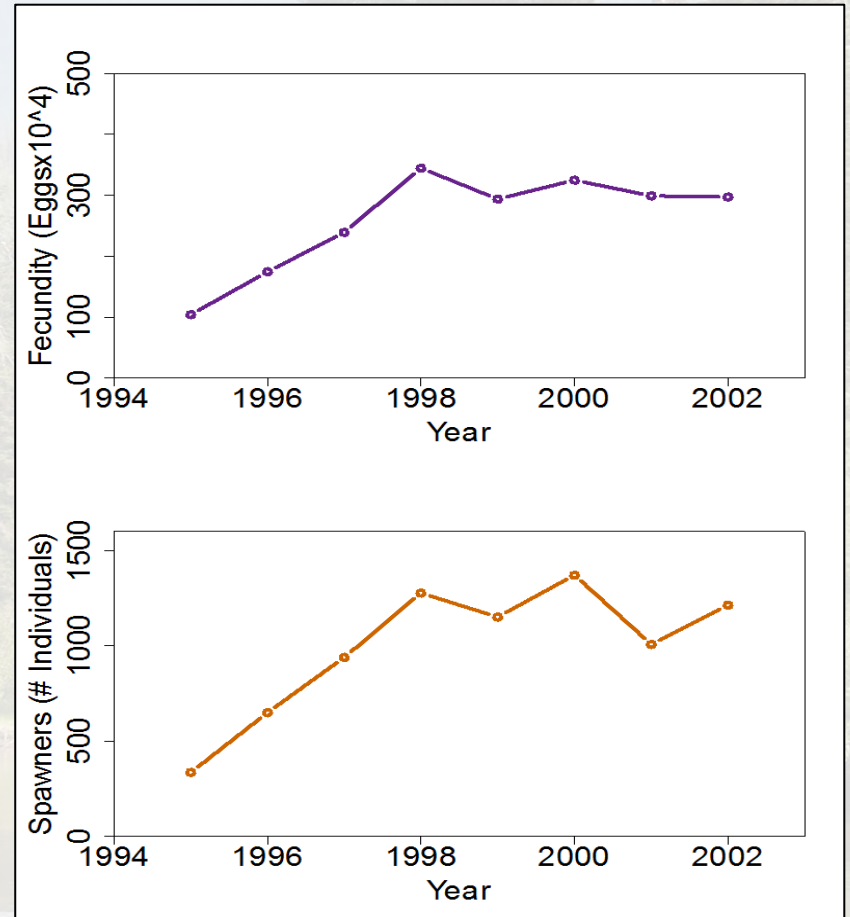
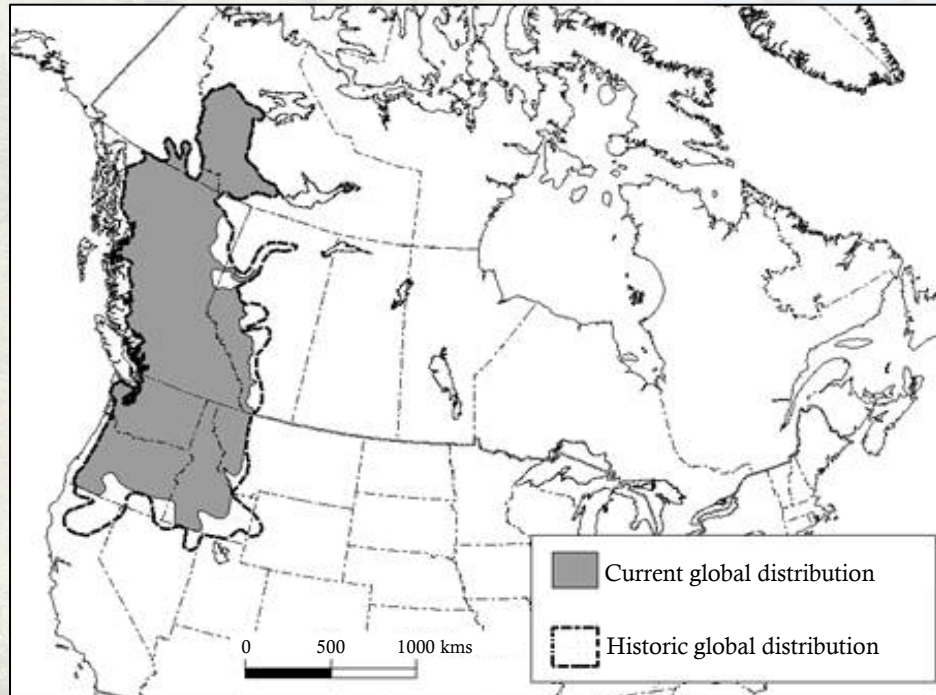


