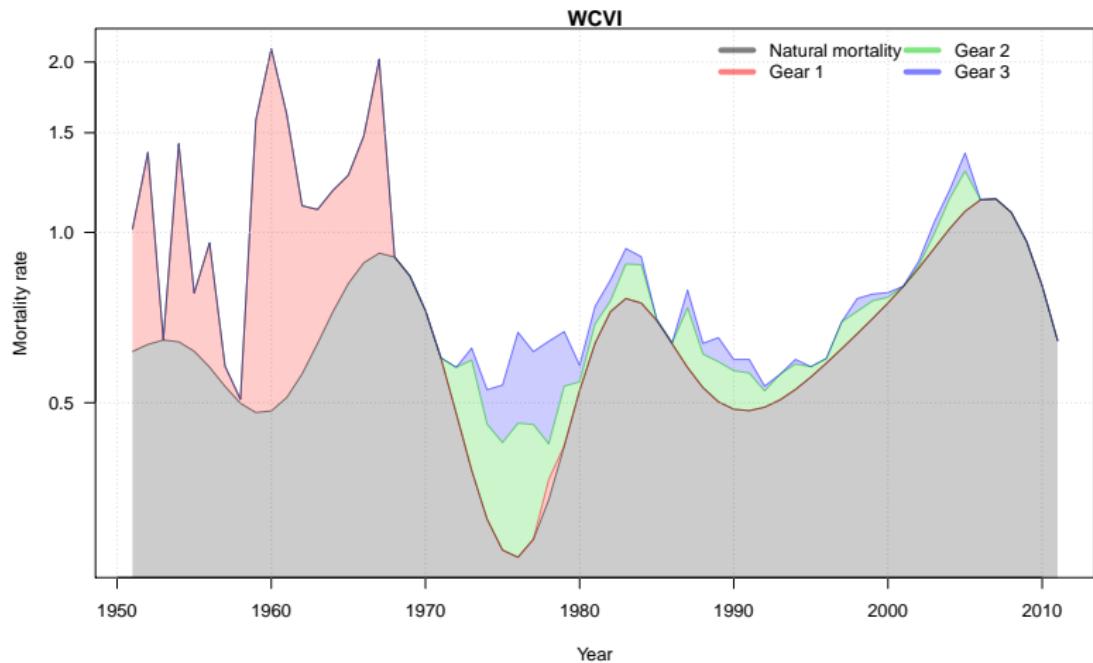


Figure: West Coast Vancouver Island



# Age-2 recruits

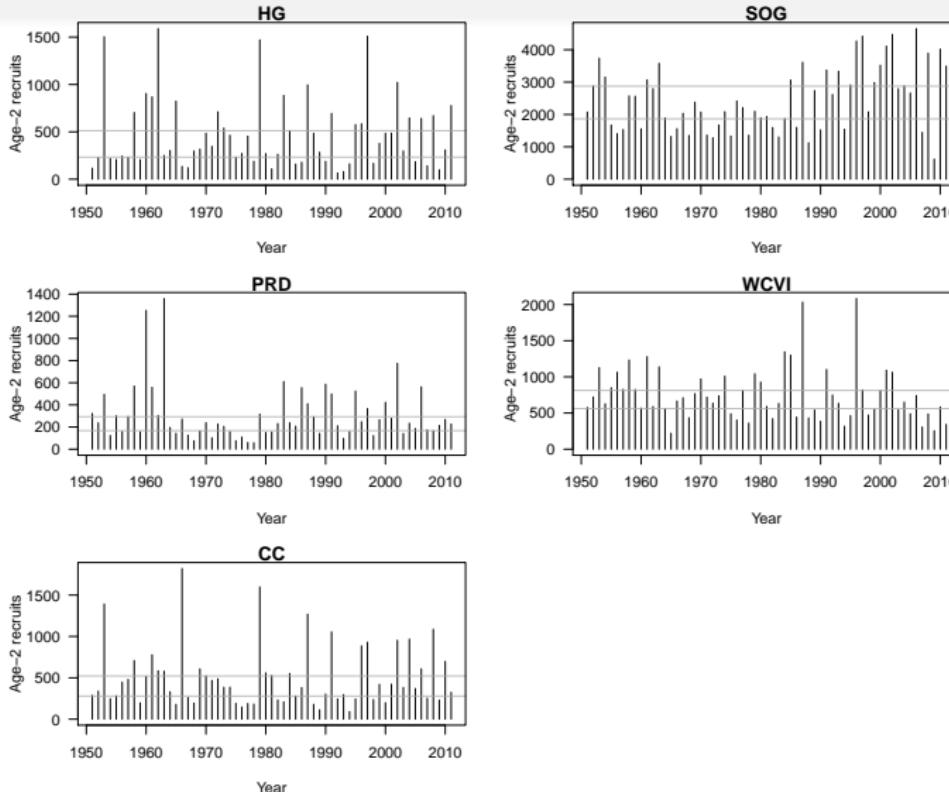


Figure: Age-2 recruits with 0.33 and 0.66 quantiles.



