

# EVALUATION OF SURVIVAL AND DETECTION ESTIMATES BASED ON A BAYESIAN CORMACK-JOLLY- SEBER MODEL FOR SPRING CHINOOK SALMON IN THE WILLAMETTE RIVER BASIN

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# Background

- Standard statistical framework to estimate survival rates from tagging studies for salmonids is the Cormack-Jolly-Seber model (CJSM) using Maximum Likelihood Estimation
- Estimates also can be carried out using a Bayesian framework. Bayesian analysis allows the “borrowing” of information from other (independent) studies in the form of a prior probability distribution for the estimated parameters.
- Due to the sampling design, the CJSM parameters, “apparent” survival and detection rates, are confounded in the parameter estimation.
- Under the minimum model configuration (e.g., a release site and two detection sites: SUJ and WFF), the CJSM could produce biased or highly imprecise estimates
- A simulation-estimation framework can inform us about the potential bias and imprecision in estimates from a CJSM
- We apply this framework to evaluate bias and precision for the Bayesian CJSM.

# Outline

1. Simulation-estimation study
  2. CJS estimates for chinook salmon released in the Willamette river basin
- Objectives
  - Methods and Data
  - Results
  - Discussion/Summary



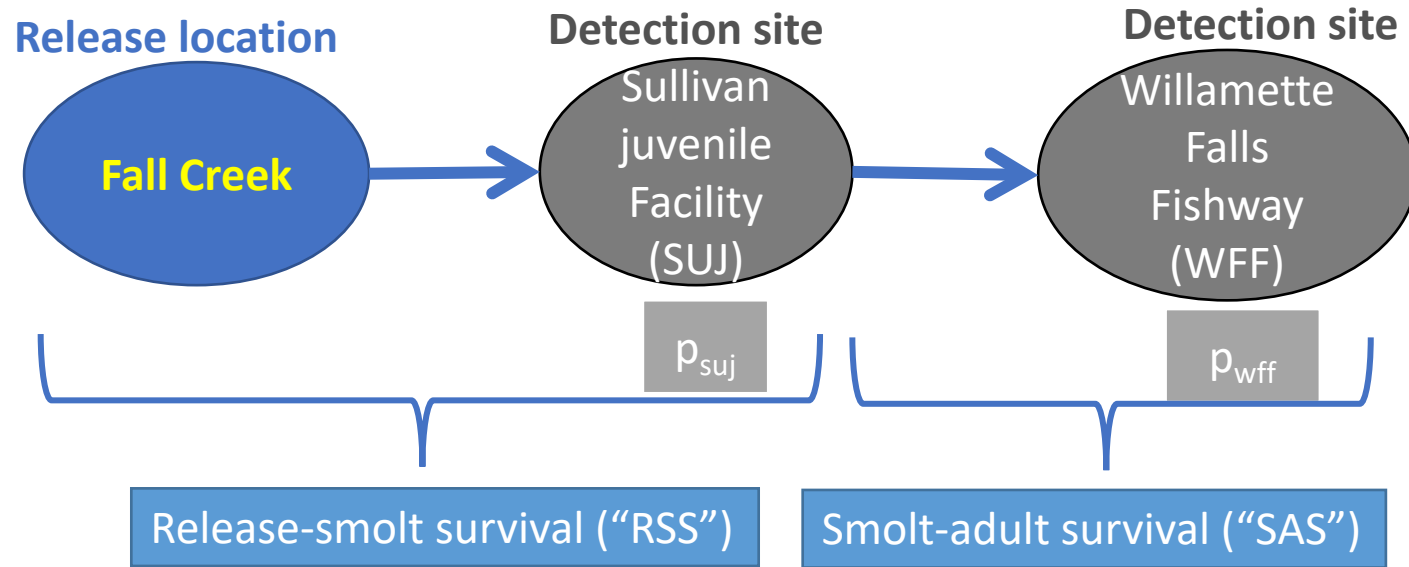
# Simulation-estimation study

# Objectives

- 1) Evaluate bias and precision of parameter estimates for a Bayesian CJS model using a simulation-estimation framework