Hierarchical Bayesian meta-analysis to
characterize cross-population variation
in the stock-recruit relationship for bull
trout (*Salvelinus confluentus*)

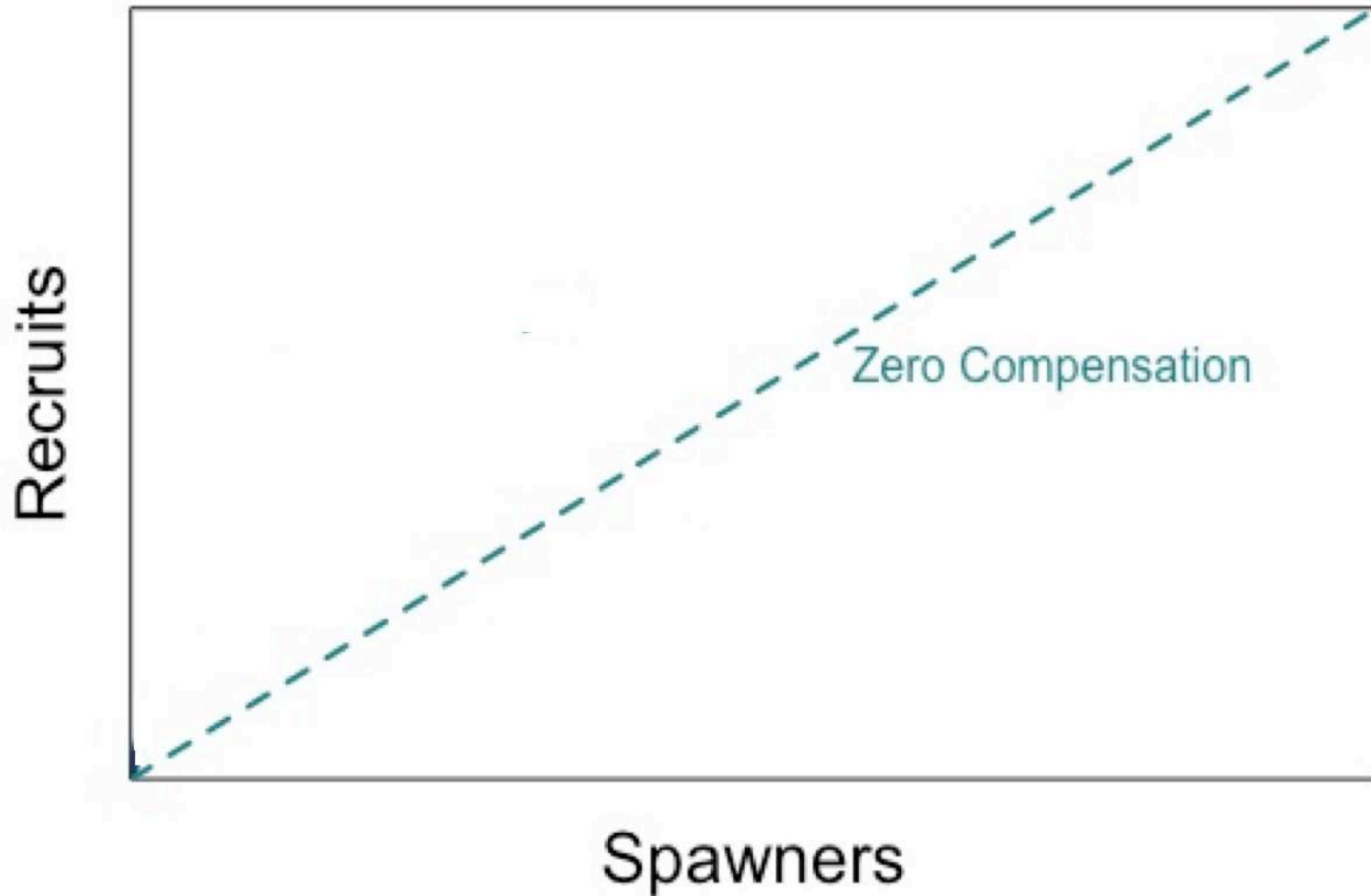
Rachel Chudnow, Brett van
Poorten, and Murdoch McAllister
AFS Kelowna, 2018

