



Designing a large scale aerial survey of polar bears and ice-associated seals in the Chukchi Sea

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Rationale

- Retreating summer sea ice and increasing human activity in Arctic marine environments have raised concerns about population trends of polar bears and ice-associated seals



Bearded seal
Erignathus barbatus



Ringed seal
Phoca hispida



Polar bear
Ursus maritimus

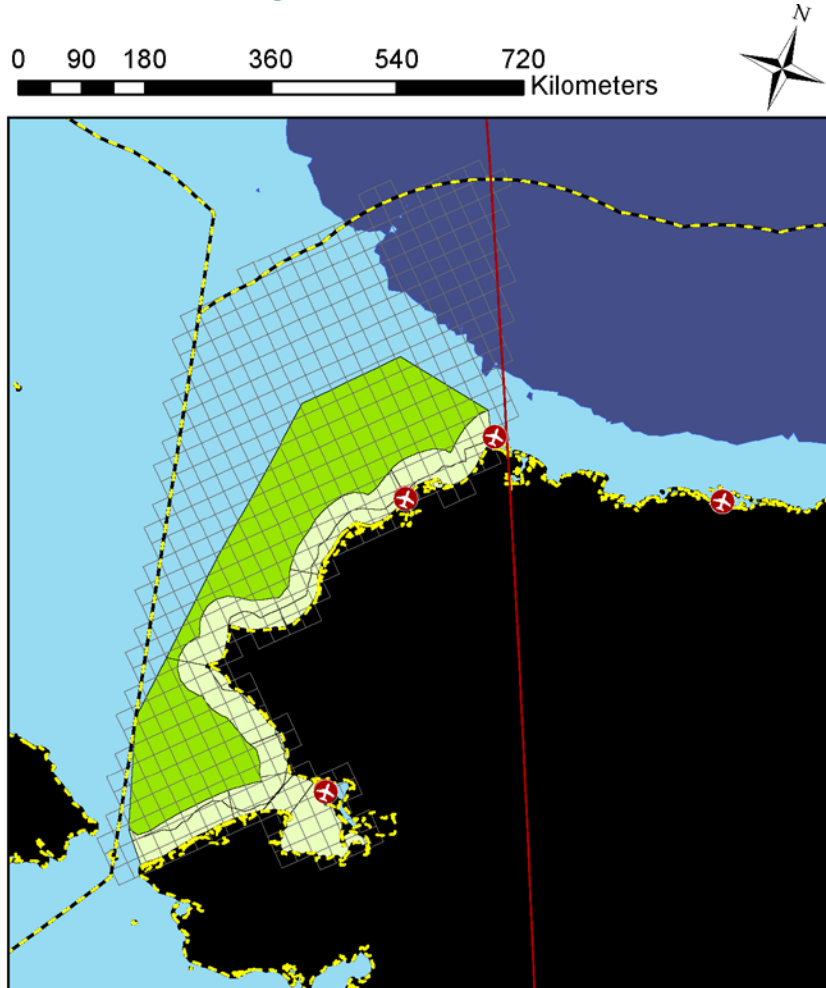


Rationale

- In coordination with Russian scientists, we conducted aerial, instrument-based surveys of these species in the Chukchi Sea in the spring of 2016
- Before conducting surveys we performed simulation analyses to determine anticipated precision and examine the performance of alternative levels of effort and flight track allocation strategies
- These are important analyses, because surveys are very expensive and we want to know whether they will generate reliable estimates of abundance