# 1. Methods and Data



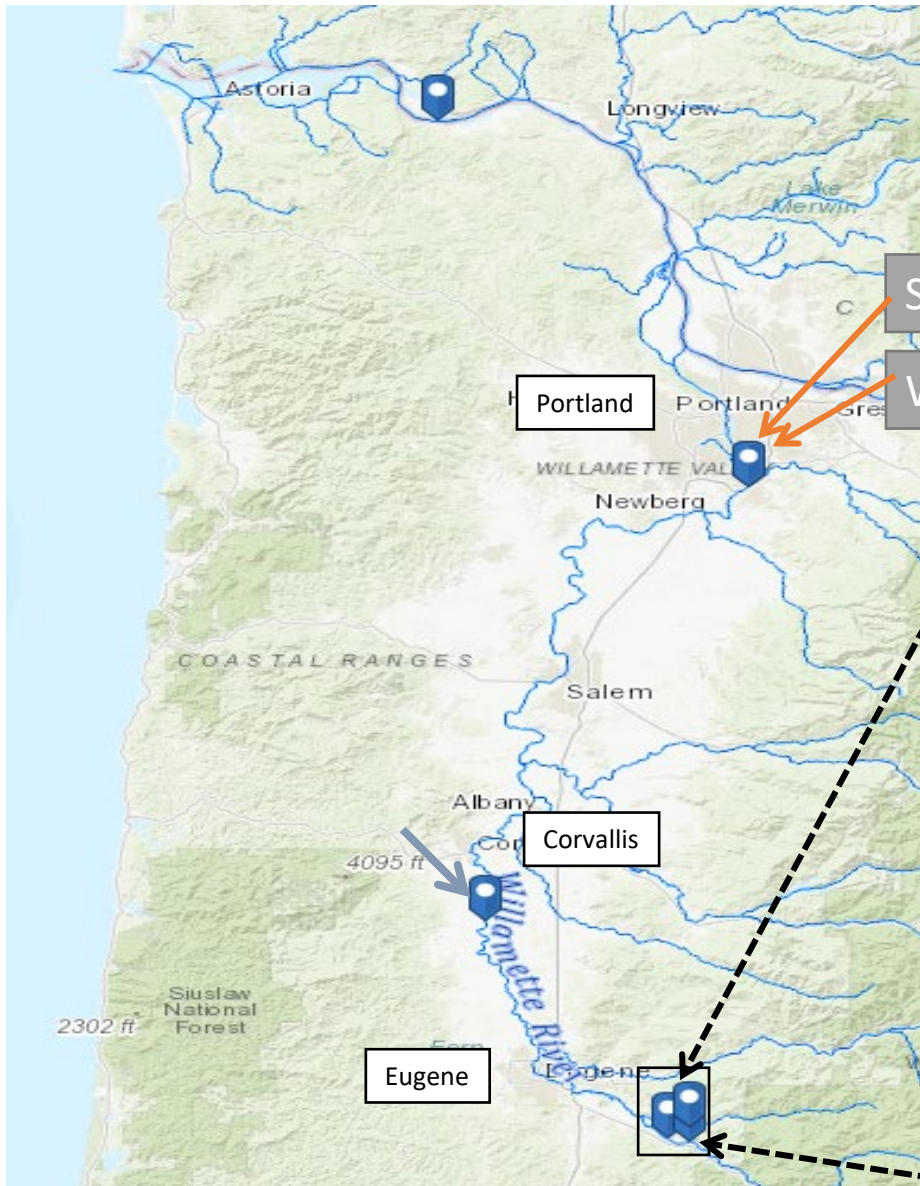
$p_{\text{su}}j$  and  $p_{\text{wff}}$  are the detection rates for smolt and adults, respectively.

SAS: integrates the survival from smolt leaving SUJ and arrival some years later as adult at WFF

- We simulated data (detection histories) based on CJS parameter estimates from Fall Creek and Lookout Point head of reservoir (Lop-Hor)