# Diagnostics: Retrospective plots

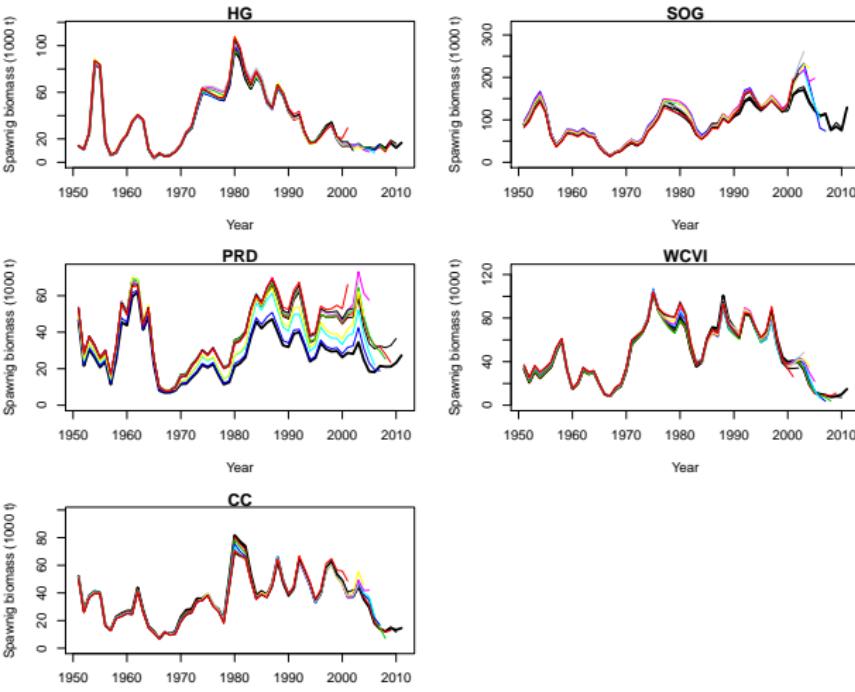
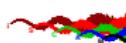


Figure: <sup>Year</sup> Retrospective estimates of spawning biomass.