Bull trout: Conservation status and recovery

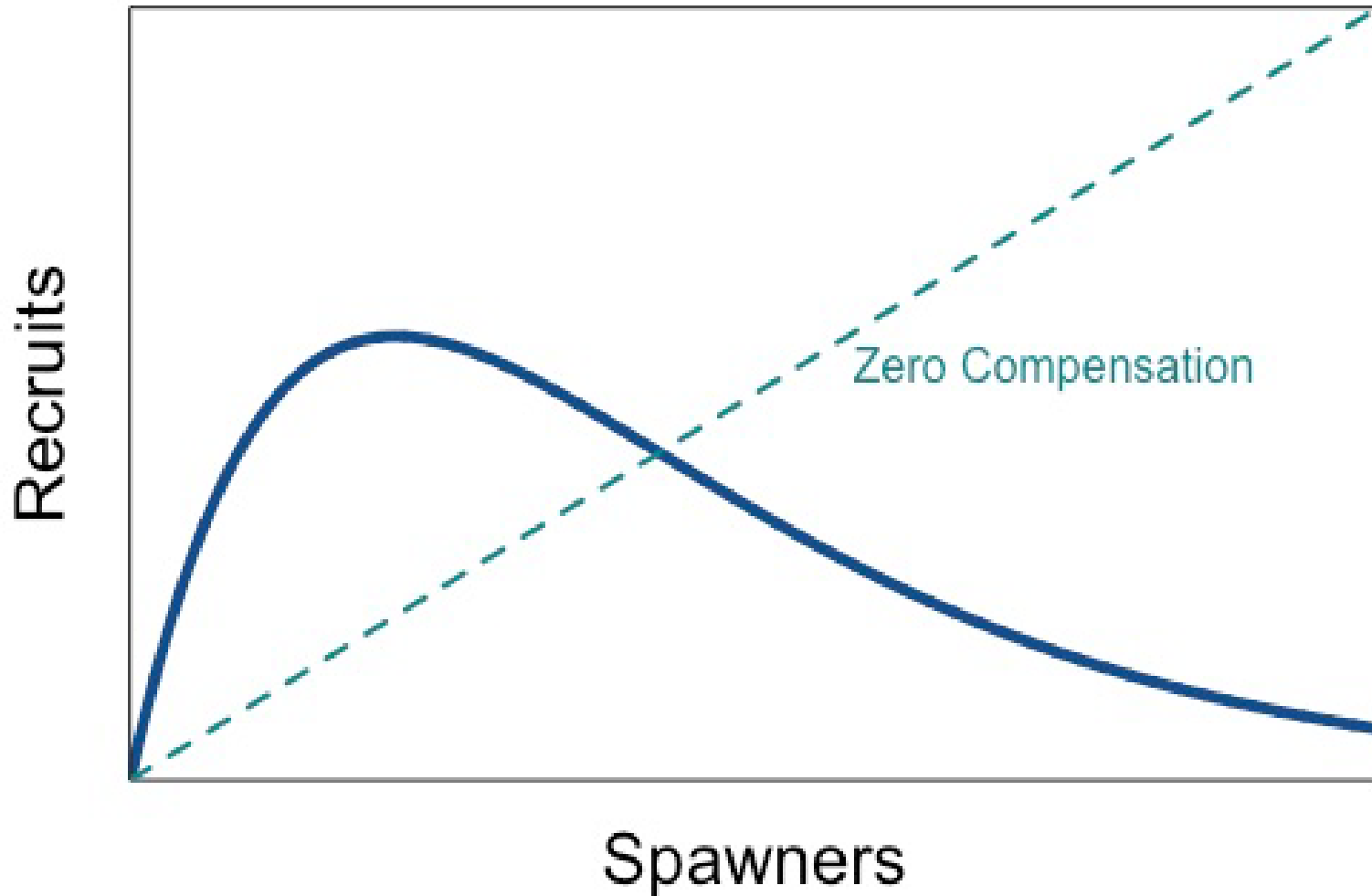


Lower Kananaskis Lake, Alberta
Data courtesy of Dr. John Post and Dr. Fiona Johnston

What is density dependent compensation (DD?)