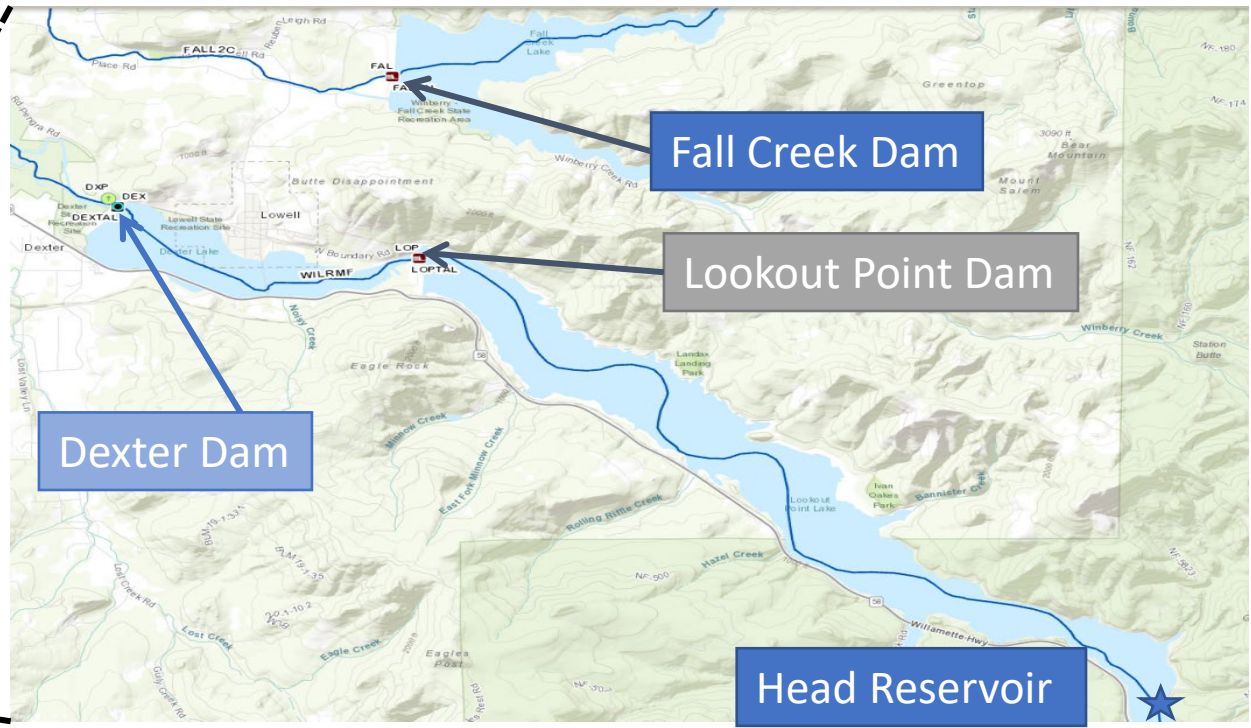
# release & detection sites

black: detection sites  
Blue: release sites

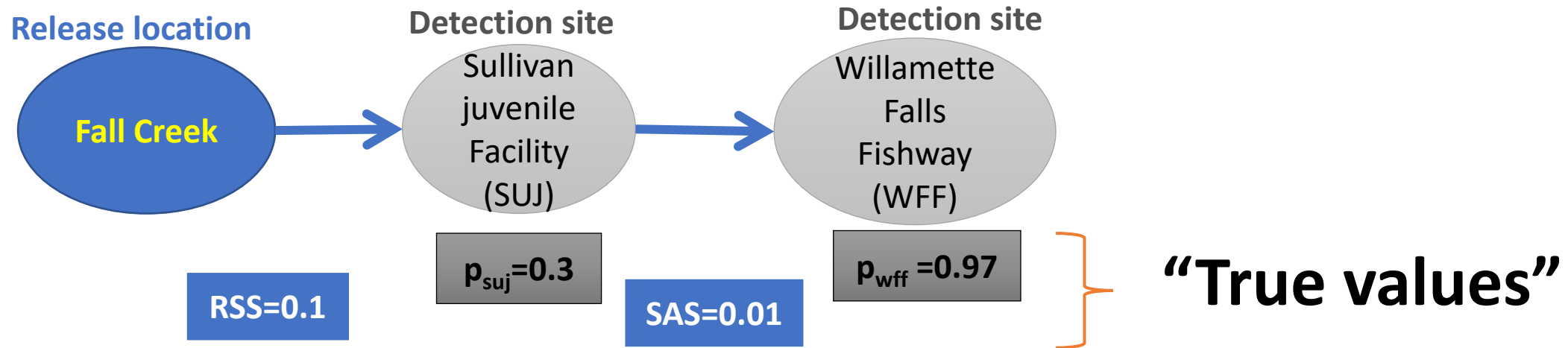


Sullivan Juvenile Facility (SUJ)

Willamette Falls Fishway (WFF)



# 1. Methods and Data



CJS estimates from Fall Creek and Lop-Hor were established as the “true values” for the simulation. We “released” 5,000 and 10,000 smolts, respectively. Lop-Hor 2013 release data exemplified a “worse case scenario” (many releases but low detections at SUJ and low survivals).