# Diagnostics: Trace plots

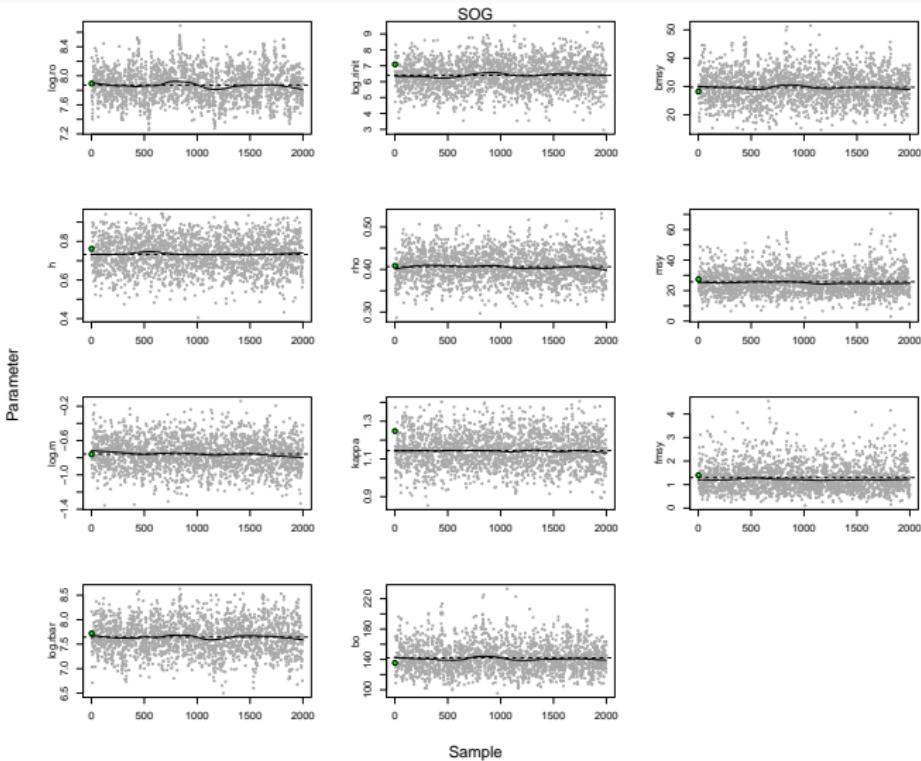
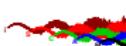


Figure: Posterior samples: 1 million, thin 500, Strait of Georgia



# Diagnostics: Pair plots

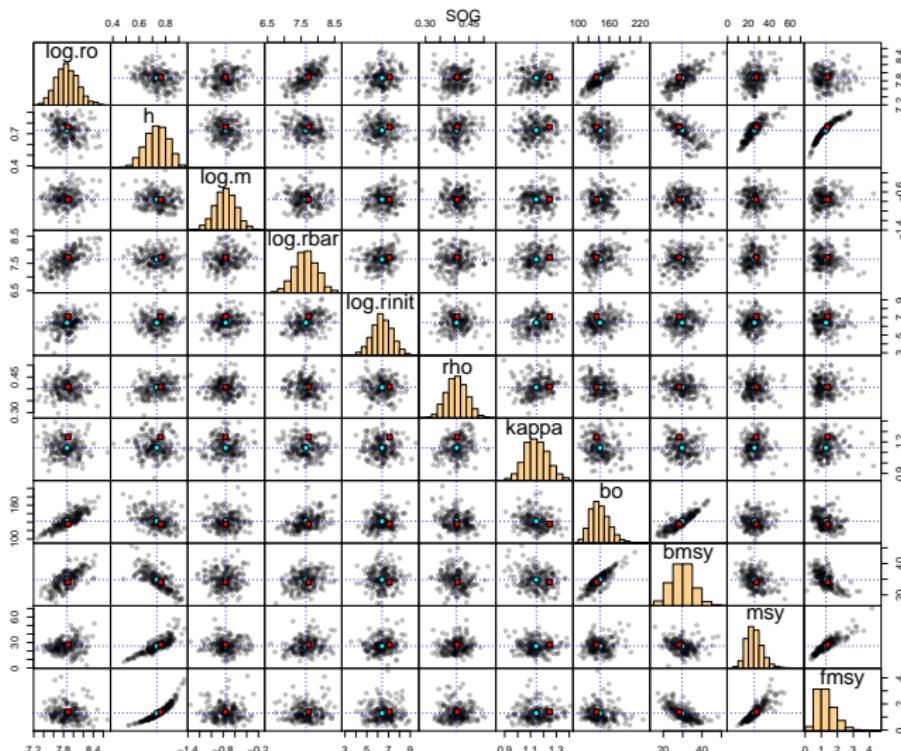


Figure: Posterior samples from leading parameters & derived variables.