Study area

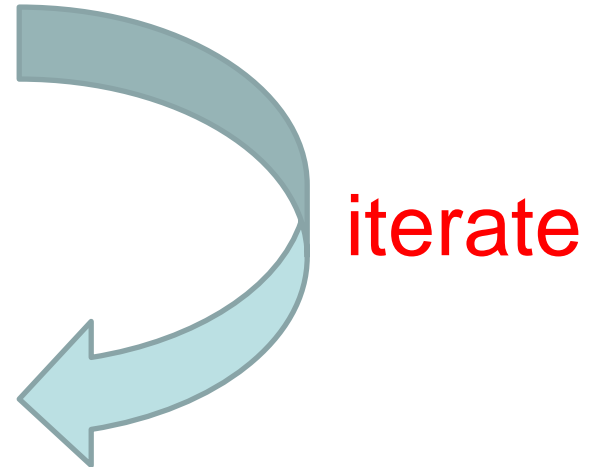


- U.S. portion of Chukchi Sea
- 25km x 25km grid cells
- Bounded to south by Bering Strait
- Bounded to west and north by U.S. EEZ
- Bounded to east by 156°



Simulation setup

- 1) Generate abundance
- 2) Simulate Surveys
- 3) Estimate abundance
- 4) Calculated bias and anticipated precision