Simulated detection histories	100	110	101	111
Fall Creek	4844	152	3	1
Lop-Hor	9918	80	2	0

e.g., 110: fish released and only detected at SUJ but not at WFF



# 1. Methods and Data

- The estimation model (i.e., Bayesian CJSM) was fitted to the simulated data (i.e., detection histories).
- We compared true vs. estimated parameter values as a measure of performance: e.g., [relative bias=(estimated-true)/true].

## **Important assumptions for the estimation model :**

- $p_{wff}$  is close to 1 (i.e., informative prior). This allows separation of SAS from  $P_{wff}$
- We developed a prior for  $p_{suj}$ : ~15% (Tom Porteus presentation for details)
- Uninformative priors for Release – Smolt Survival (RSS) and Smolt-Adult Survival (SAS); e.g., Beta(1,1)



# 1. Results

Simulation results for the Bayesian CJS model (Gibbs sampler) based on Fall Creek release data.

Metric	RSS	$p_{\text{su}j}$	SAS	$p_{\text{wff}}$
true value	0.1	0.3	0.01	0.97
SD	0.14	0.18	0.009	0.03
CV	0.98	0.52	0.72	0.03
median	0.09	0.33	0.0097	0.97
2.5% quantile	0.05	0.08	0.002	0.89
97.5% quantile	0.39	0.67	0.028	0.99

The relative bias was low for both RSS and SAS (-7% and -3%, respectively).  
The relative bias for  $p_{\text{su}j}$  also was low (9%)

Simulated detection histories	100	110	101	111
Fall Creek	4844	152	3	1



# 1. Results

Simulation results for the Bayesian CJS model (Hamiltonian Monte Carlo sampler, HMC) based on Lop-Hor 2013 release data.

Metric	RSS	$p_{\text{su}j}$	SAS	$p_{\text{wff}}$
true value	0.05	0.15	0.005	0.97
SD	0.07	0.07	0.004	0.03
CV	0.75	0.57	0.88	0.03
median	0.07	0.11	0.004	0.96
2.5% quantile	0.03	0.03	0.001	0.88
97.5% quantile	0.31	0.29	0.016	0.99

For the Lop-Hor simulation, missing detection histories caused bias in parameter estimation (RSS: 40%, SAS: -28%, and  $p_{\text{su}j} = -28\%$ ).

Simulated detection histories	100	110	101	111
Lop-Hor	9918	80	2	0



# 1. Discussion

- Minimum configuration for a CJS model could produce biased parameter estimates under missing detection histories, in particular, when 101 or 111 are zero.
- The state-space CSJM version (in Jags) and the multinomial likelihood (in R) produced similar results.
- The bias produced by missing detections could be reduced, but likely not eliminated, using well-informed and empirically-based priors (e.g., Porteus et al. 2021).
- The informative priors for detection at SUJ ( $p_{\text{su}j}$ ) helped MCMC convergence and reduce uncertainty in the release-smolt survival (RSS) estimates.
- The detection prior at WFF ( $p_{\text{wff}}$ ) is key to estimating smolt-adult survival (SAS).  
As far we know, this is a new approach to estimating SAS in the Willamette River basin and it could be applied to other river sub-basins.



# CJS estimates for Chinook Salmon Tagged and Released in the Willamette River Basin

# Objectives

- 2a) Apply the Bayesian CJS model to estimate the survival and detection rates for chinook salmon released in the Willamette river basin
- 2b) Compare survival estimates for fish released above and below dams

