



# Optimizing range-wide monitoring strategy for tufted puffins



SAFS Quantitative Seminar  
November 18, 2022

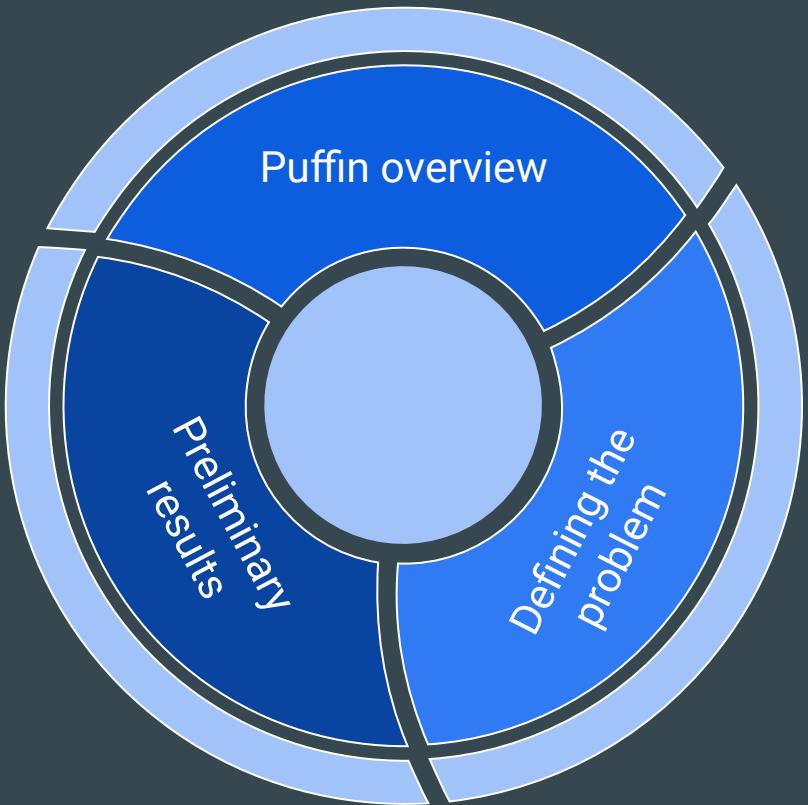


[ncascades.org](http://ncascades.org)

L.S. Petracca, B. Gardner, P. Hodum, R. Kaler, S. Pearson, H. Renner, & S.J. Converse

[aquarium.org](http://aquarium.org)

# TALK OUTLINE



Scott Pearson

# PUFFIN OVERVIEW

# Let's talk about Tufted Puffins

- Burrow-nesters
  - Burrows can be 5 feet deep!
- Live at sea most of the year
- Can start breeding at 3 yrs, are considered breeding adults by 5 yrs
- Feed largely on small fish, namely sand lance and capelin



Scott Pearson

# Let's talk about Tufted Puffins



Scott Pearson



Megan Boldenow

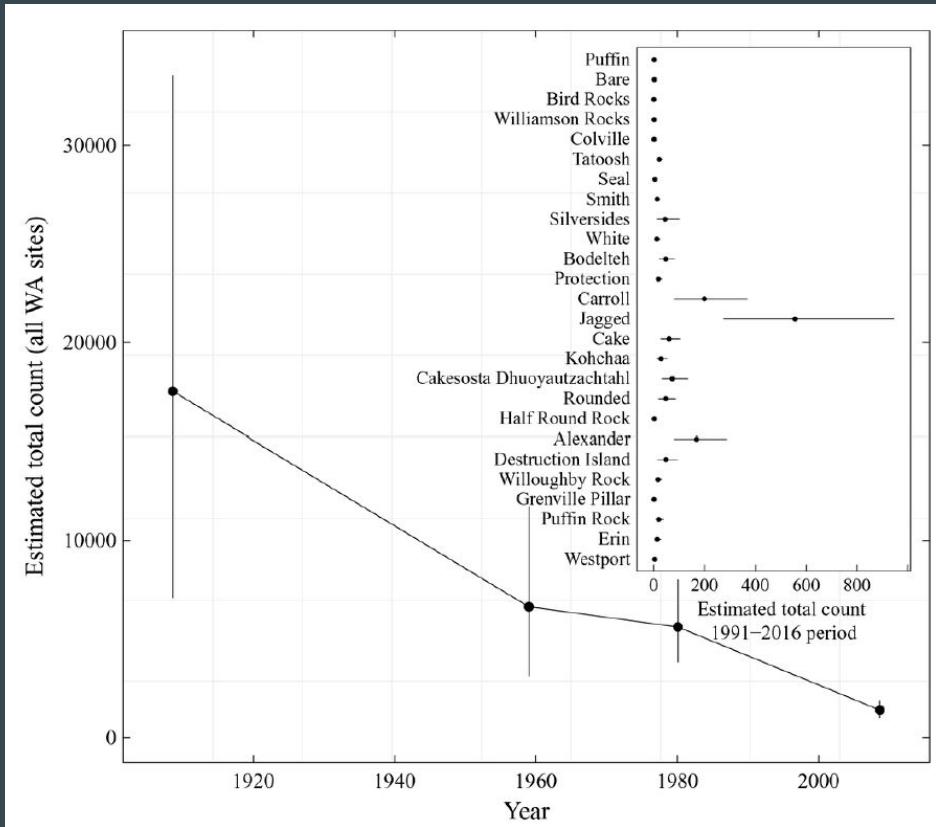


Shawn Stephensen

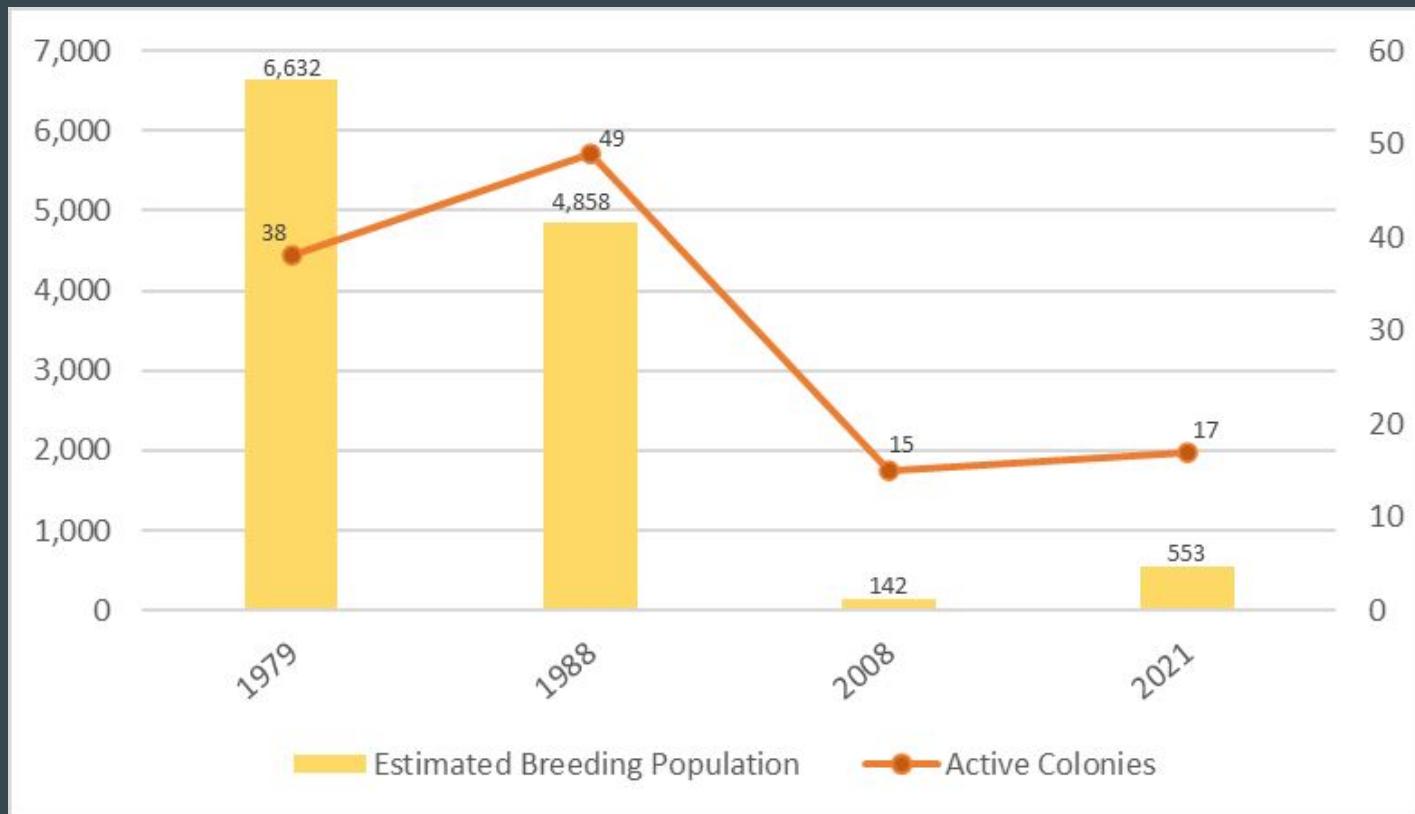


- All Seasons - Common
- All Seasons - Uncommon
- Breeding - Common
- Breeding - Uncommon
- Winter - Common
- Winter - Uncommon
- Migration - Common
- Migration - Uncommon