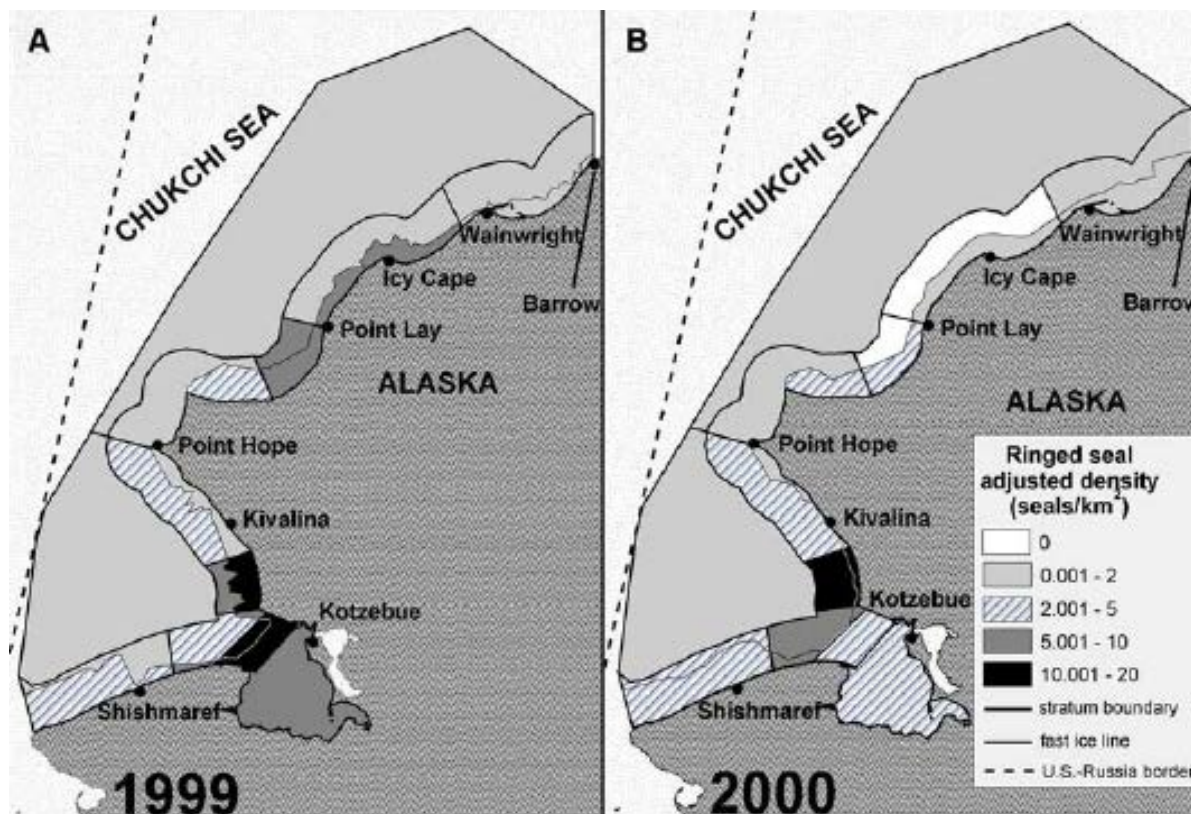


Select survey design that maximizes cumulative precision



Simulating abundance

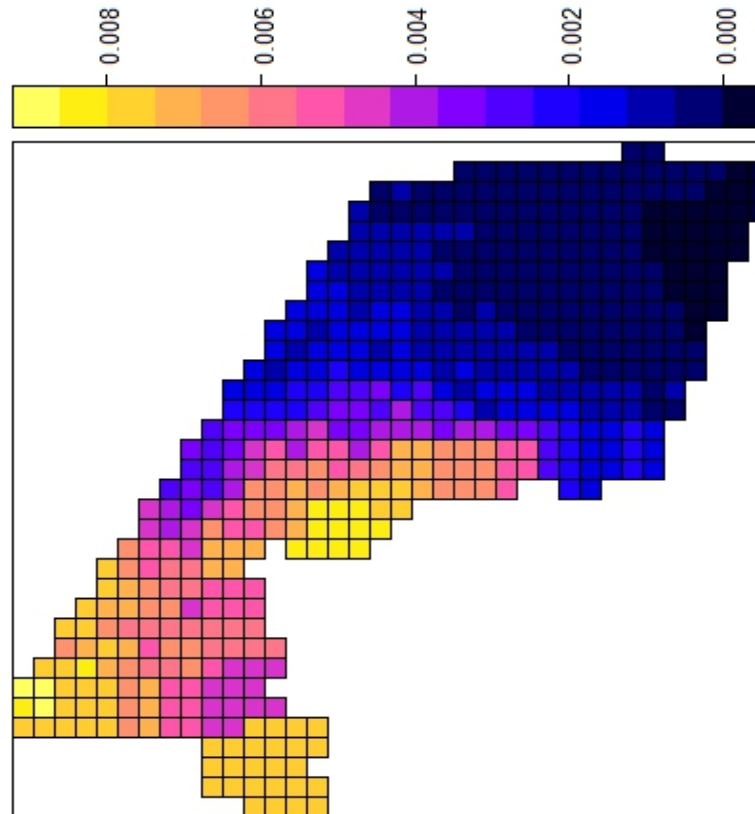
- Base expected seal abundance on published density estimates (Bengtson et al. 2005)





Simulating abundance

- Base polar bear distribution on resource selection functions fitted to satellite records from neck-collared females





Simulating abundance

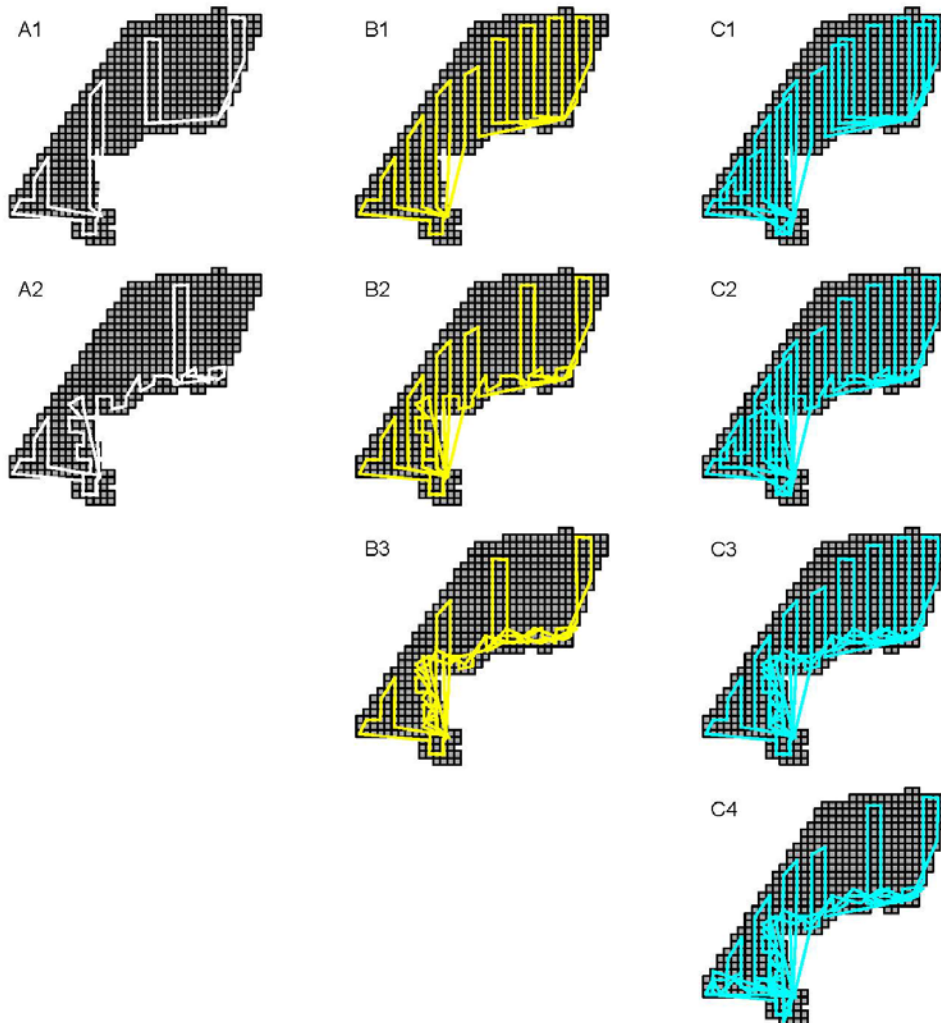
- Expected polar bear abundance: 1,000
- Expected ringed seal abundance: 434,000
- Expected bearded seal abundance 19,300

