



NOAA
FISHERIES

Assessing bycatch estimation methods under data-poor scenarios

NMFS Protected Species Toolbox
Mini-Symposium II
March 1-2, 2018

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Motivation

- Many methods for bycatch estimation
 - Challenging and important problem
 - Diversity of challenges from sample size to meta-dataset
- But many challenges shared... common lessons on estimation method choice?
- Good estimates needed to underpin effective management and population assessments
 - Bias, error, and confidence interval coverage

Objectives

1. Develop guidance on when particular estimation methods may perform poorly
2. Inform managers and scientists wrt comparability of estimates from different methods
3. Assess mean and uncertainty prediction



Approach

- Large observer data sets as “whole truth” (varying fishery size, event frequency, data dispersion)
- Range of simulated observer coverages (5-50%, random and stratified design)
- For each simulation, estimate mean and confidence intervals at three coverage levels: 95%, 80%, 50%
- Evaluate

Approach: Estimation Methods

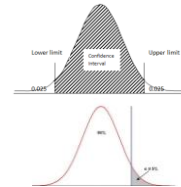
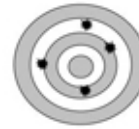
Estimation Method	NEFSC	SEFSC	SWFSC	NWFSC	AFSC	PIFSC
Mean-per-unit (binomial) (effort-based expansion)				✓*		
Wilson interval		✓				
bootstrap interval		✓	✓			
Ratio (landings-based expansion)						
analytical interval				✓	✓	
bootstrap interval	✓			✓		
BC bootstrap interval		✓				
BCa bootstrap interval	✓	✓				
Delta-lognormal		✓				
Horvitz-Thompson						✓
Generalized Linear Model						
Poisson	✓					
Binomial	✓					
Generalized Additive Model						
Poisson	✓					
Random Forest			✓			

Approach: Estimation Methods

Estimation Method	NEFSC	SEFSC	SWFSC	NWFSC	AFSC	PIFSC
Mean-per-unit (binomial) (effort-based expansion) Wilson interval bootstrap interval		✓ ✓	✓	✓*		
Ratio (landings-based expansion) analytical interval bootstrap interval BC bootstrap interval BCa bootstrap interval	✓ ✓	✓ ✓		✓ ✓	✓	
Delta-lognormal		✓				
Horvitz-Thompson						✓
Generalized Linear Model Poisson Binomial	✓ ✓					
Generalized Additive Model Poisson	✓					
Random Forest			✓			

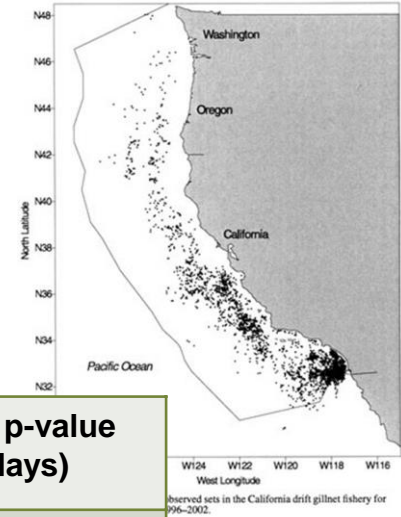
Approach: Performance metrics

- Mean
 - Bias (ratio)
 - MAE (standardized)
 - RMSE (standardized)
- Confidence intervals:
 - Overall coverage
 - Upper tail error rate



Approach: Data sets

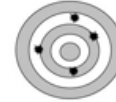
- CDGN 1991-2000* (intra-annual estimates)
 - 71-134 observed trips yr⁻¹