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Importance of density dependent (DD) compensation

- Critical for population persistence
- Permits harvest and population survival despite stochastic perturbations
- Critical for estimating recovery rates and sustainable harvest

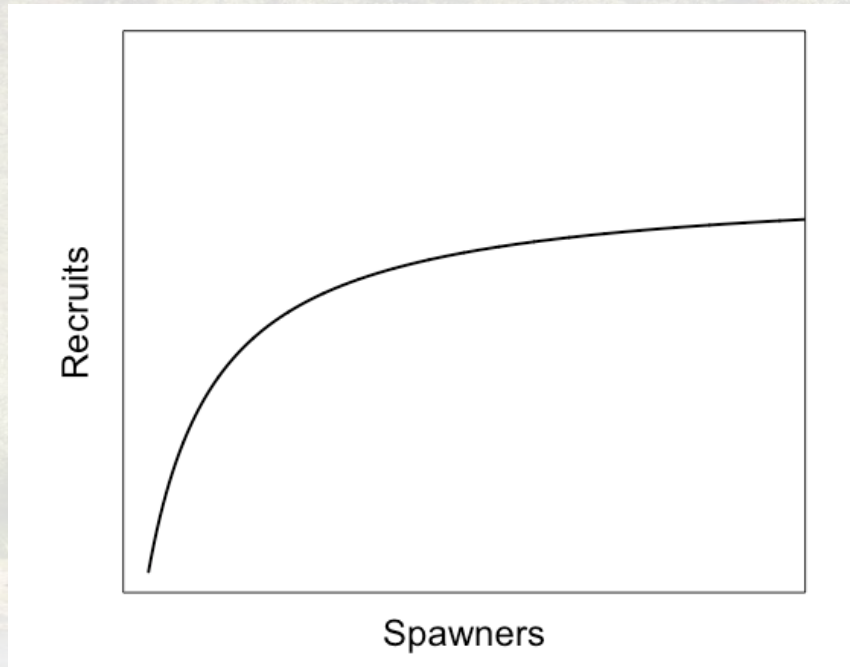


Importance of density dependent (DD) compensation

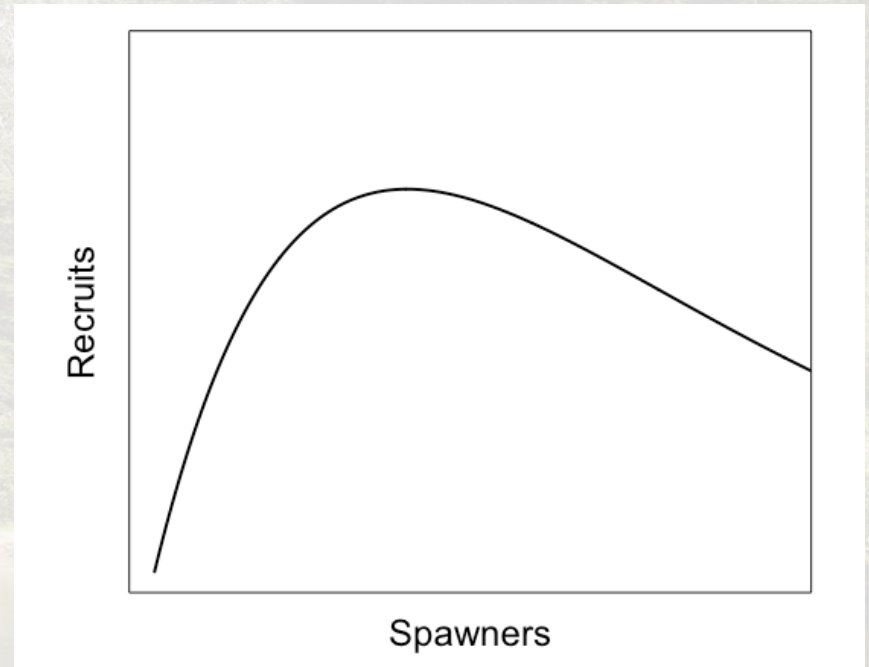
- Critical for population persistence
- Permits harvest and population survival despite stochastic perturbations
- Critical for estimating recovery rates and sustainable harvest
- **Has not been quantitatively explored for bull trout across species range**