Simulated abundance using expected abundance as a mean, but also included spatially autocorrelated random effects, η_s , and additional Gaussian noise

$$N_s \sim \text{Poisson}(\lambda_s)$$
$$\log(\lambda_s) = \log(\mu_s) + \eta_s + \epsilon_s$$



Simulating surveys





Simulating surveys

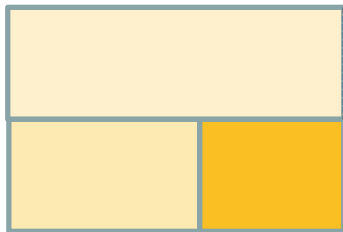
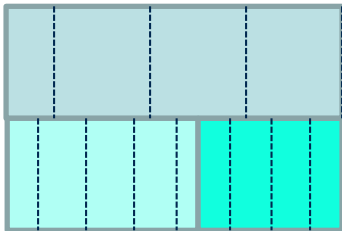
- Counts in each surveyed cell generated according to Poisson distribution, depending on how much area (A_s) is surveyed in each cell
- Incomplete detection simulated
 1. availability
 - Polar bears – 100%
 - Bearded seals – 48%
 - Ringed seals – 65%
 2. imperfect detection of infrared scanners (94%)



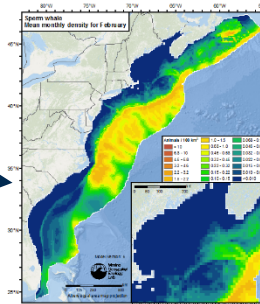
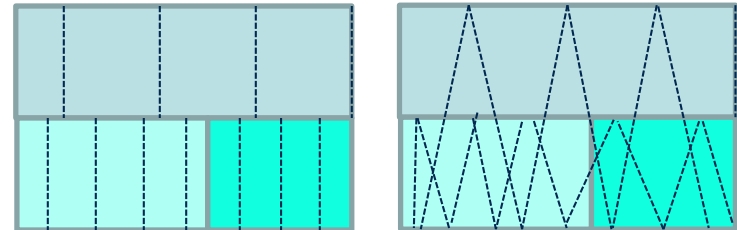
Estimating abundance