# Diagnositcs: Marginal posteriors

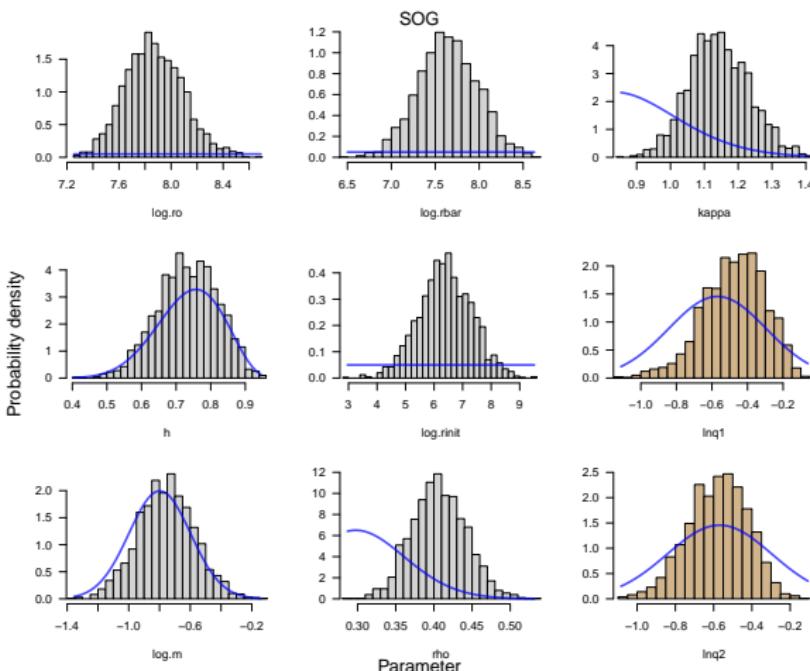


Figure: Strait of Georgia: Marginal & prior distributions.



# Forecast: Old cutoffs

**Table:** Estimated spawning stock biomass, age-4+ biomass and pre-fishery biomass for poor average and good recruitment, old cutoffs, and available harvest based on median values from the joint posterior distribution.

Stock	SSB	4+ Biomass	Pre-fishery forecast biomass				Available harvest		
			Poor	Average	Good	Cutoff	Poor	Average	Good
HG	16,579	7,089	9,618	12,892	21,478	10,700	0	2,192	4,296
PRD	27,046	20,593	24,150	27,492	37,286	12,100	4,830	5,498	7,457
CC	14,666	7,809	11,357	14,709	22,883	17,600	0	0	4,577
SOG	125,261	72,937	94,703	112,856	138,448	21,200	18,941	22,571	27,690
WCVI	14,679	8,267	15,321	20,906	31,130	18,800	0	2,106	6,226



# Forecast: New cutoffs

**Table:** Estimated spawning stock biomass, age-4+ biomass and pre-fishery biomass for poor average and good recruitment, new cutoffs (based on median value of 0.25 estimated within the *iSCAM* model), and available harvest based on the median values from the joint posterior distribution.

Stock	SSB	4+ Biomass	Pre-fishery forecast biomass			Cutoff	Available harvest		
			Poor	Average	Good		Poor	Average	Good
HG	16,579	7,089	9,618	12,892	21,478	10,436	0	2,456	4,296
PRD	27,046	20,593	24,150	27,492	37,286	19,641	4,510	5,498	7,457
CC	14,666	7,809	11,357	14,709	22,883	15,600	0	0	4,577
SOG	125,261	72,937	94,703	112,856	138,448	35,013	18,941	22,571	27,690
WCVI	14,679	8,267	15,321	20,906	31,130	14,894	427	4,181	6,226



# Bibliography

- ADMB Project (2009). 2009 AD Model Builder: Automatic Differentiation Model Builder. Developed by David Fournier and freely available from [admb-project.org](http://admb-project.org).
- Fournier, D. and Archibald, C. (1982). A general theory for analyzing catch at age data. *Canadian Journal of Fisheries and Aquatic Sciences*, 39(8):1195–1207.