# Washington State



# Oregon State



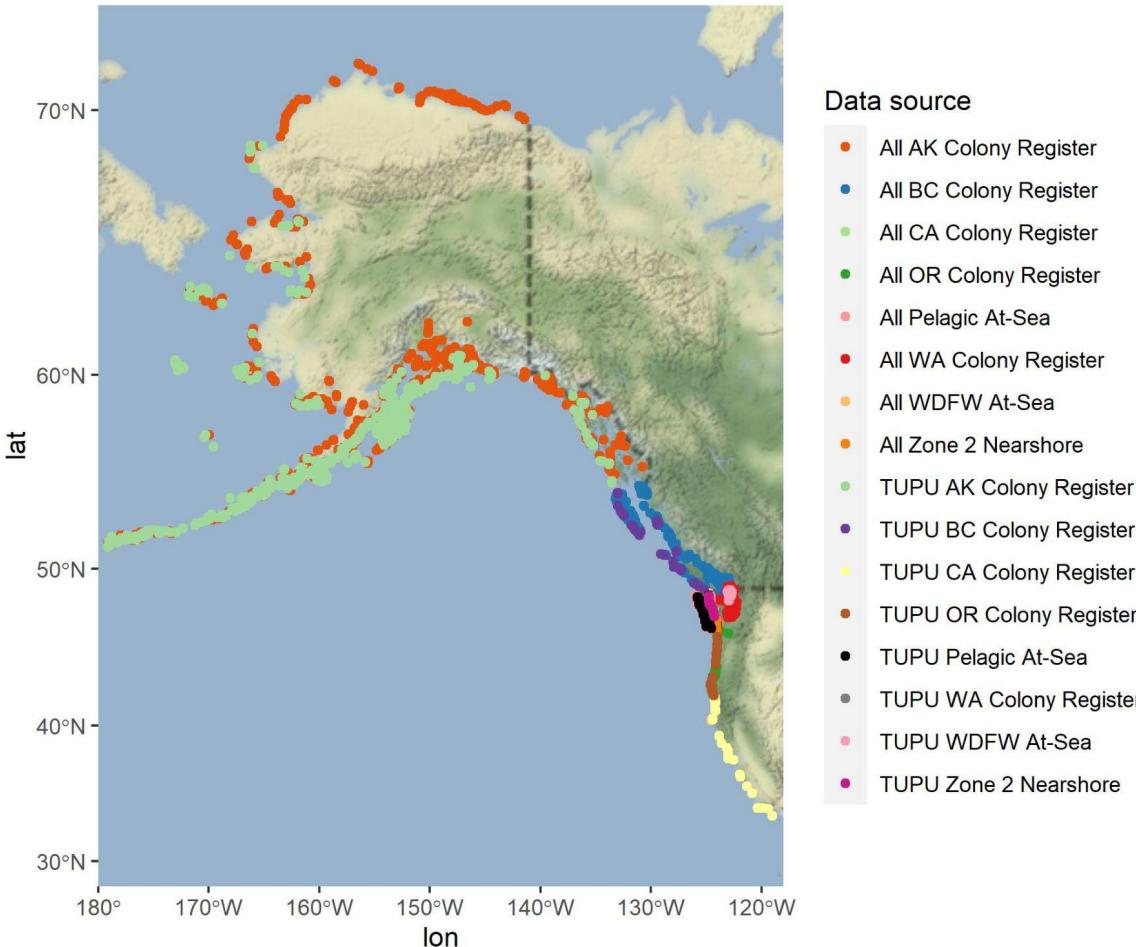
# Why is this work important?

- Burrow-nesting seabirds are notoriously difficult to monitor
- Puffin monitoring efforts are largely localized, making it hard to infer long-term, large-scale population trends
- This species is data-limited
- There is great interest from federal and state agencies

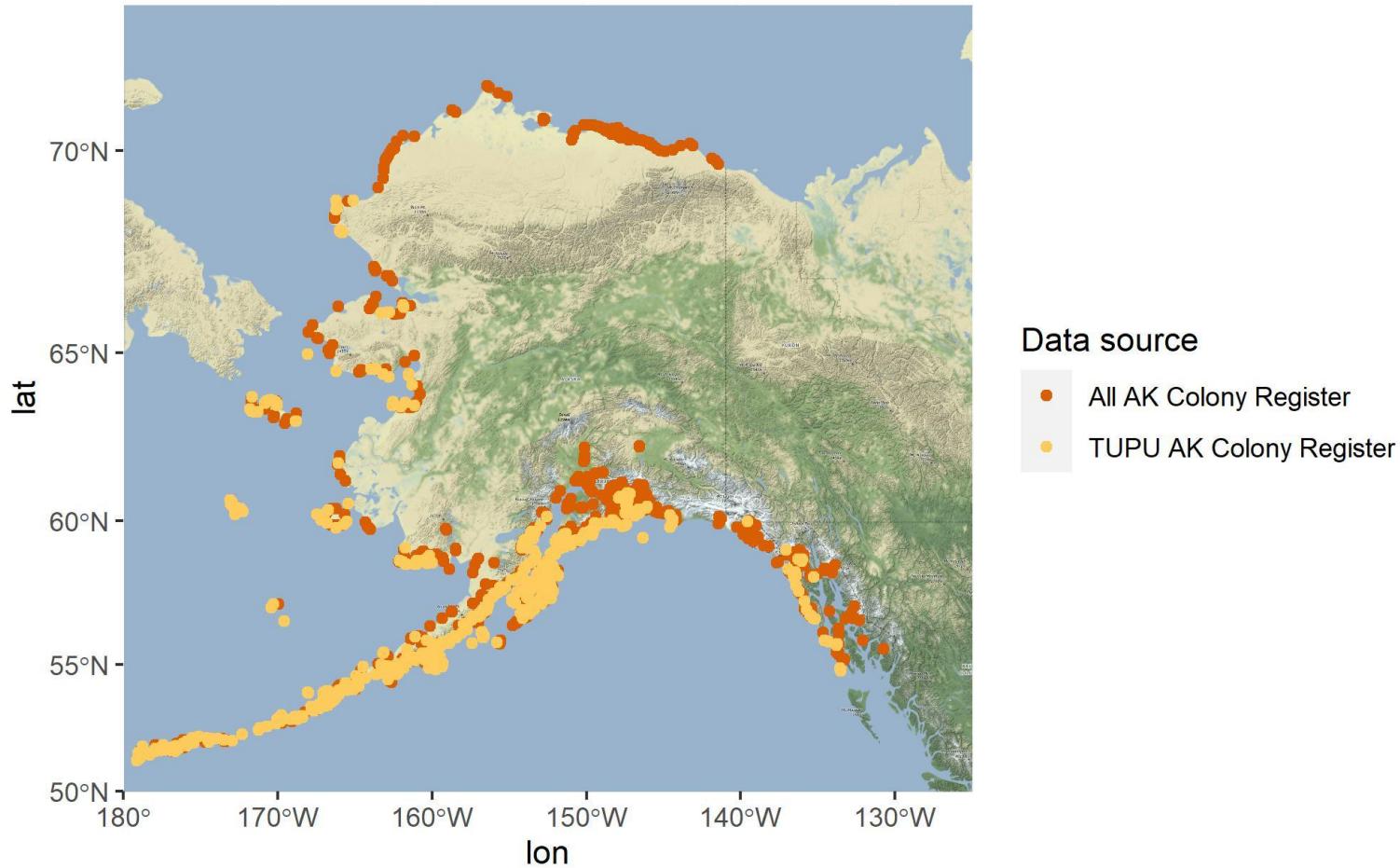


Megan Boldenow

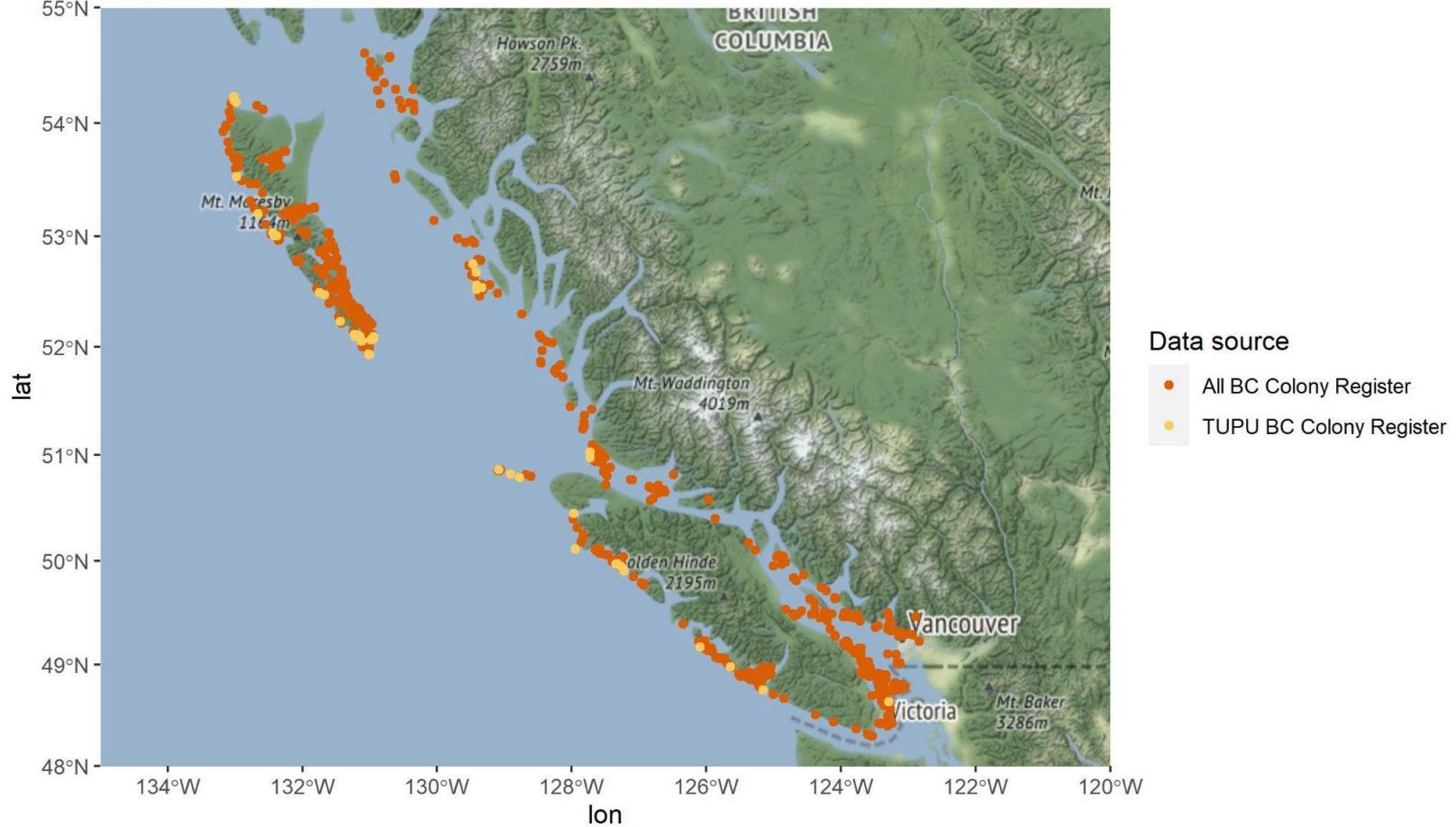
## Puffin Data Sources in AK, BC, WA, OR, and CA