Refresher: Design- vs. model-based inference

A. Design-based



B. Model-based

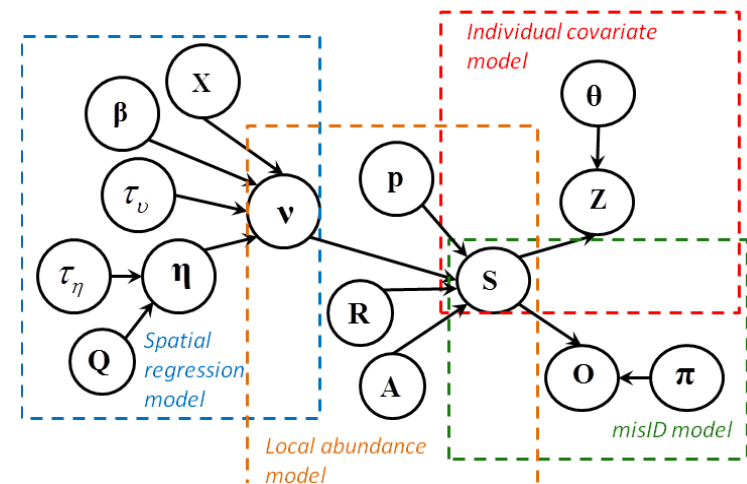


Duke University (sperm whales)



Estimating abundance

- For each simulation, we estimated abundance of all 3 species with a hierarchical, Bayesian spatial regression model
- Use covariate relationships to explain variation in counts and to predict abundance in unsampled locations (e.g., distance from land, northing, easting, strata, spatially autocorrelated random effects)