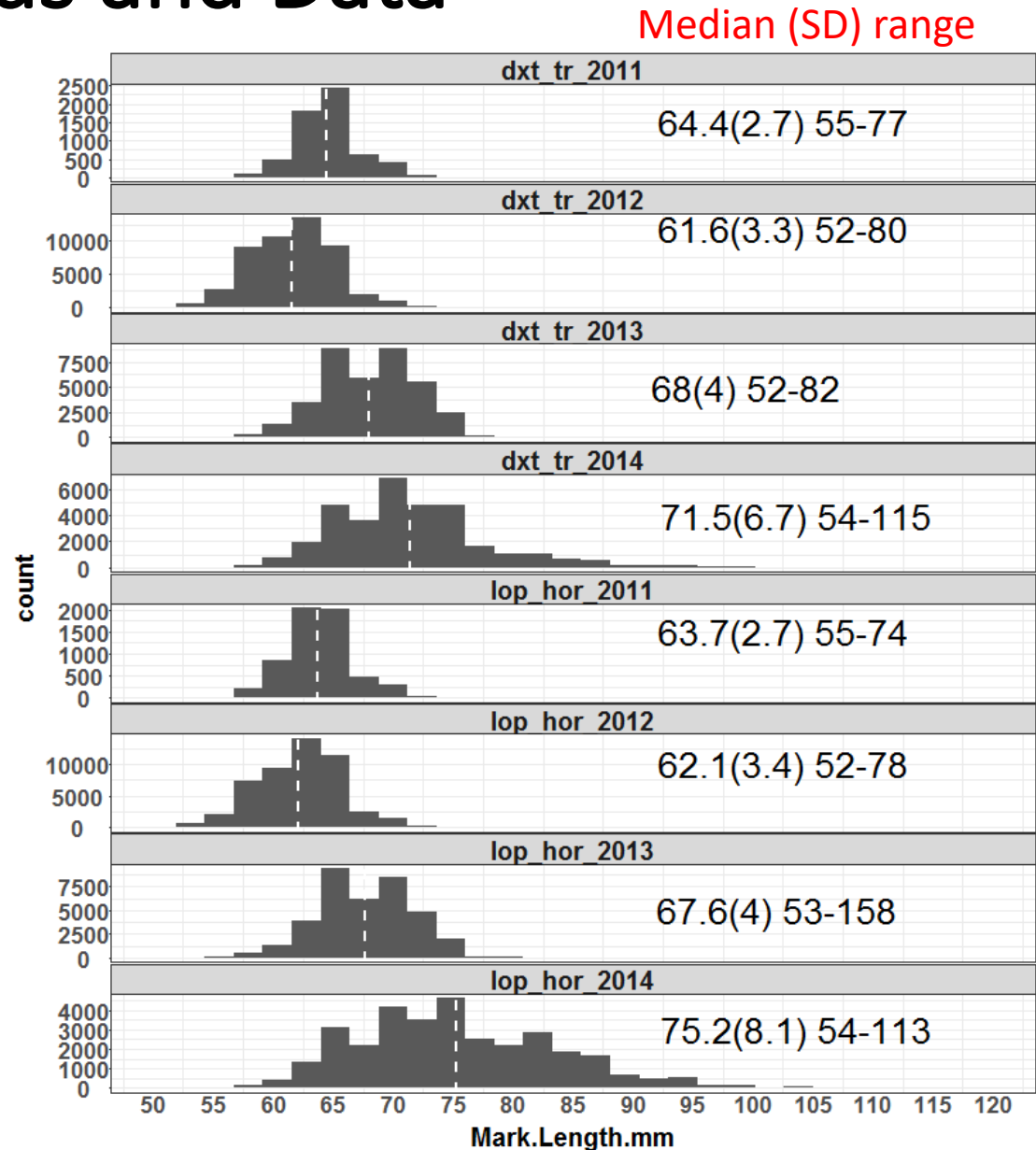
## 2. Methods and Data

- A **subset** of paired release data for Middle Fork Willamette River was used
- These data allow comparison of fish tagged and released above and below dams

Release location	2011	2012	2013	2014
Fall Creek			3,990	
Lookout Point head of reservoir (Lop-Hor)	5967	49,624	37,194	37,194
Dexter tailrace (Dex-Tr)	5958	49,266	37,287	33,517