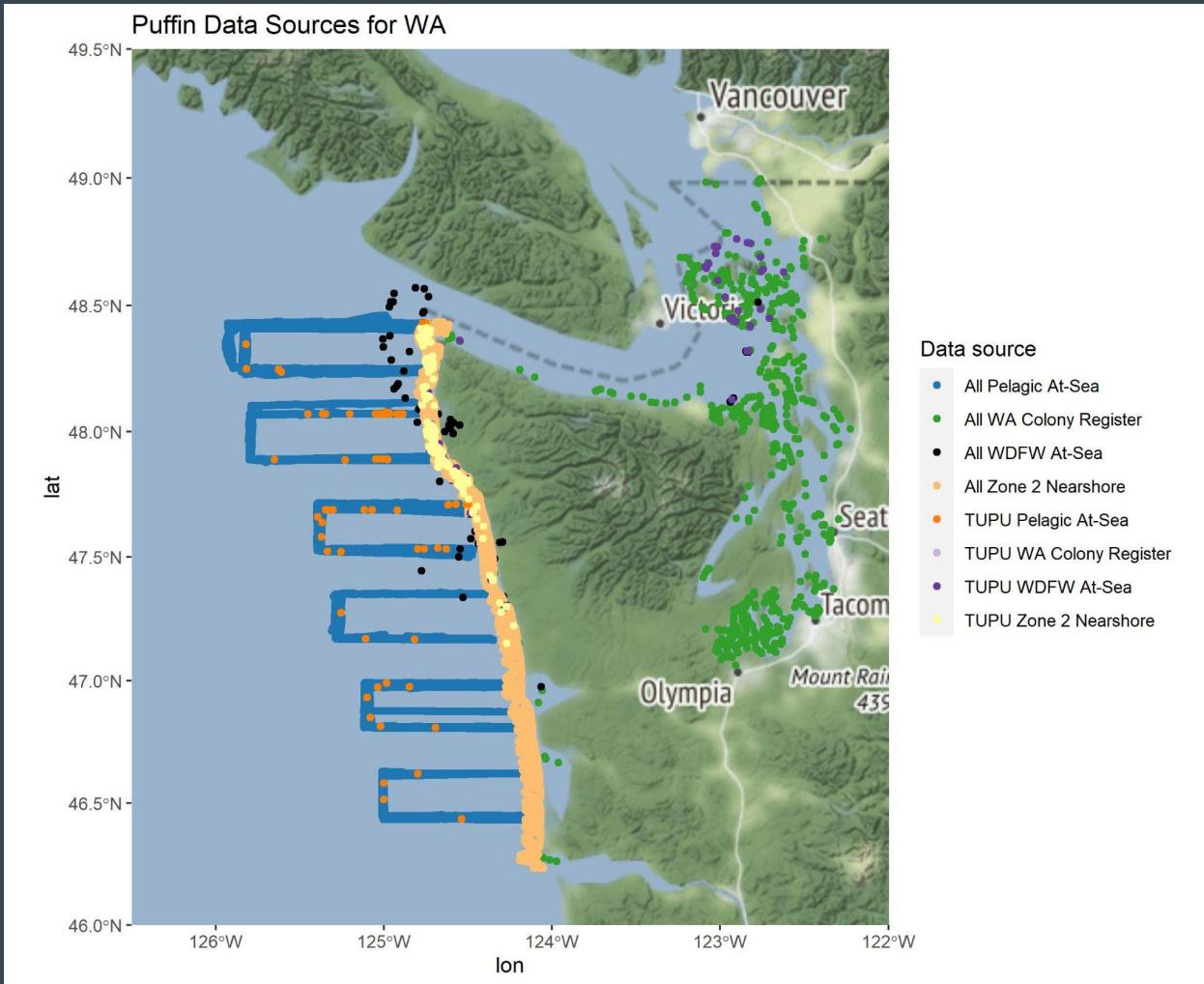


# Puffin Data Sources for AK

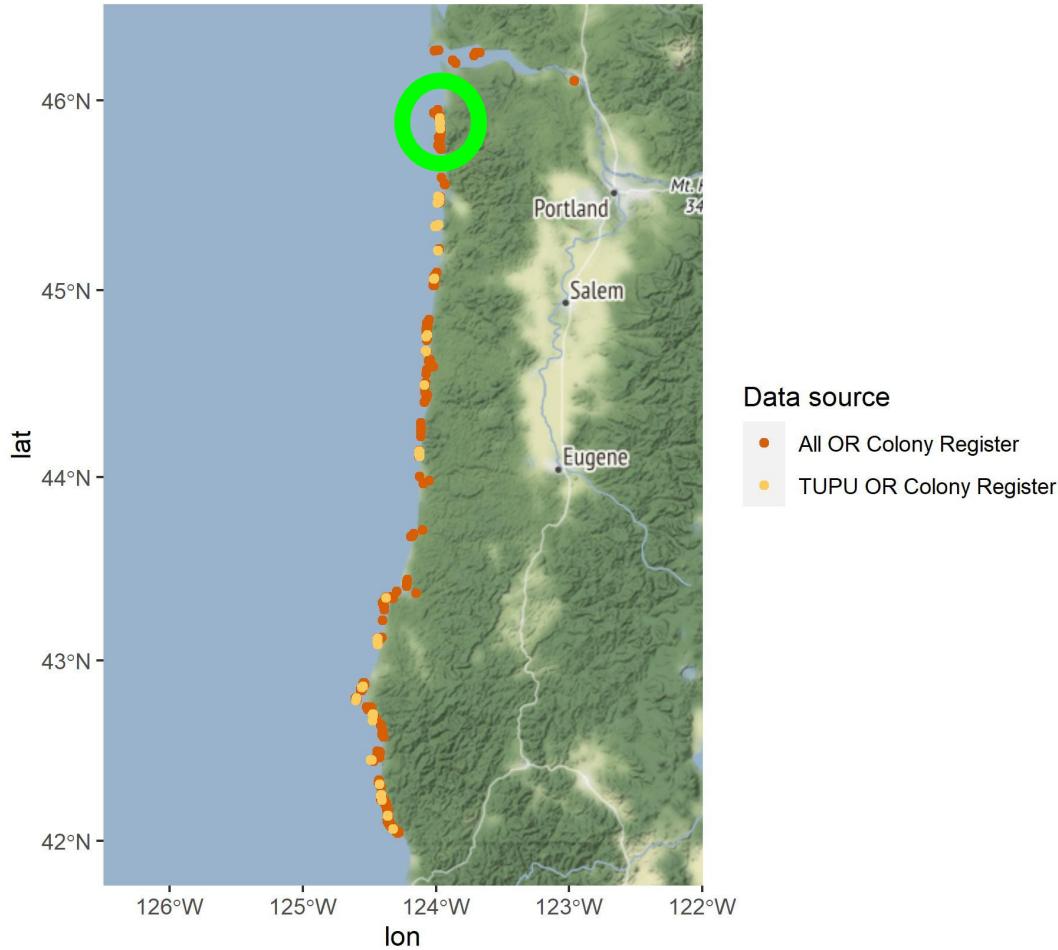


## Puffin Data Sources for BC

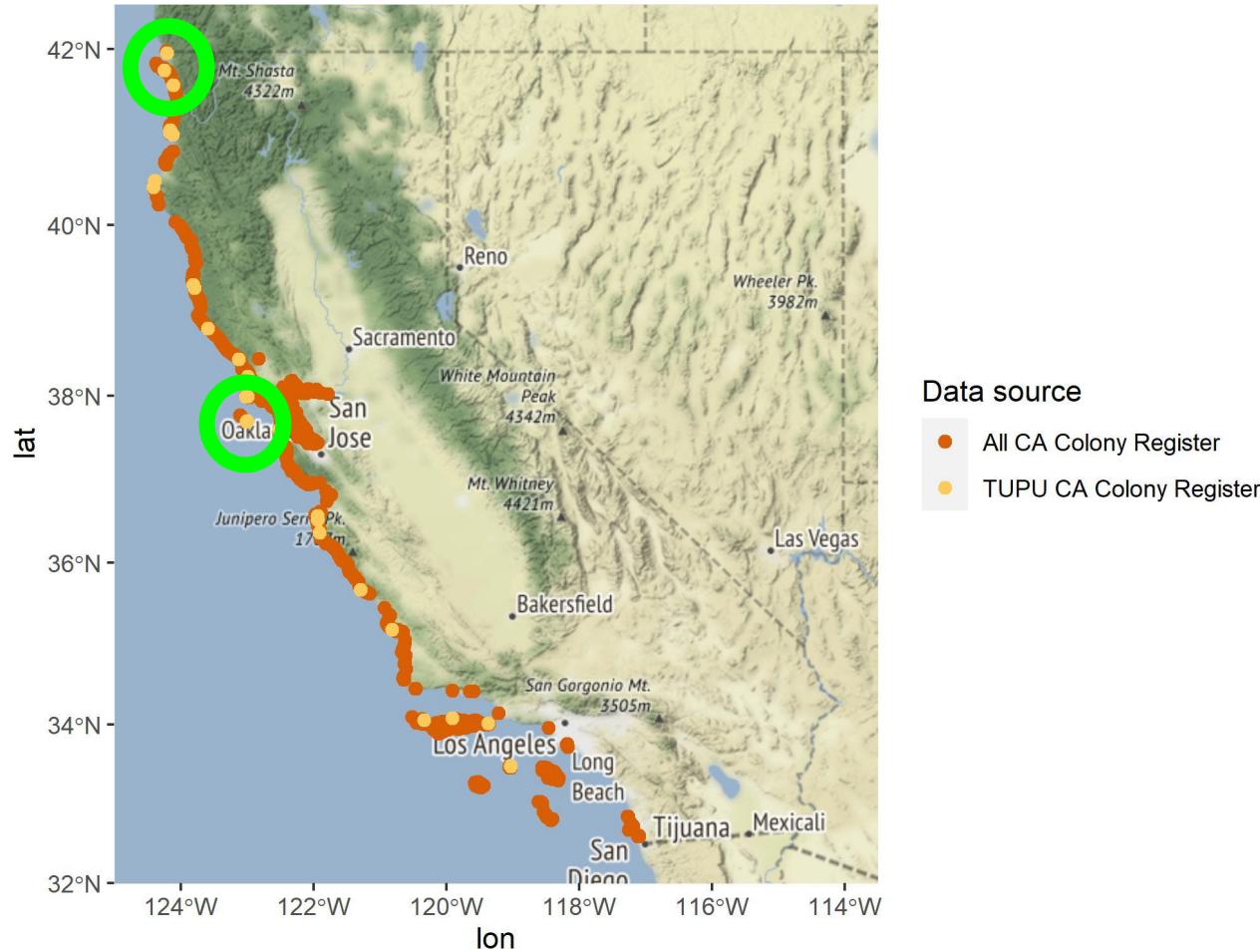




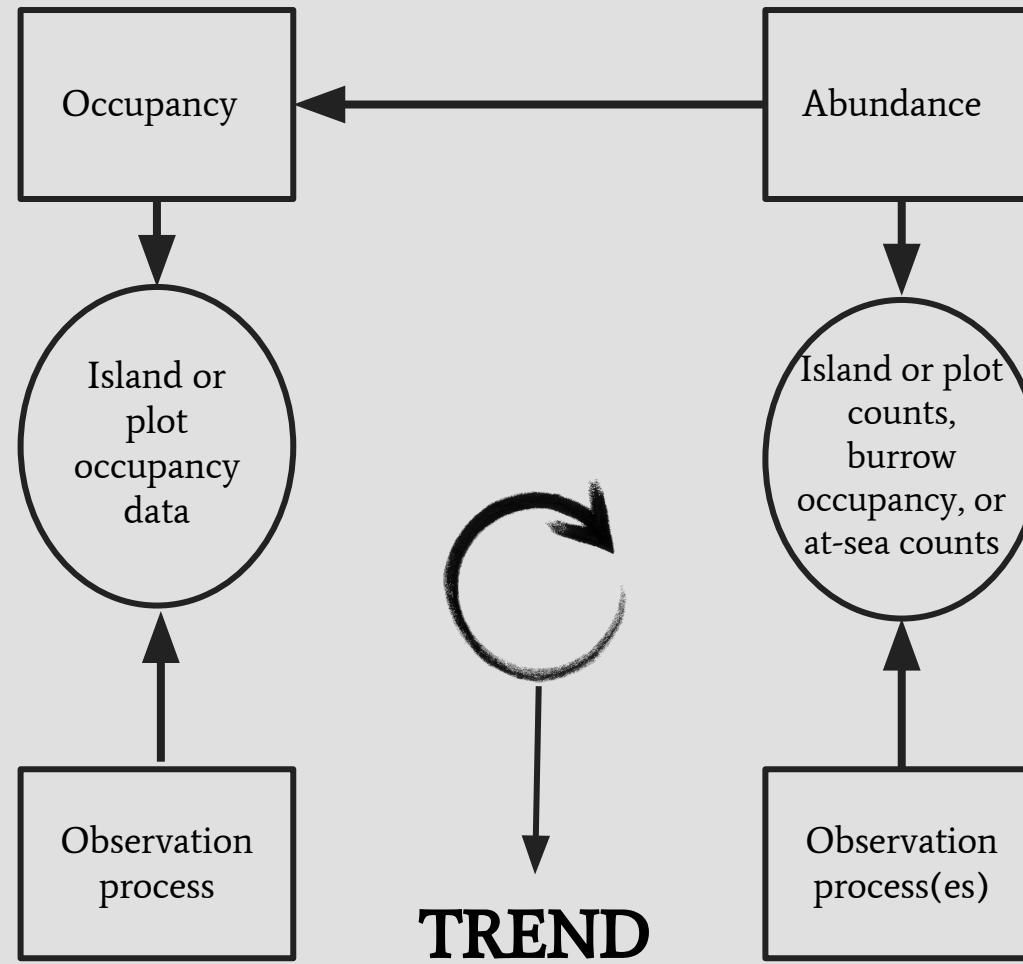
## Puffin Data Sources for OR



## Puffin Data Sources for CA



# DEFINING THE PROBLEM



# Thinking about the population model...

$$N_{juv,site,t} = N_{ad,site,t} * f_{site,t}$$

$$N_{imm,site,t} = N_{imm,site,t-1} * \psi_{i,i} * S + N_{juv,site,t-1} * S$$

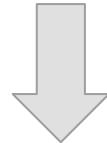
$$N_{ad,site,t} = N_{imm,site,t-1} * (1 - \psi_{i,i}) * S + N_{ad,site,t-1} * S$$

# Thinking about the population model...

$$N_{juv,site,t} = N_{ad,site,t} * f_{site,t}$$

$$N_{imm,site,t} = N_{imm,site,t-1} * \psi_{i,i} * S + N_{juv,site,t-1} * S$$

$$N_{ad,site,t} = N_{imm,site,t-1} * (1 - \psi_{i,i}) * S + N_{ad,site,t-1} * S$$



$$N_{site,t} = N_{site,t-1} * \lambda_{site,t}$$

# Apparent survival

- Morrison et al. (2011)
  - Triangle Island, BC
  - 96 banded TUPU, mostly 5-*yo+* breeding adults; annual survival of females  $0.96 +/- 0.05$ ; males  $0.91 +/- 0.06$
- Morrison et al. (2009)
  - Triangle Island, BC
  - 133 banded TUPU fledglings; proportion resighted over a 6-yr period
- Vodolazova et al. (2021)