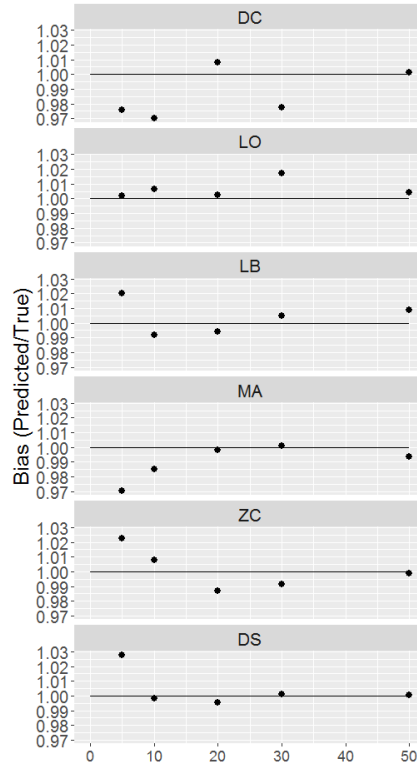
Species	Code	Catch (total)	Catch Yr ⁻¹ (range)	Var:Mean (annual)	Knox test p-value (20km, 3 days)
Leatherback turtle	DC	22	0 – 5	1.0	0.04
Pacific white-sided dolphin	LO	22	0 – 5	1.5	0.036
Northern right whale dolphin	LB	56	0 – 11	2.0	0.057
Elephant seal	MA	104	2 – 22	1.1	0.001
California sea lion	ZC	120	4 – 9	1.9	0.001
Short-beaked common dolphin	DS	301	9 – 45	1.6	0.001

* Approximates current fishery size but not management

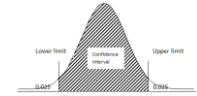
MPU: Mean Metrics



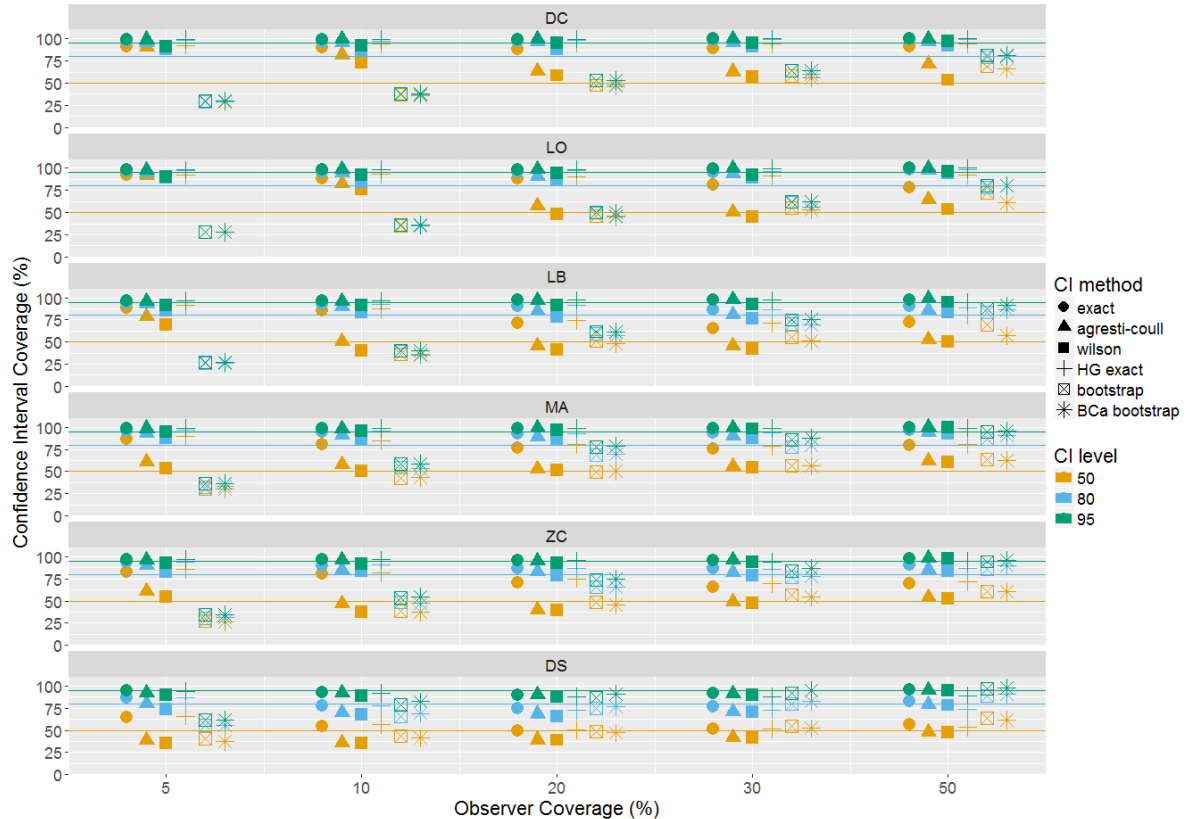
Code	Catch (total)	Var:Mean (annual)
DC	22	1.0
LO	22	1.5
LB	56	2.0
MA	104	1.1
ZC	120	1.9
DS	301	1.6



