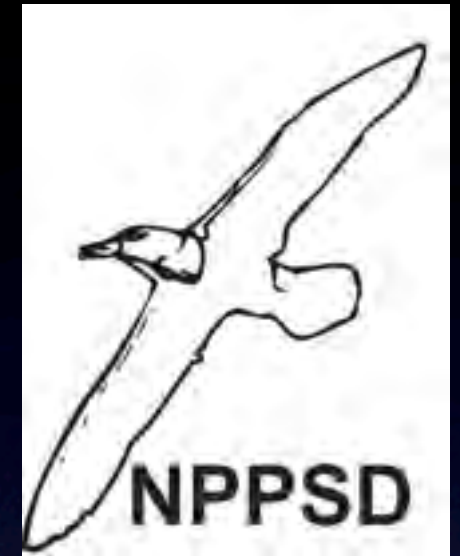


Why?  
Why not?  
How after all?

Merging marine tracking and survey data

Martin Renner

# Thanks!



- Rosana Paredes, Rob Suryan
- Kathy Kuletz, George Hunt, John Piatt, Gary Drew
- PICES



# My biases

- seabirds
- ship surveys
- spatial-temporal models of distribution and abundance





What do I want?

# What do I want?

- distribution



# What do I want?

- distribution
- distribution of **density**

# What do I want?

- distribution
- distribution of **density**
- **predict** density (past or future), rather than what we saw in instance  $X$  at 300m x 3km location  $Y$ .



Why?

# Why?

- Both positional data, providing distributional information

# Why?

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- Locations for presence-only habitat model



# Why?

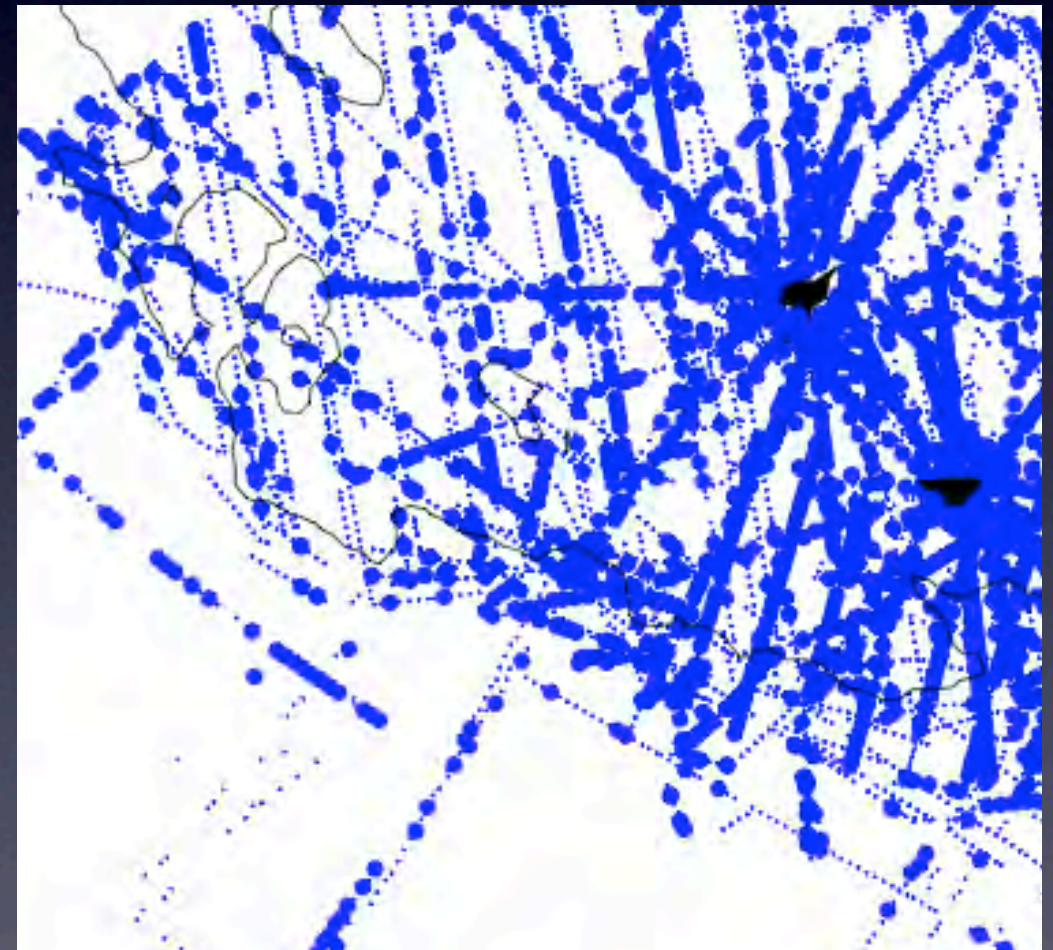
- Both positional data, providing distributional information
- Locations for presence-only habitat model
- Both can provide densities. Right?

# Two sources of locations

BLKI GPS track



BLKI survey locations





presence-only	distribution (I/), seasonality	✓
presence-absence	p (occurrence)	?
density	density surface	??



Why not?

# Why not?

- P/A: easy; but **density**?

# Why not?

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- Different mechanisms => different analysis



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- P/A: easy; but **density**?
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- Non-breeders missing

# Why not?

- P/A: easy; but **density**?
- Different mechanisms => different analysis
- Non-breeders missing
- Is sampling representative?