  - Russia
  - 44 marked TUPU, return rates

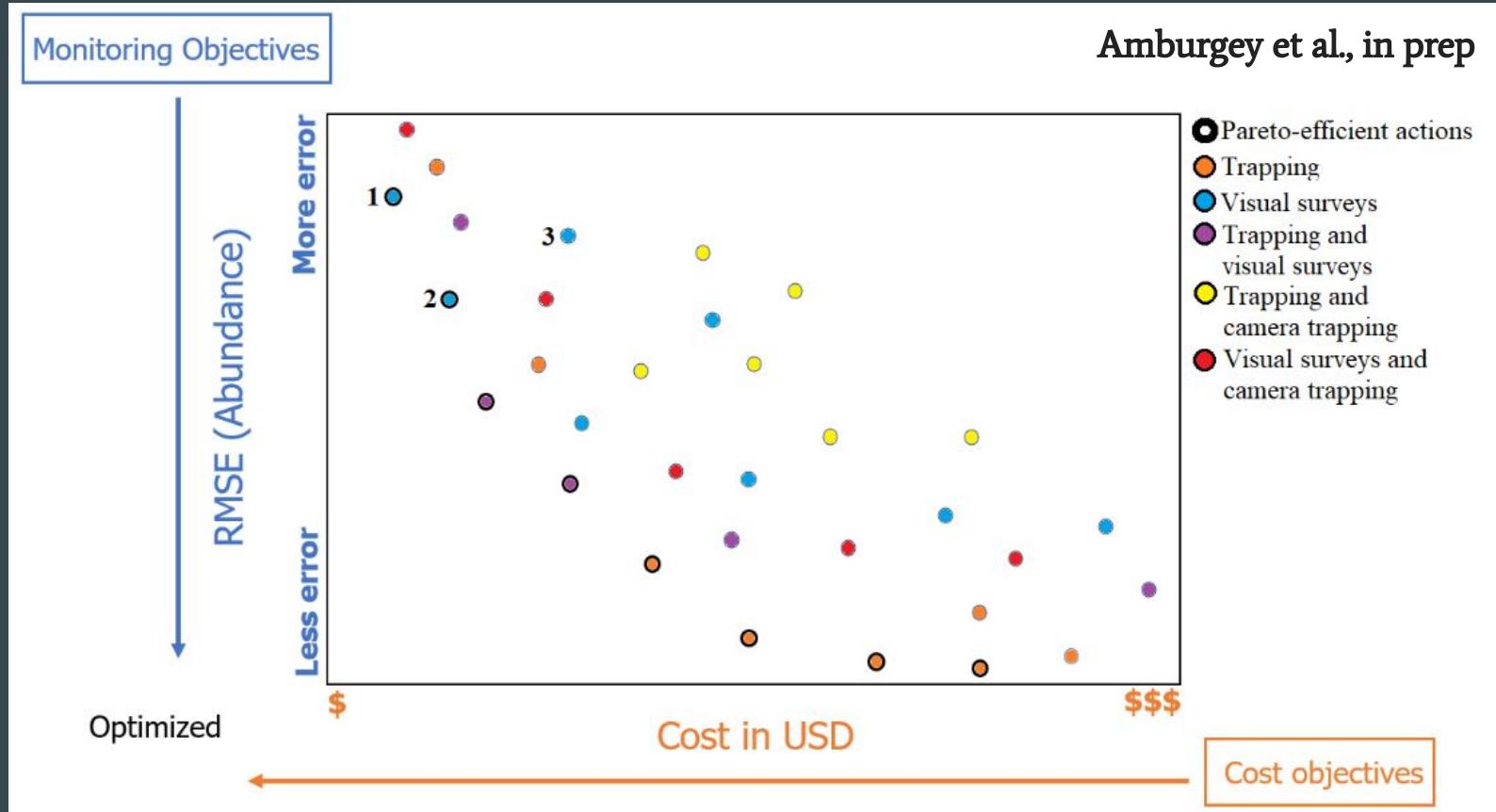
# What is current project goal?

- Identify and evaluate possible range-wide monitoring strategies based on performance and cost



[audubon.org](http://audubon.org)

# Optimality & making complex decisions



# What are work plan steps?

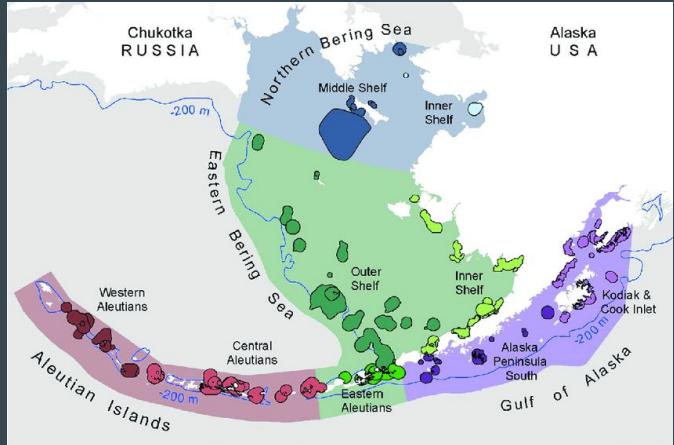
- Define state space and temporal space
- Define monitoring objectives
- Identify monitoring alternatives
- Simulate data from monitoring alternatives and evaluate statistical performance
- Develop cost model and estimate cost of alternatives
- Present tradeoffs for discussion given performance and cost



Seattle Aquarium

# Define state space and temporal space

- Allowing inference across five LMEs:
  - California Current
  - Gulf of Alaska
  - Bering Sea – Aleutian Islands
  - East Bering Sea
  - North Bering - Chukchi Seas
- Annual plan for foreseeable future?



# Define monitoring objectives



American Bird Conservancy

- Maximize the probability of correctly identifying trend in abundance
- Minimize cost
- Minimize disturbance of monitoring activities

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
# burrows?				
# occupied burrows?				
# indiv at colony?				