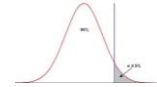
MPU: Confidence Interval Coverage



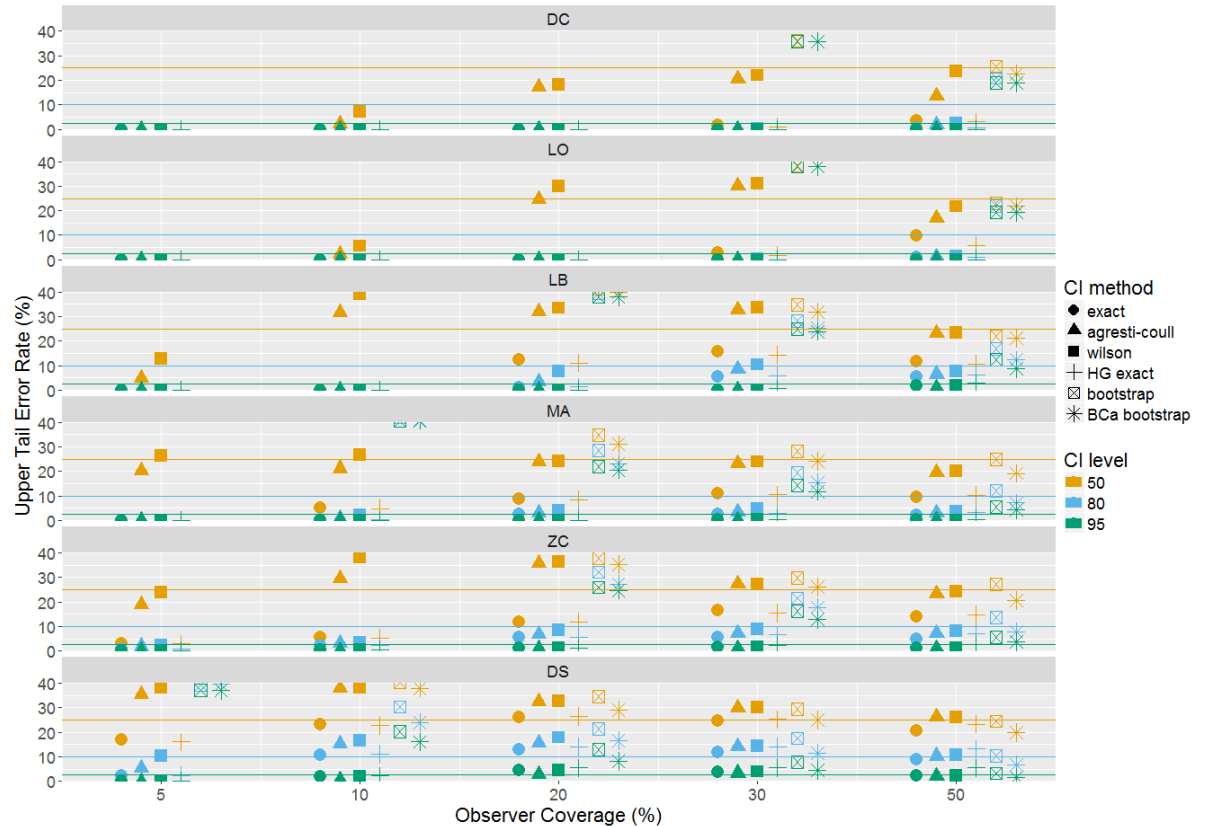
Code	Catch (total)	Var:Mean (annual)
DC	22	1.0
LO	22	1.5
LB	56	2.0
MA	104	1.1
ZC	120	1.9
DS	301	1.6



MPU: Upper Tail Error Rate



Code	Catch (total)	Var:Mean (annual)
DC	22	1.0
LO	22	1.5
LB	56	2.0
MA	104	1.1
ZC	120	1.9
DS	301	1.6



A Few Concluding Thoughts

- Filling in framework: more estimation and sampling methods, larger data sets
- MPU Confidence Intervals
 - Bootstrap intervals not compatible with small fishery (trip-level)
 - Wilson interval balances risk aversion and efficiency
 - Potential trouble areas: overdispersed data
 - Can handle years with zero observed catch
- Zeros: undetected species? Importance of fishery-independent risk assessment

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This PDF was later amended to make the document 508 compliant.

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