Getting at DD compensation with Stock-recruitment models

Beverton-Holt

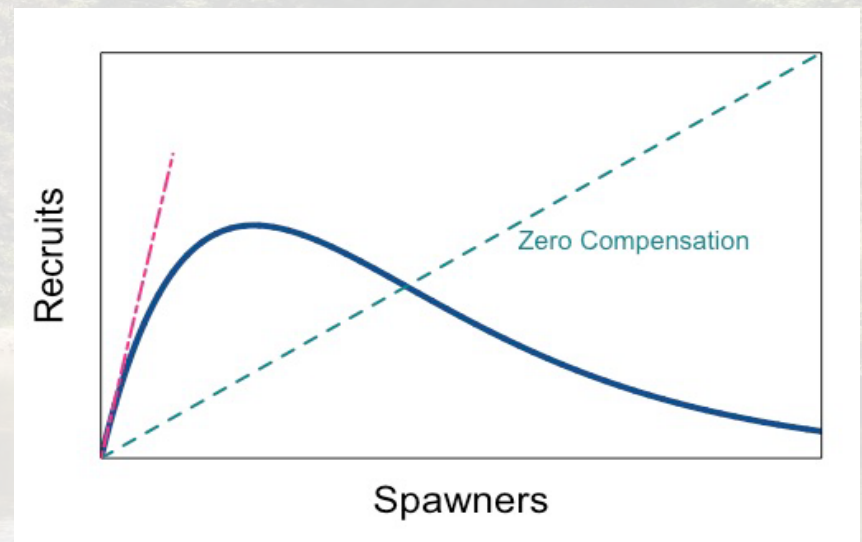


Ricker



Exploring compensation with the SR the Goodyear compensation ratio

- What is the CR?
 - Measures change in survival and fecundity parameters
 - Provides index of degree of compensation required for a fished population to persist





Exploring compensation with the SR the Goodyear compensation ratio

- What is the CR?
 - Measures change in survival and fecundity parameters
 - Provides index of degree of compensation required for a fished population to persist
- Why is it important?
 - Takes from SR function α to a parameter useful for:
 - Determining rates of recovery
 - Carrying out population viability analyses
 - Developing robust management
 - Exploring potential harvest opportunities



Difficulties in determining SR

- Key uncertainties result from:
 - Limited temporal and spatial scale of data
 - High variance in estimates of stock size and/or juvenile density
 - Spatial heterogeneity of populations
 - Difficulty explicitly defining stock and recruit



Hierarchical Bayesian meta-analysis

- Statistical model composed of multiple levels
- Combines data from several independent sources
- Estimates parameter values simultaneously for individual populations and meta-population(s)
- Gaining traction in SR analysis for data-limited situations and where data is uninformative



Benefits of Hierarchical Bayesian meta-analysis

- Combines data from several independent sources
- Explicitly accounts for uncertainty
- Estimates parameters at population and meta-population level

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- Combines data from several independent sources
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 - Provides smaller variance and more reliable parameter estimates
 - Predicts parameter probability distributions for unsampled populations

Data collection

- Compiled for fluvial and adfluvial bull trout across species range
- Data obtained for 33 populations
- 21 excluded due to:
 - Short time series (<5 years)
 - Incomplete information
 - Substantial changes in productivity or carrying capacity



Description of bull trout stock-recruit datasets utilized in analysis.

System	Province	Life history	Data range (yrs.)	Data series length (yrs.)	Publication type
Eunice Creek	AB	Fluvial	1971-1983	10	Journal *
Smith-Dorrien Creek	AB	Adfluvial	1995-2001	7	Journal †
Attichika Creek	BC	Adfluvial	2001-2007	7	Research Document ‡
South Pass	BC	Adfluvial	2001-2007	7	Research Document ‡
Tributary 4 (Mainstem)	BC	Adfluvial	2001-2007	7	Research Document ‡
Tributary 4 (Upper South Fork)	BC	Adfluvial	2002-2007	12	Research Document ‡
Tributary 4 (Lower South Fork)	BC	Adfluvial	2003-2009	8	Research Document ‡
Tributary 12	BC	Adfluvial	2001-2007	7	Research Document ‡
Tributary 16	BC	Adfluvial	2001-2007	7	Research Document ‡
Line Creek	BC	Fluvial	1991-1999	9	Personal communication §
Kaslo River	BC	Adfluvial	2010-2014	5	Personal communication
Keen Creek	BC	Adfluvial	2010-2014	5	Personal communication