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
	Random sample  Stratified sample  Adaptive sampling  Maintain existing sites			

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
		Presence / absence  Repeat boat-based  Circular plots  Permanent plots  Line transect surveys  At-sea surveys  Time-lapse photos		

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
			Number of sites Number of surveys Length of surveys Number of observers	

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
				GLM  Integrated occupancy/abundance  Occupancy  Abundance  Reproductive success

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
# burrows?	Random sample	Presence / absence	Number of sites	GLM
# occupied burrows?	Stratified sample	Repeat boat-based	Number of surveys	Integrated occupancy/abundance
# indiv at colony?	Adaptive sampling	Circular plots	Length of surveys	Occupancy
	Maintain existing sites	Permanent plots	Number of observers	Abundance
		Line transect surveys		Reproductive success
		At-sea surveys		
		Time-lapse photos		

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
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# occupied burrows?	Stratified sample	Repeat boat-based	Number of surveys	Integrated occupancy/abundance
# indiv at colony?	Adaptive sampling Maintain existing sites	<b>Circular plots</b> Permanent plots Line transect surveys At-sea surveys Time-lapse photos	Length of surveys Number of observers	Occupancy Abundance Reproductive success

# Develop cost model and estimate cost of alternatives



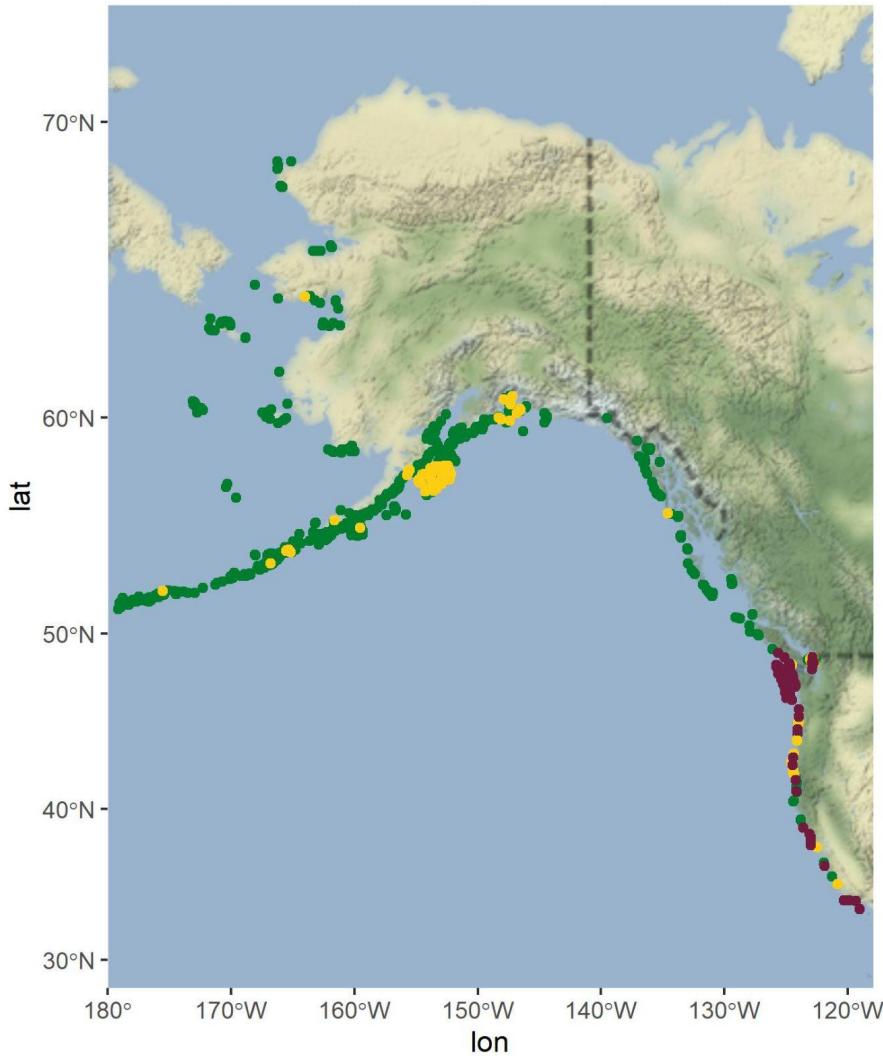
The Atlantic

- More intensive monitoring comes at a cost
  - Will need to collect cost data for various strategies

# Identify Monitoring Alternatives (e.g., by LME)

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
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# occupied burrows?	Stratified sample	<b>Repeat boat-based</b> <b>Circular plots</b>	Number of surveys	Integrated occupancy/abundance
# indiv at colony?	Adaptive sampling	<b>Permanent plots</b>	Length of surveys	Occupancy
	Maintain existing sites	<b>Line transect surveys</b> <b>At-sea surveys</b> <b>Time-lapse photos</b>	Number of observers	Abundance Reproductive success

We were also interested in how TUPU data  
varied across time



Last year of TUPU record

- pre-1900
- pre-1950
- 1950-2000
- 2001-2010
- 2011-present

# Presence/absence surveys



Shawn Stephensen

- Boat-based

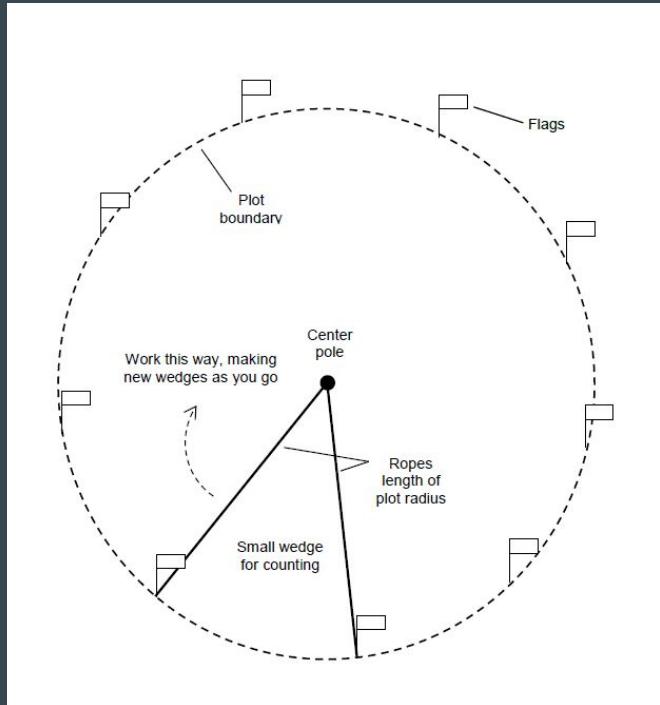
# Repeat boat-based counts

- Repeat visits by boat spaced one week or so apart
- Birds counted on land, water, and in air



Scott Pearson

# Random circular plots



AMNWR Protocol 13, V 1.5

- 2.5-m radius circular plots placed randomly and (ideally) stratified by habitat quality



Lisanne Petracca

# At-sea surveys

- Birds systematically counted away from colony



# 1-m<sup>2</sup> quadrats along linear transects



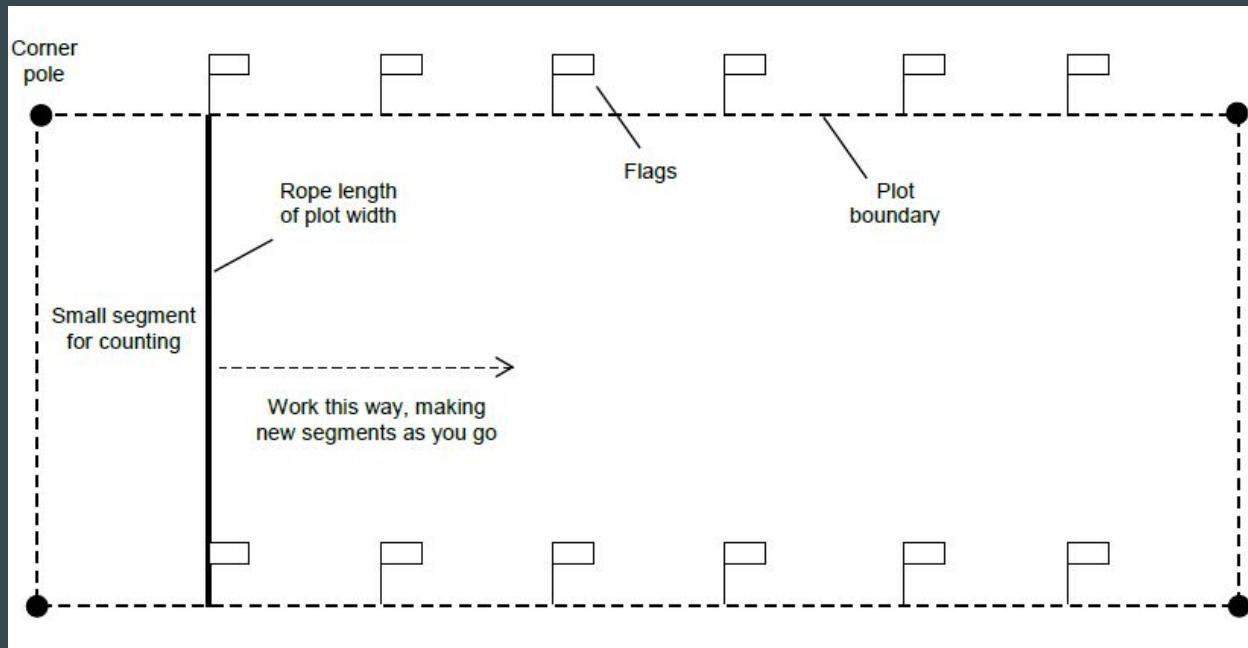
- 100-m transect in which 1-m<sup>2</sup> quadrats are assessed every 5 m