## 2. Methods and Data



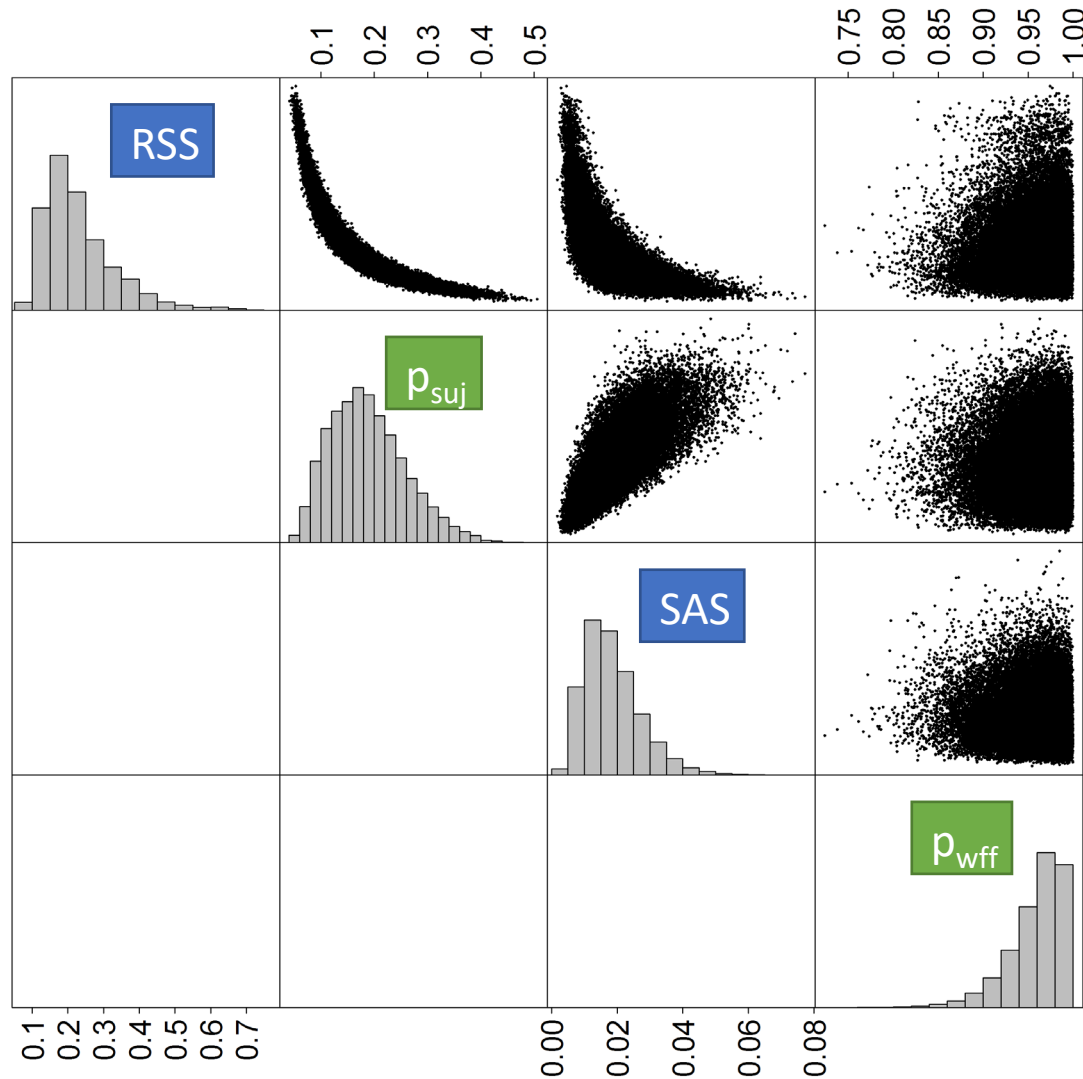
- The data show variability in terms of size at release
- Estimates should be compared within years but not between years (e.g., Dex-Tr 2011 vs. Lop-Hor 2011)