* Paul *et al.*, 2000

† Johnston *et al.*, 2007

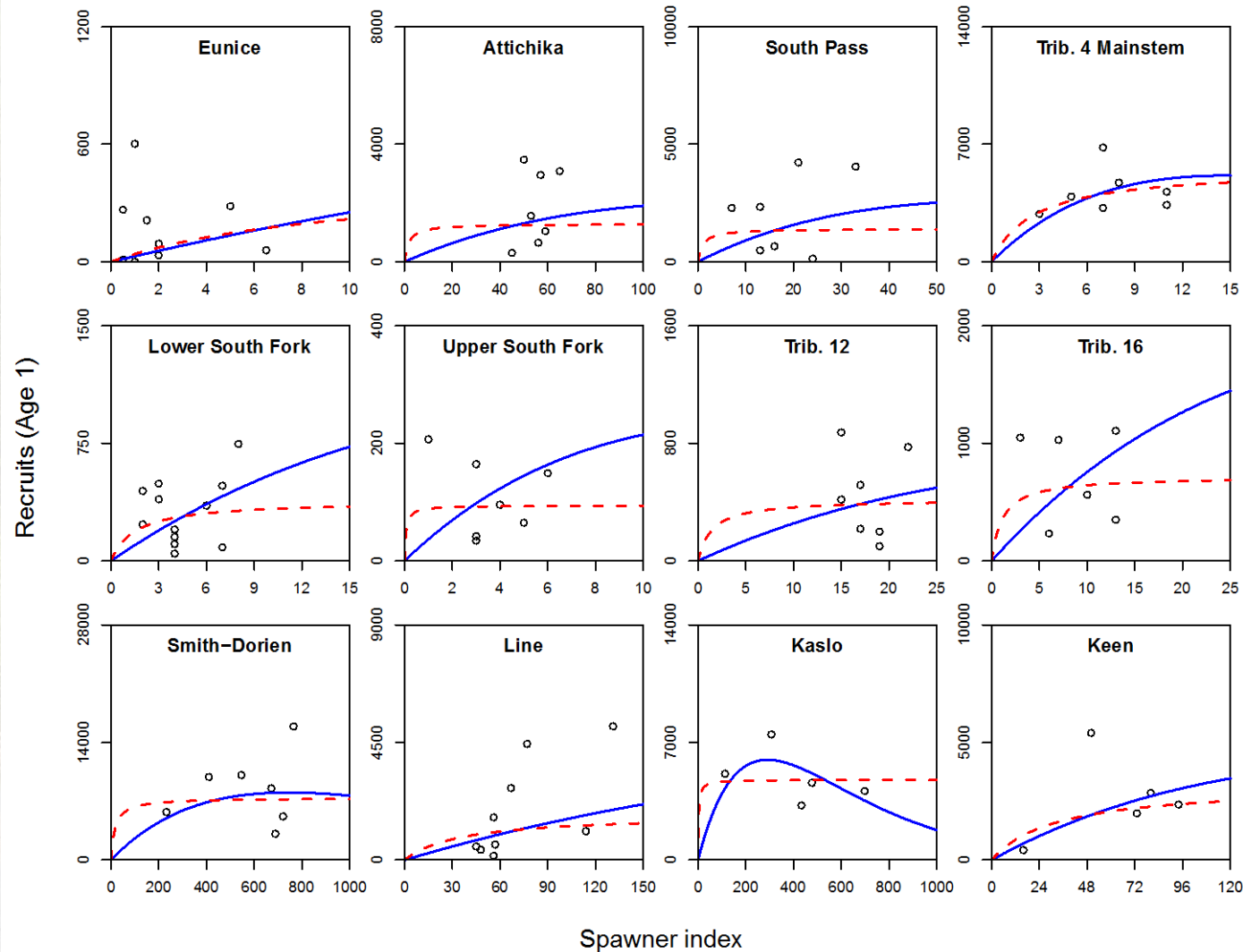
‡ David Bustard and Associates LTD.