Josh Adams

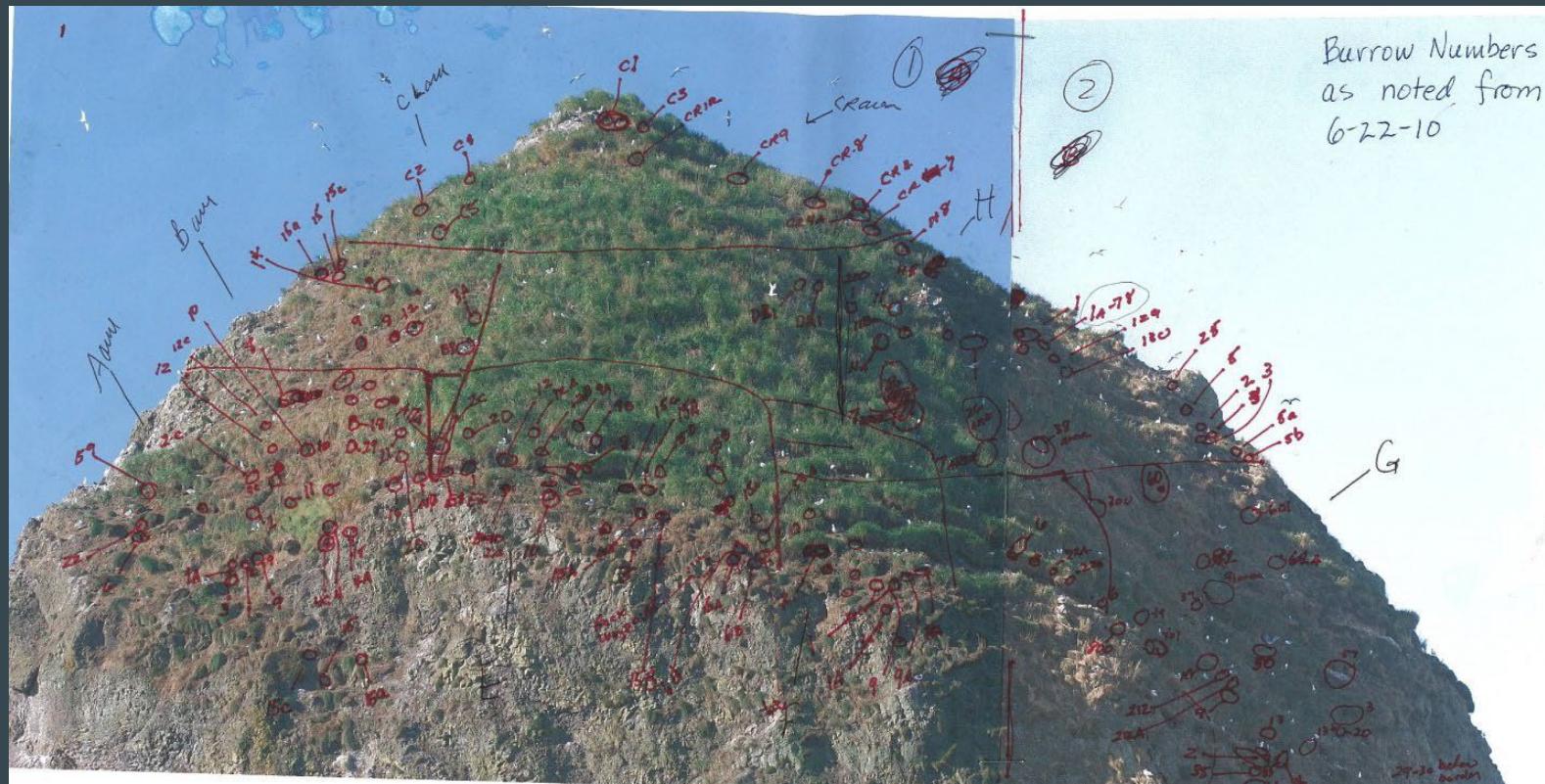


# Permanent plots

- These plots are circular or rectangular
- Are of various sizes (100 - 300+ m<sup>2</sup>)



# Time-lapse-photography counts of birds attending the colony



Shawn Stephensen

# Can be a “mix and match” strategy

What metric of abundance?	Site Selection (choose one)	Sampling Method (choose 1 or more)	Sampling Intensity (choose 1 or more)	Data analysis (choose 1 or more)
# burrows?	Random sample	<b>Presence / absence</b>	Number of sites	GLM
# occupied burrows?	Stratified sample	<b>Repeat boat-based</b> <b>Circular plots</b>	Number of surveys	Integrated occupancy/abundance
# indiv at colony?	Adaptive sampling	<b>Permanent plots</b>	Length of surveys	Occupancy
	Maintain existing sites	<b>Line transect surveys</b> <b>At-sea surveys</b> <b>Time-lapse photos</b>	Number of observers	Abundance Reproductive success

# Work plan steps



Scott Pearson

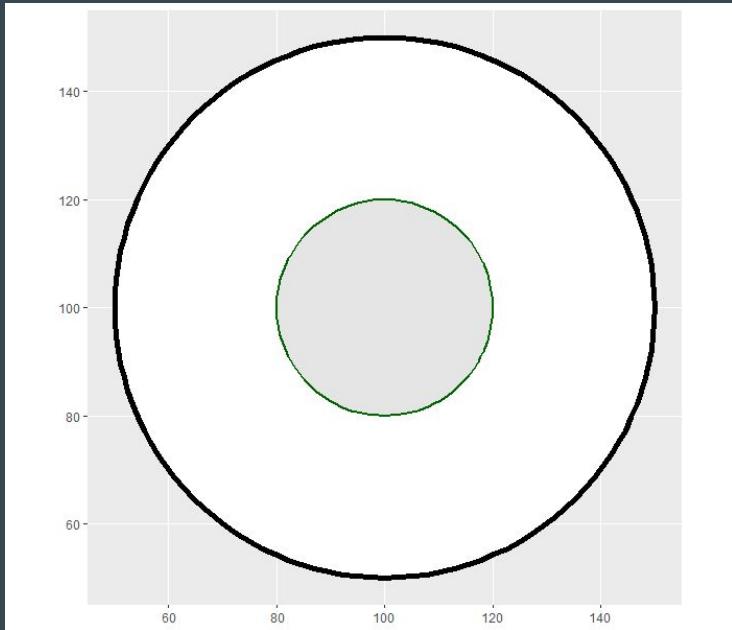
- Simulate
  - P/A surveys
  - repeat boat-based surveys
  - 2.5-m radius circle plots
  - permanent plots
  - 1-m<sup>2</sup> quadrats
  - time-lapse photos
- To what extent do different strategies correctly identify trends in abundance?
- Collect information for cost model
  - Maximize power to detect trend with minimized cost

# PRELIMINARY RESULTS

# Identify Monitoring Alternatives (e.g., by LME)

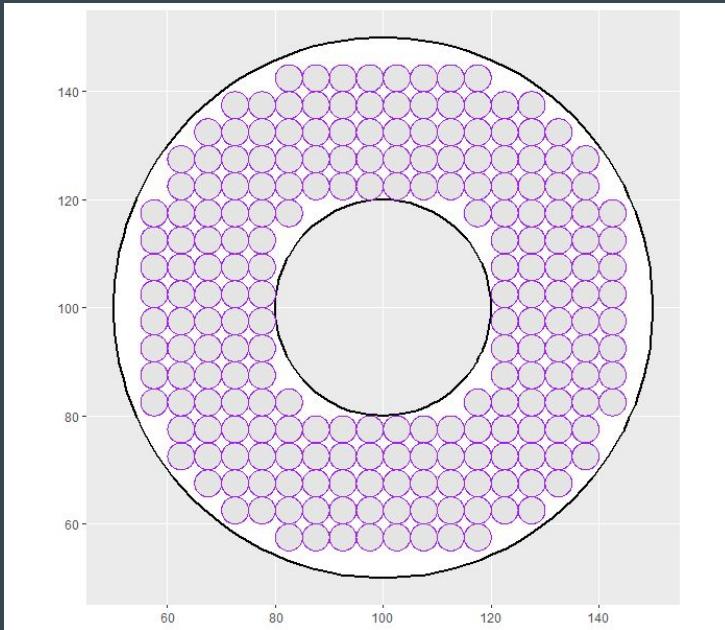
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# Simulating 2.5-m circular plots



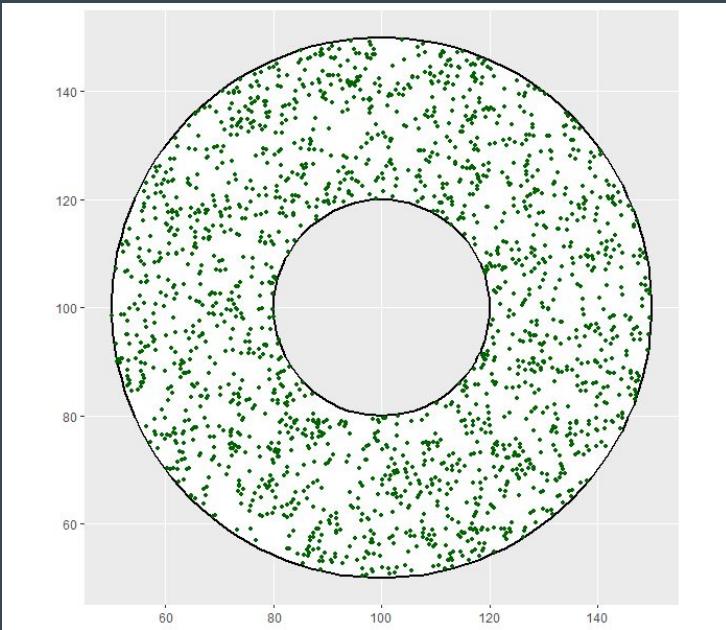
- Here we have a single hypothetical colony
  - Real size approximates Aiktak Island, an island of  $\sim 1.5 \text{ km}^2$  with  $>100\text{K}$  puffins
- Assigned outer 30 m “suitable” habitat

# Simulating 2.5-m circular plots



- Created 2.5-m circular plots in suitable habitat

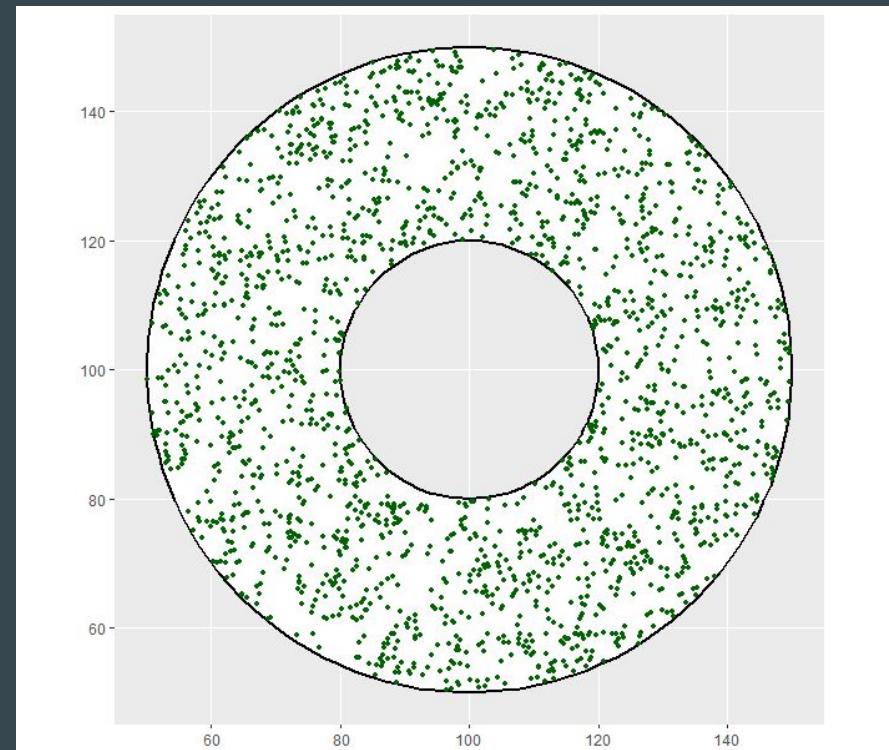
# Simulating 2.5-m circular plots



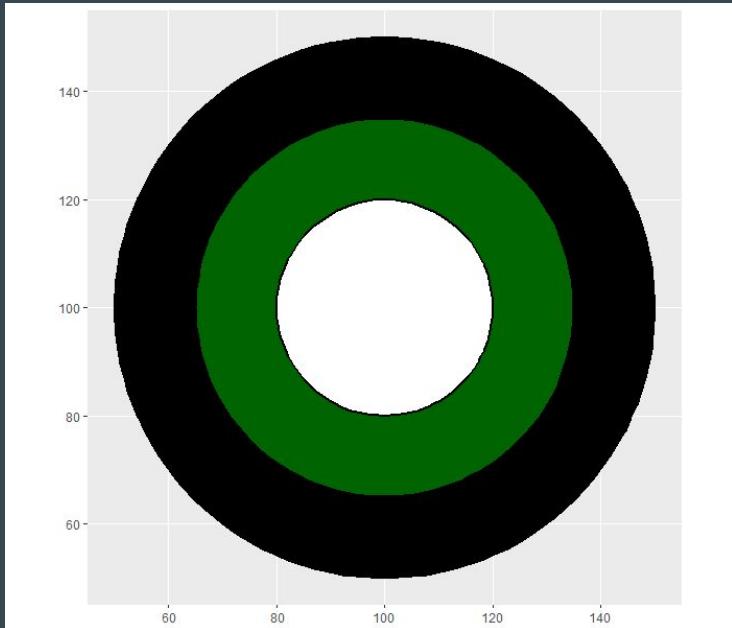
- Created clustered point processes of burrows that matched mean and max # burrows per plot