# 2. Results

Example of posteriors estimates for Fall Creek



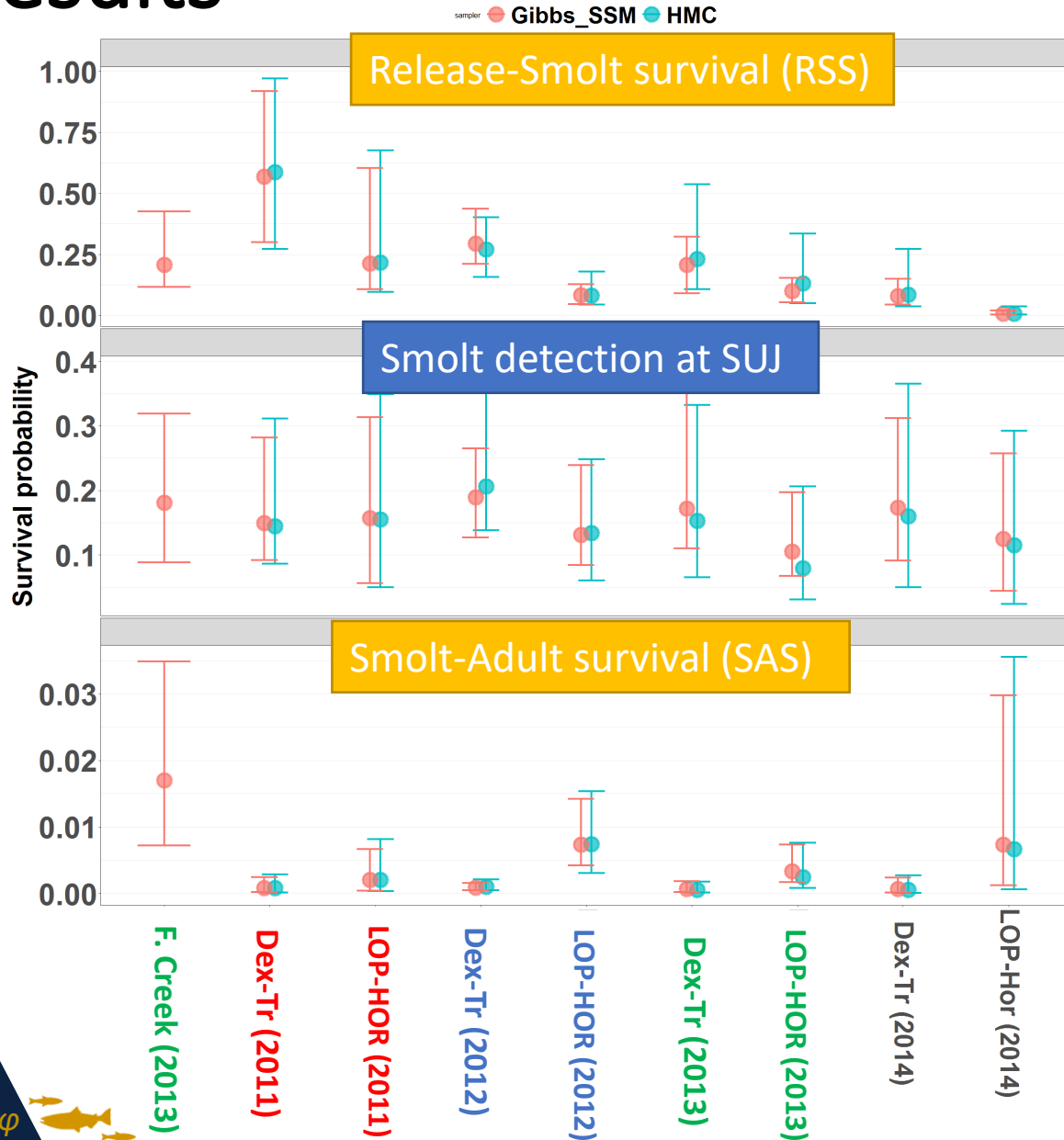
- Bayesian estimation allows characterization of uncertainty (probability distribution) and correlation of the estimated parameters
- Thus, the MCMC samples can be used to project uncertainty/correlation in population dynamics models

	RSS	$p_{suj}$	SAS	$p_{wff}$
RSS	1	-0.87	-0.7	0
$p_{suj}$		1	0.78	0
SAS			1	-0.07
$p_{wff}$				1