§ Jim Allen, Pisces Environmental Consulting 2016

|| Greg Andrusak, BC FLNRO

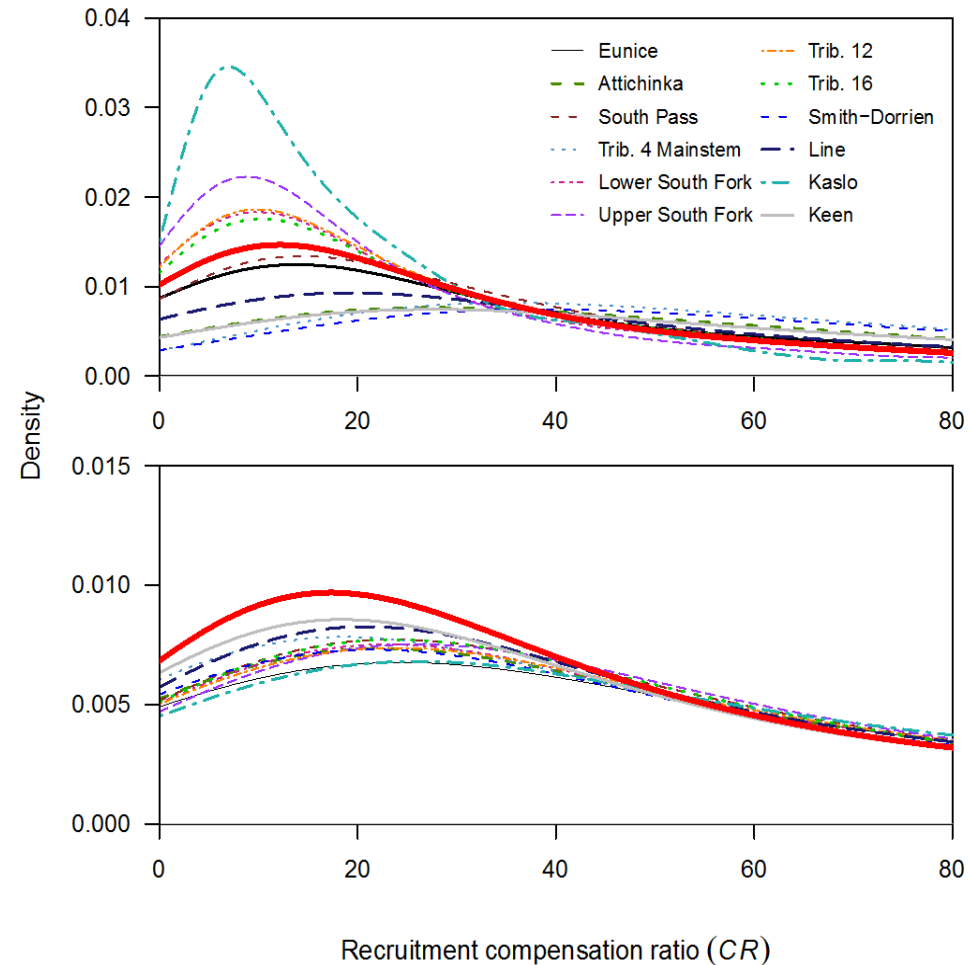


Results: Fits to stock–recruit data under the assumption of Ricker SR function



Take home messages

- Provides **prior** for un-sampled populations
- CR estimate useful for:
 - Determining rates of recovery
 - Developing management
 - Exploration of potential harvest opportunities





Take home messages

- Bull trout have **large** scope for improvements in juvenile survival at low stock size
- Suggests bottleneck for population recovery likely habitat **quality** and **quantity**



Take home messages

- If this is important (which it is) people need to collect the data
 - Datasets uninformative
 - Lack of available stock-recruitment data
 - Lack of consistency in data collection approaches between regions

Thank you

- Collaborators:

- Dr. Villy Christensen (UBC)
- Dr. Rick Taylor (UBC)
- Dr. Josh Korman (UBC, Ecometric Research Inc.)
- Ministry of Forests, Lands and Natural Resource Operations – Fish and Wildlife Branch – Omenica Region
- Mr. John Hagen (John Hagen and Associates)