# What on earth is a clustered point process?

- A Poisson point process is a collection of mathematical points randomly located in mathematical space
- In a *cluster* point process, randomly located points tend to form random clusters
- To simulate one, you provide values for
  - Intensity of the Poisson process for cluster centers
  - Mean number of points per cluster
  - Standard deviation of random displacement of a point from its cluster center



# Simulating 2.5-m circular plots



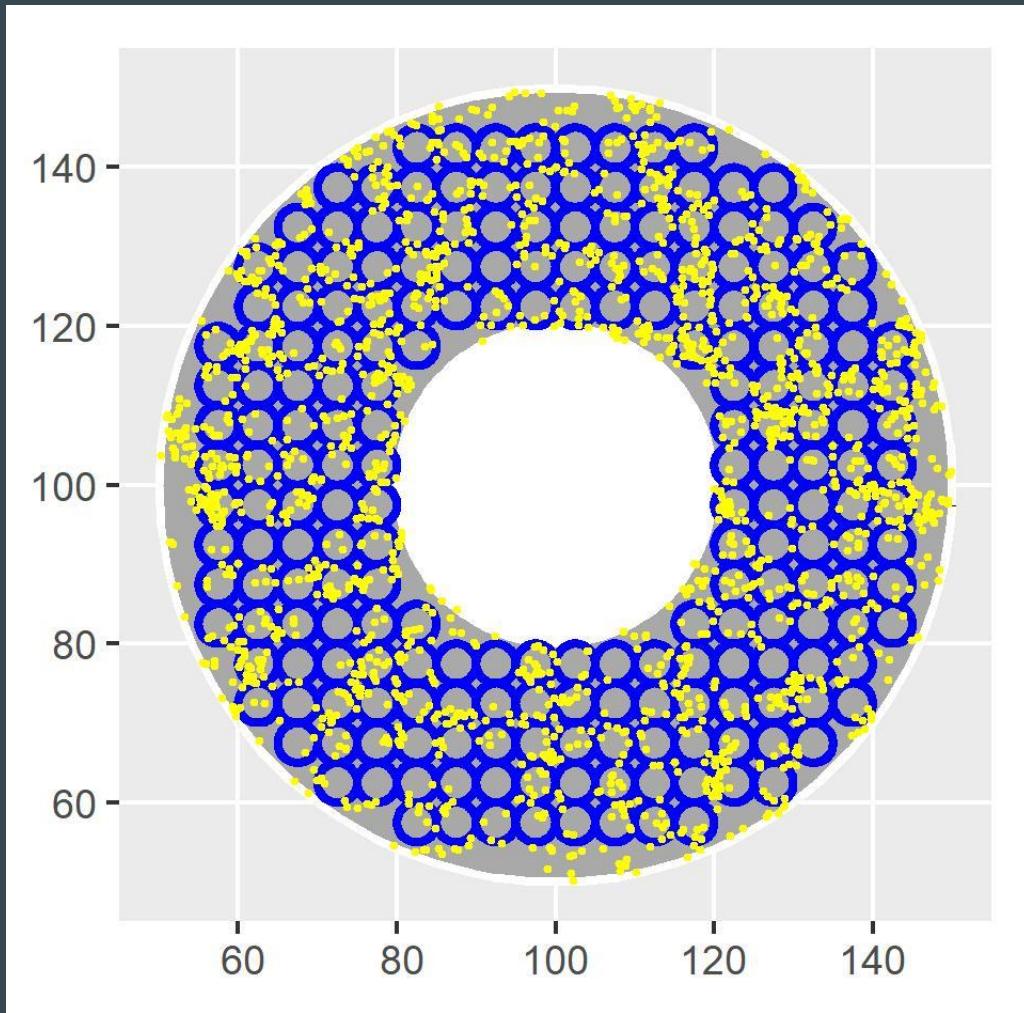
- Assigned outer 15-m buffer as habitat that is not able to be surveyed bc on cliff face

# Simulation steps: single point in time

- Created 100 point processes that best represented observations
- Then ran 100 simulations on each point process that varied
  - Number of plots visited (50, 100, 250, 500, 1000)
- Assessed how well different number of plots visited captured true burrow density



Lisanne Petracca



# Estimation of burrow abundance

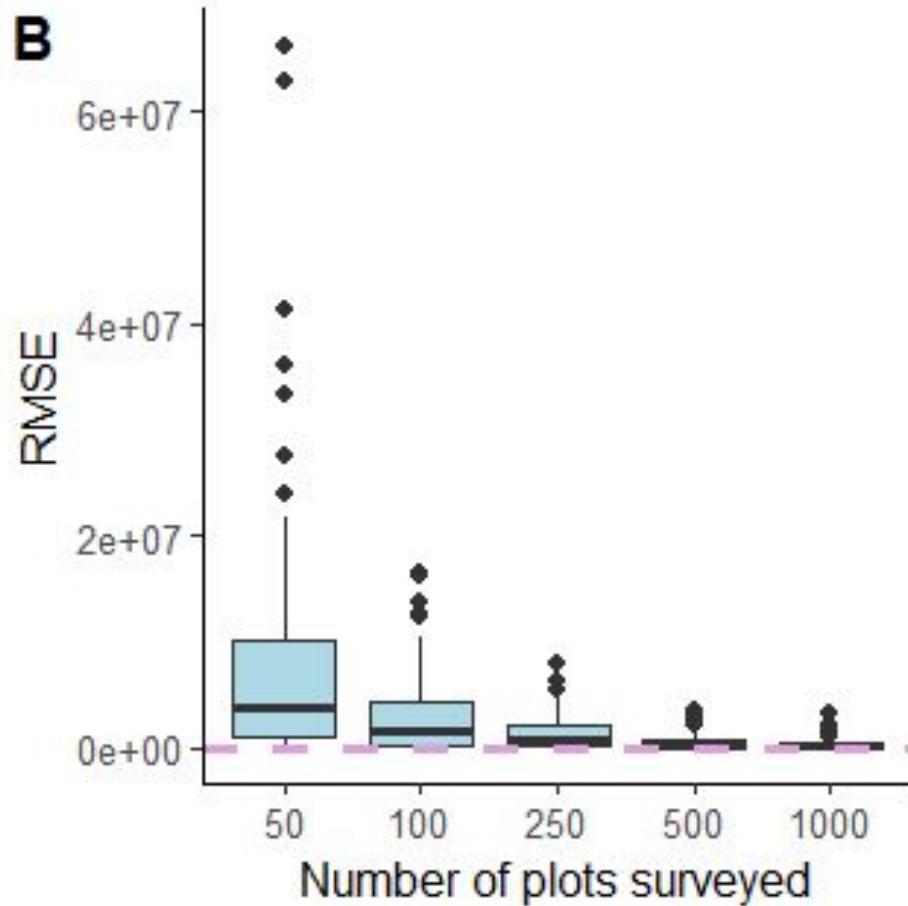
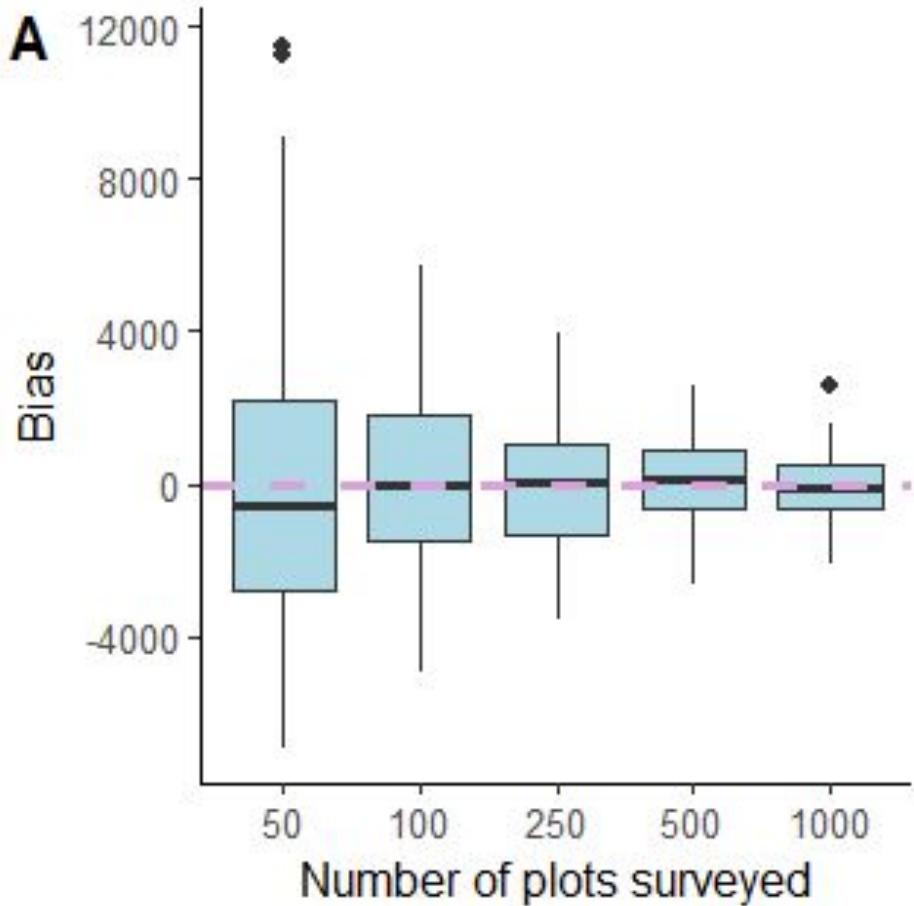
$$N_{\text{burrows per plot}} \sim \text{negbin}(\mu, \theta)$$

$$M = \frac{\text{area}_{\text{total}}}{\text{area}_{\text{plot}}}$$

$$\widehat{N} = M\bar{\mu}$$

$$s^2 = \bar{\mu} + \frac{\bar{\mu}^2}{\theta}$$

$$\widehat{\text{var}}\widehat{N} = M^2 \frac{s^2}{m} \left(1 - \frac{m}{M}\right)$$