Survival or detection rates



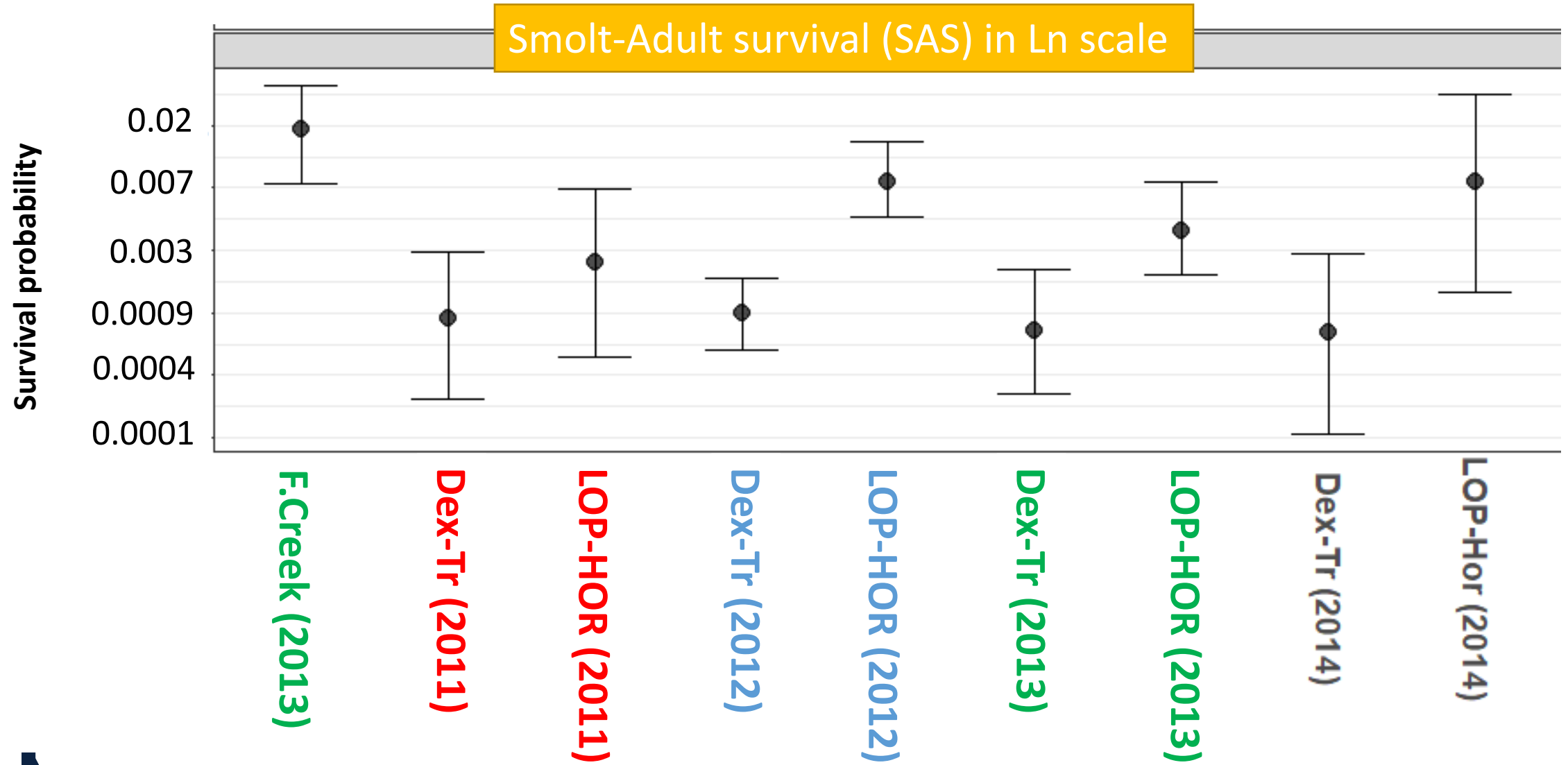
# 2. Results



- SSM Gibbs and HMC produced similar results but posteriors from the state-space model were typically more precise
- RSS at Dex-Tr is higher than at Lop-Hor
- The RSS at Fall Creek is comparable to fish released at Dex-Tr for 2013



# 2. Results



## 2. Discussion

- Fall Creek has self-sustainable chinook salmon population. The RSS and SAS likely reflect this situation
- The higher SAS at LOP could be explained by the longer time that smolts spend in the reservoir before the outmigration (i.e., bigger fish have a better survival). This could explain The higher SAS for Fall Creek.
- More refinements are needed for including tag loss and tag induced mortality rates in the CJS estimates (Oliver Murray presentation for details)
- further analysis will include covariates to predict the effects of e.g., size, water temperature, on stage-based survival rates
- Similarly, more refinements are need for the detection prior at SUJ (Tom Porteus' presentation for details)
- Bayesian CJM estimation can be easily expanded to other river sub-basins.



# Acknowledgments

- Oregon State Fish and Wildlife Department for its implementation of the paired release experiments and making the PIT tag data from them available for this study
  - Luke Whitman (ODFW) for helping to provide the data
- The Columbia Basin PIT Tag Information System (PTAGIS)