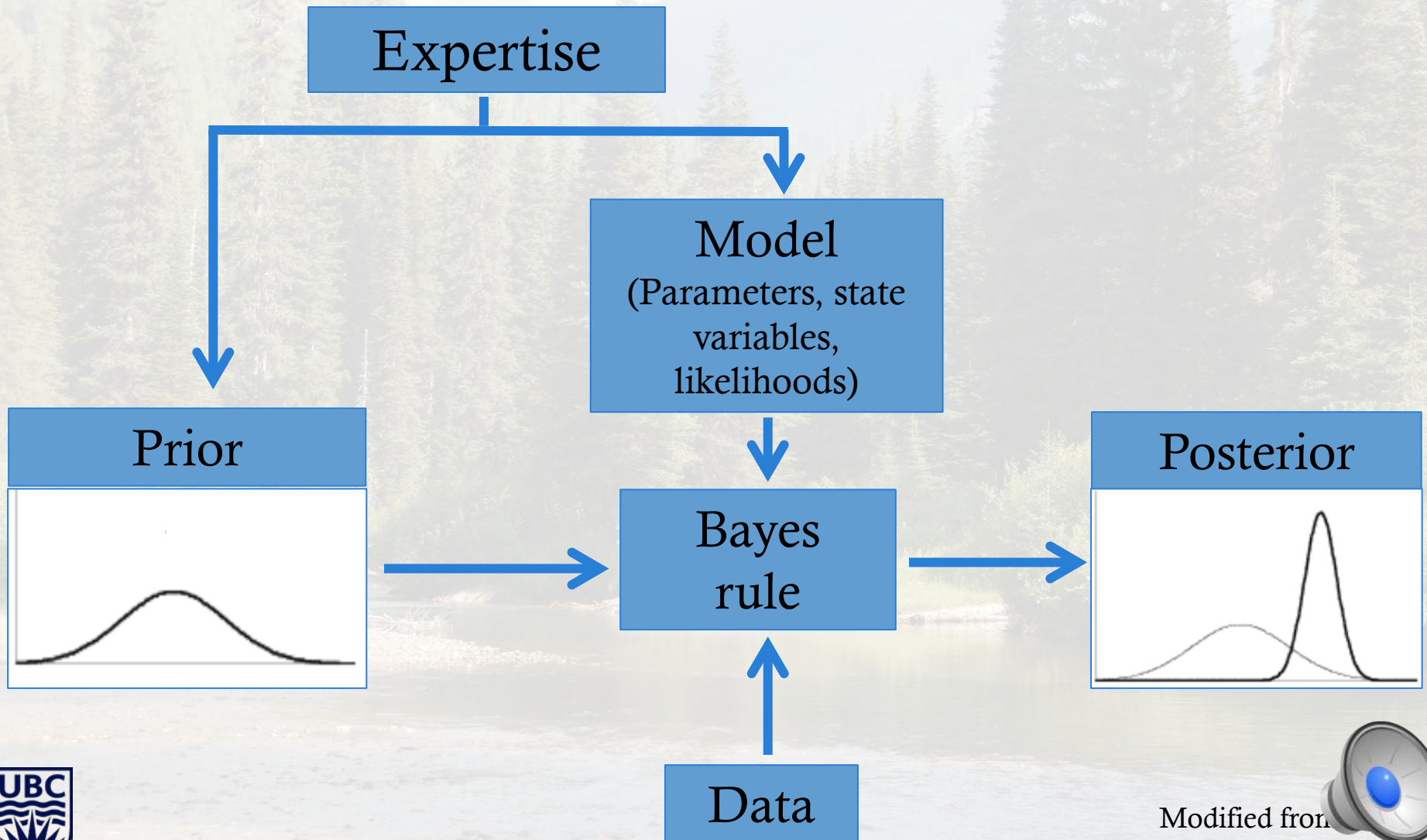
- Funding

- Habitat Conservation Trust Foundation (HCTF)

- Photos:

- Map of approximate current and historic global distribution of *Salvelinus confluentus*. Modified from COSEWIC. 2012. Assessment and Status Report on the Bull Trout *Salvelinus confluentus* in Canada.
- Juvenile bull trout. U.S. Fish and Wildlife Service.
- Bull trout. Photo by Joel Sartore, U.S. Fish and Wildlife Service.
- Parent, E. and Rivot, E. 2013. Introduction to hierarchical Bayesian modeling for ecological data. CRC Press. FL, USA.

Introduction to Bayesian models



Hierarchical Bayesian models