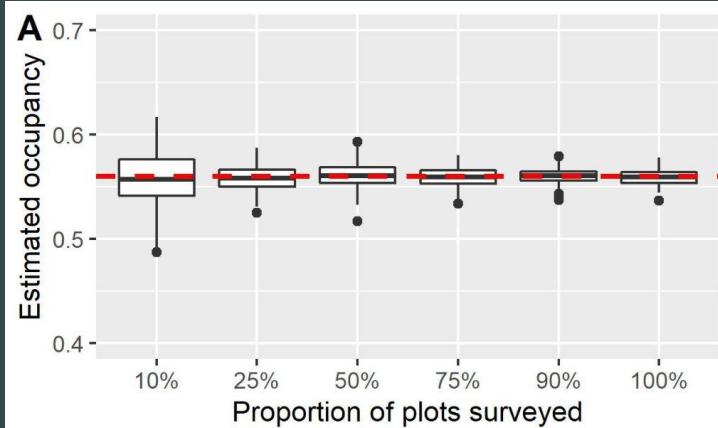


# Estimation model for occupancy

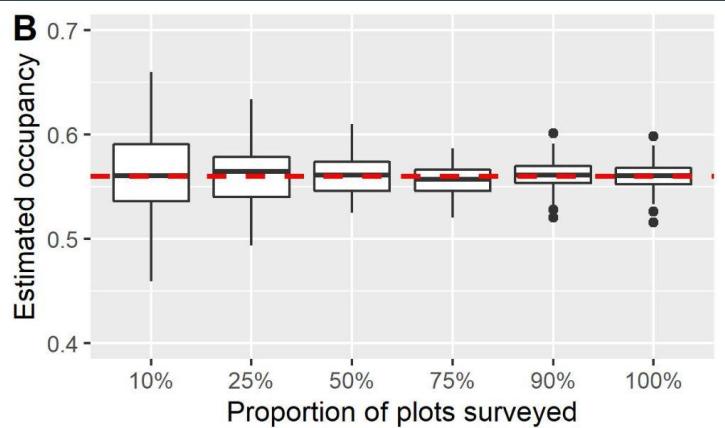
$$\psi_{\text{burrow}} \sim \text{bern}(0.56)$$

All of colony surveyable

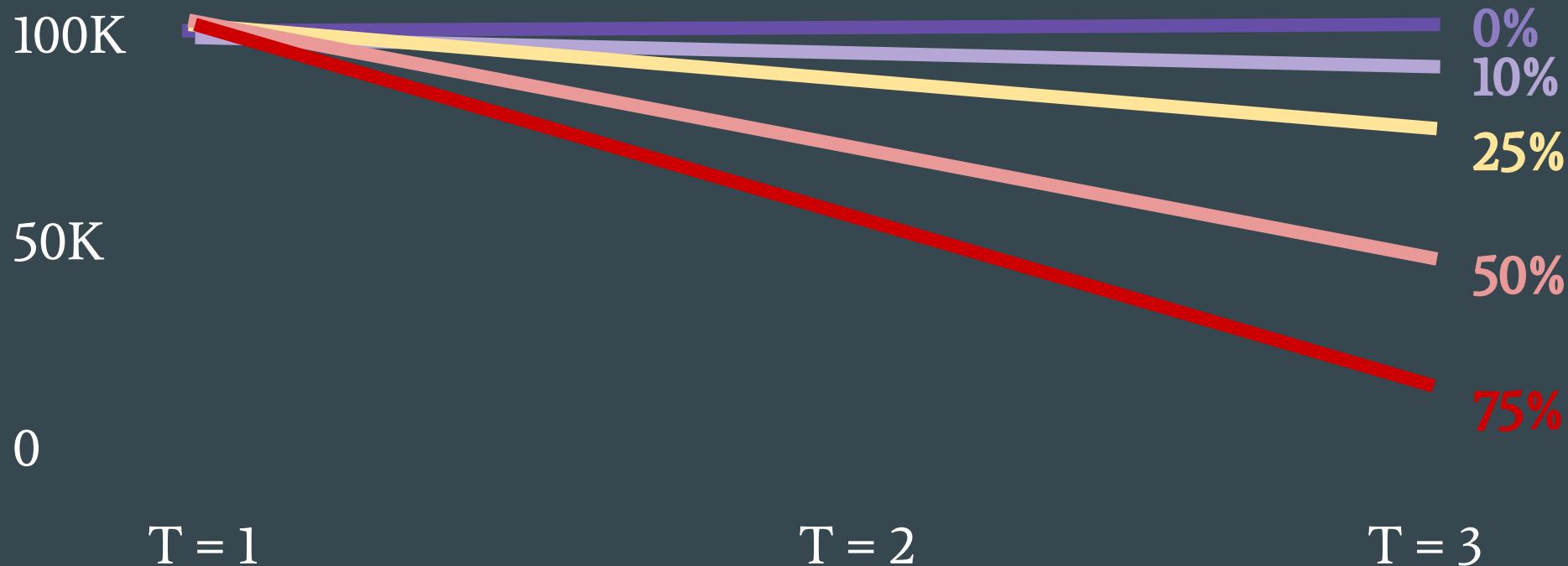
One burrow  
visited



Not all of colony surveyable



# Simulation steps: trend detection

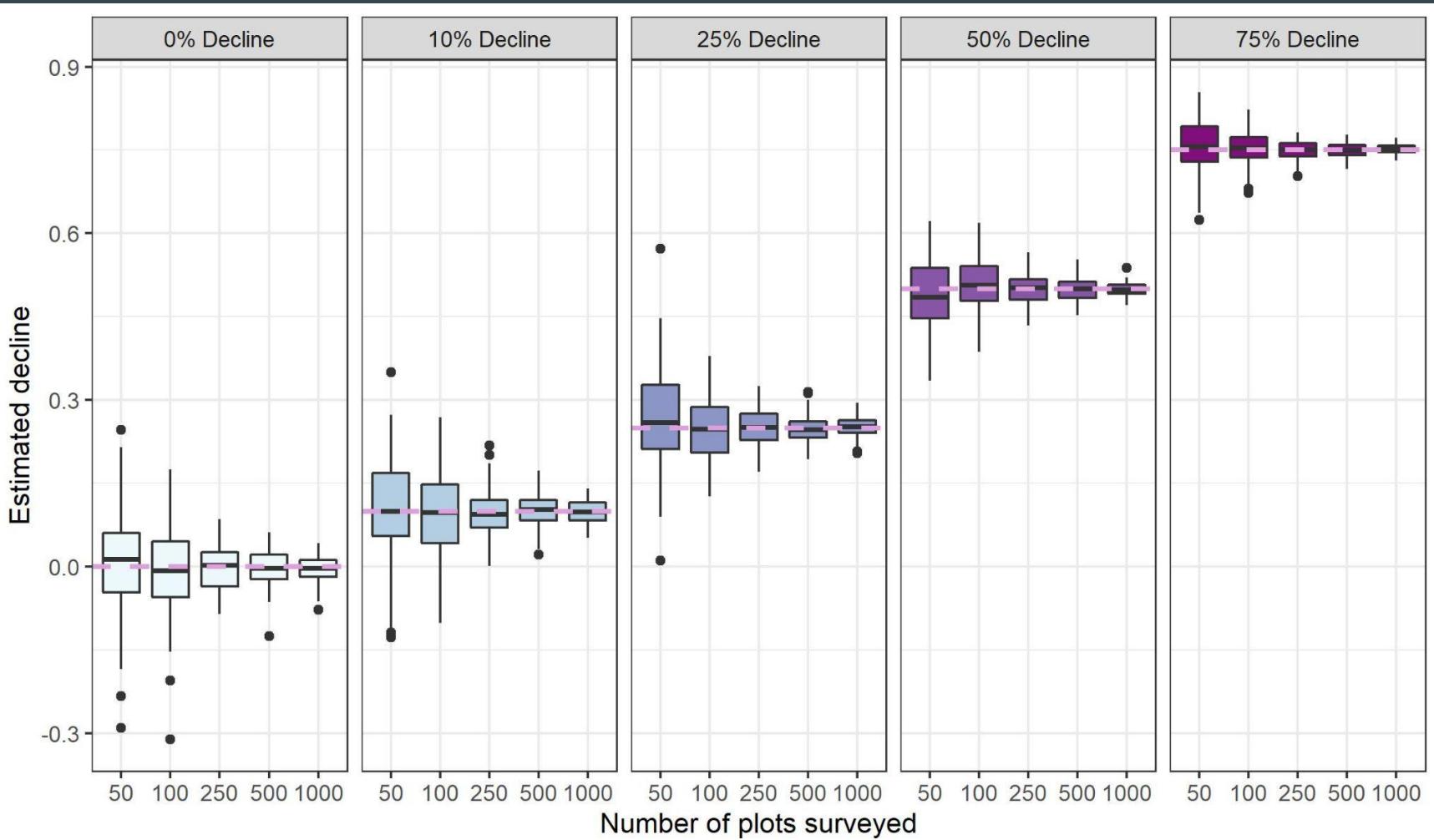


# Simulation steps: trend detection

- Created 100 point processes that best represented observations
- Thinned the point processes over two time periods such that by time period 3 there was
  - No change
  - Decreases of 10%, 25%, 50%, 75%
- Then ran 100 simulations on each point process that varied
  - Trend scenario
  - Number of plots visited (50, 100, 250, 500, 1000)
- Assessed how well “true” population trend was identified at period 3

# Estimation model for trend detection

$$\lambda = \frac{N_{t1} - N_{t3}}{N_{t1}}$$



# (Very) preliminary conclusions/thoughts

- More intensive surveying → less estimation error
- This is a simulation on one island and with a clear trend
  - Increased complexity will muddy the waters
- Will likely build in autocorrelation component



Megan Boldenow

# Outstanding thoughts

- What is the role of at-sea monitoring in TUPU strategy?
- Need to incorporate detection probability
- Assessing habitat a priori
  - Drones?
  - Remote sensing?
  - Circumnavigation surveys? Or on foot in spring?
  - 3D rendering of surface from photographs?
- Do we allow new colonies to form?



Dave Kutilek

# Thank you.



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