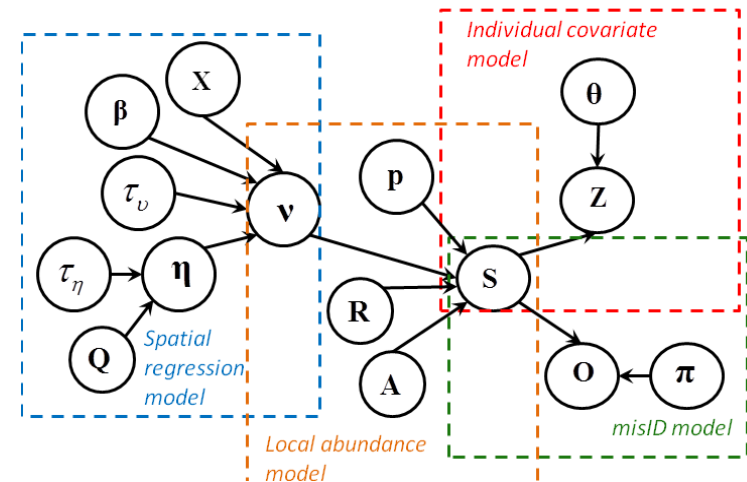


Conn et al. 2015, *Methods in Ecology and Evolution*



Estimating abundance

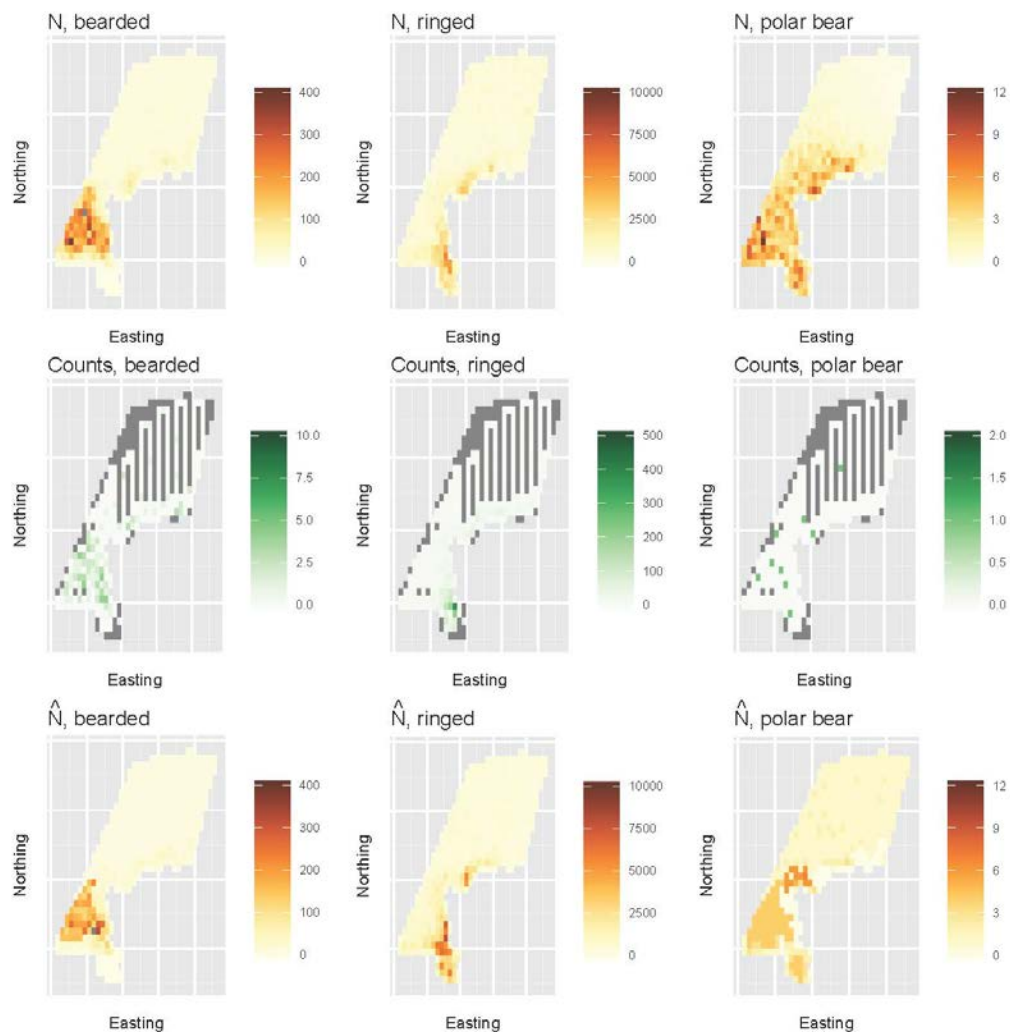
- Fit multiple models with different levels of complexity to each dataset. 9 models for seals, 4 models for polar bears
- We do not use the same variables to estimate abundance as we do to generate the data (that's cheating!)
- Importantly, model accounts for uncertainty in detection estimates



Conn et al. 2015, *Methods in Ecology and Evolution*



Example of one simulation



Repeat
100
times!



Simulation results: bias

Species	4 flights (3920km)	8 flights (7840km)	12 flights (11760km)
Bearded seals	-8% to 54%	-7% to 8%	-9% to 7%
Ringed seals	-2% to 21%	-3% to 6%	-4% to 10%
Polar Bears	NA	-11% to 38%	-9% to 11%

- Lower bias for flight designs with more even spatial coverage
- Lower bias with more complicated estimation models



Simulation results: precision (CV)

Species	4 flights (3920km)	8 flights (7840km)	12 flights (11760km)
Bearded seals	0.19 – 0.39	0.15 – 0.18	0.13 – 0.15
Ringed seals	0.10 – 0.14	0.09 – 0.11	0.09 – 0.10
Polar Bears	NA	0.35 – 0.97	0.28 – 0.35

- Could likely obtain sufficient precision for seals with 8 flights
- 12 or more flights would be better for polar bears, but still somewhat imprecise

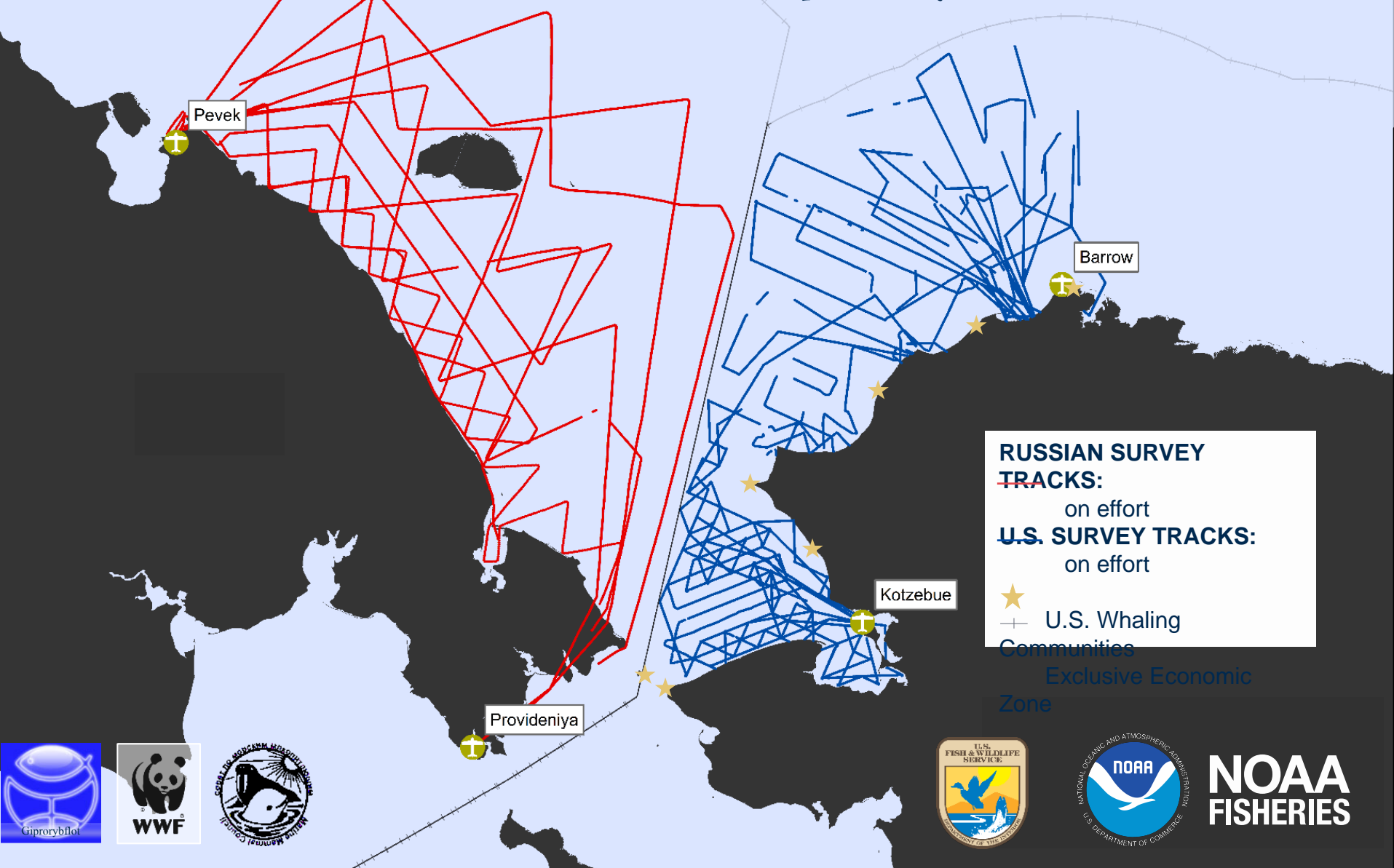


Conclusions

- This study provided confirmation that we could obtain good precision for ice-associated seals with 8 or more flights and a spatial regression estimation procedure
- Increased number (12 or more) flights needed for polar bears
- Integral to getting additional funding (e.g. U.S. Fish & Wildlife Service & WWF for Polar Bears)
- More generally, this or a related analysis is an important step to conduct before implementing expensive population surveys

Chukchi and East Siberian Surveys (ChESS) for Bearded Seals, Ringed Seals, and Polar Bears

April – May 2016



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Acknowledgments



Further information:

Conn, P. B., E.E. Moreland, E. Regehr, E.L. Richmond, M.F. Cameron, and P. L. Boveng. 2016. Using simulation to evaluate wildlife survey designs: polar bears and seals in the Chukchi Sea. *Royal Society Open Science* 3:150561.