# Two sources of locations



# Two sources of locations

BLKI GPS track

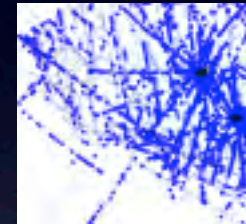
BLKI survey locations

# Two sources of locations

BLKI GPS track



BLKI survey locations

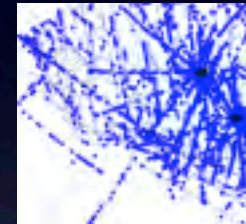


# Two sources of locations

BLKI GPS track



BLKI survey locations



kernel-density

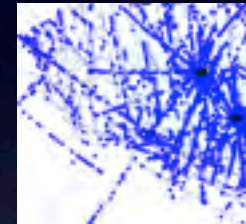


# Two sources of locations

BLKI GPS track



BLKI survey locations



kernel-density

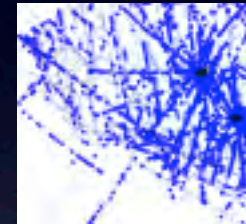
additional steps

# Two sources of locations

BLKI GPS track



BLKI survey locations



kernel-density

additional steps

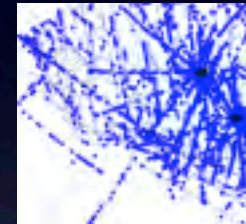
=> conditional density

# Two sources of locations

BLKI GPS track



BLKI survey locations



kernel-density

additional steps

=> conditional density

abundance model  
and/or kriging

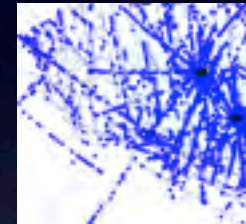


# Two sources of locations

BLKI GPS track



BLKI survey locations



kernel-density

additional steps

=> conditional density

abundance model  
and/or kriging

=> density surface

# What's needed?

densities from tracking data

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- estimate of total population (% tracked)

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# What's needed?

densities from tracking data

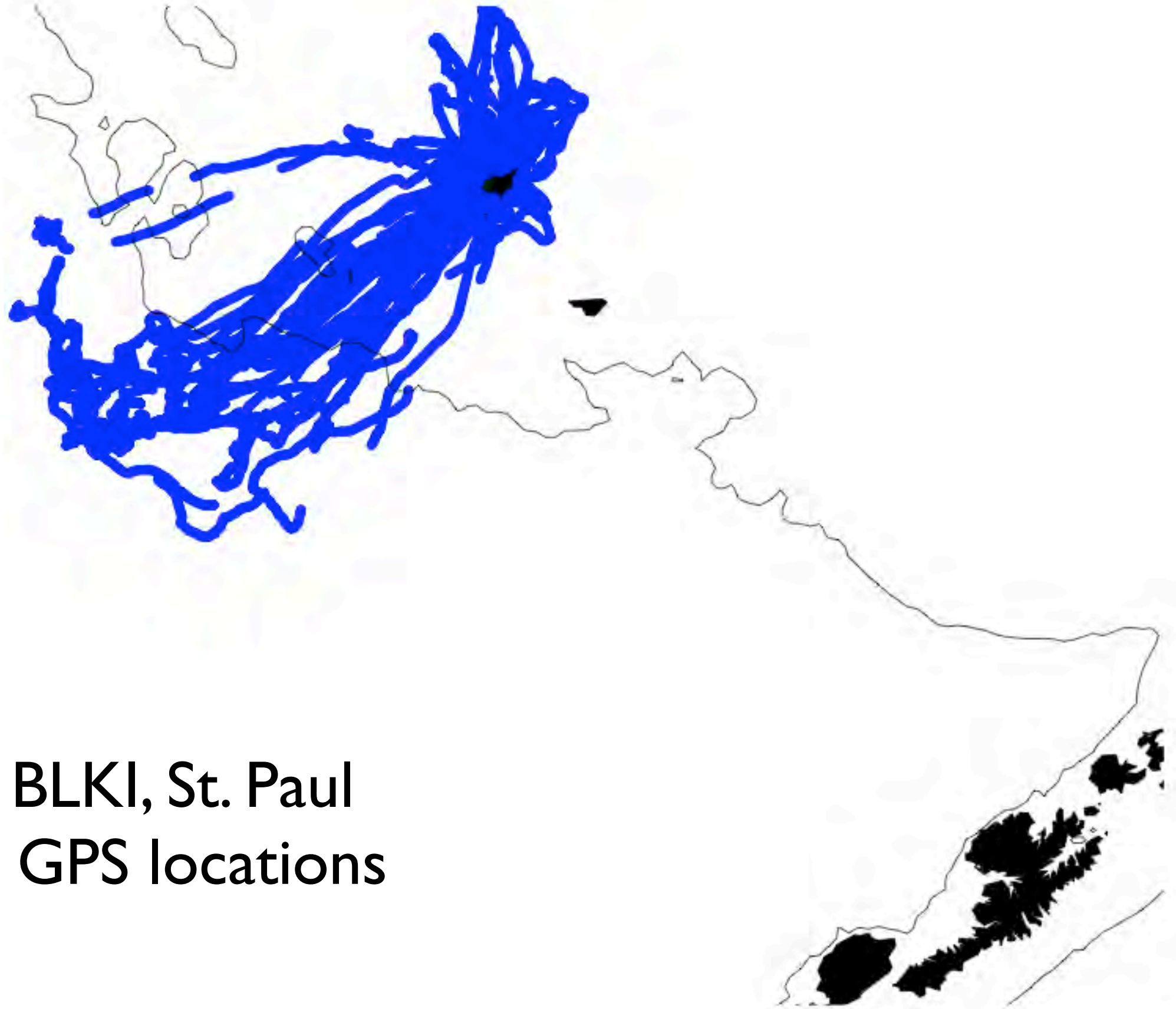
- tracks
- estimate of total population (% tracked)
- representative sampling
- [Whitehead & Jonsen's 2013: bayesian model]



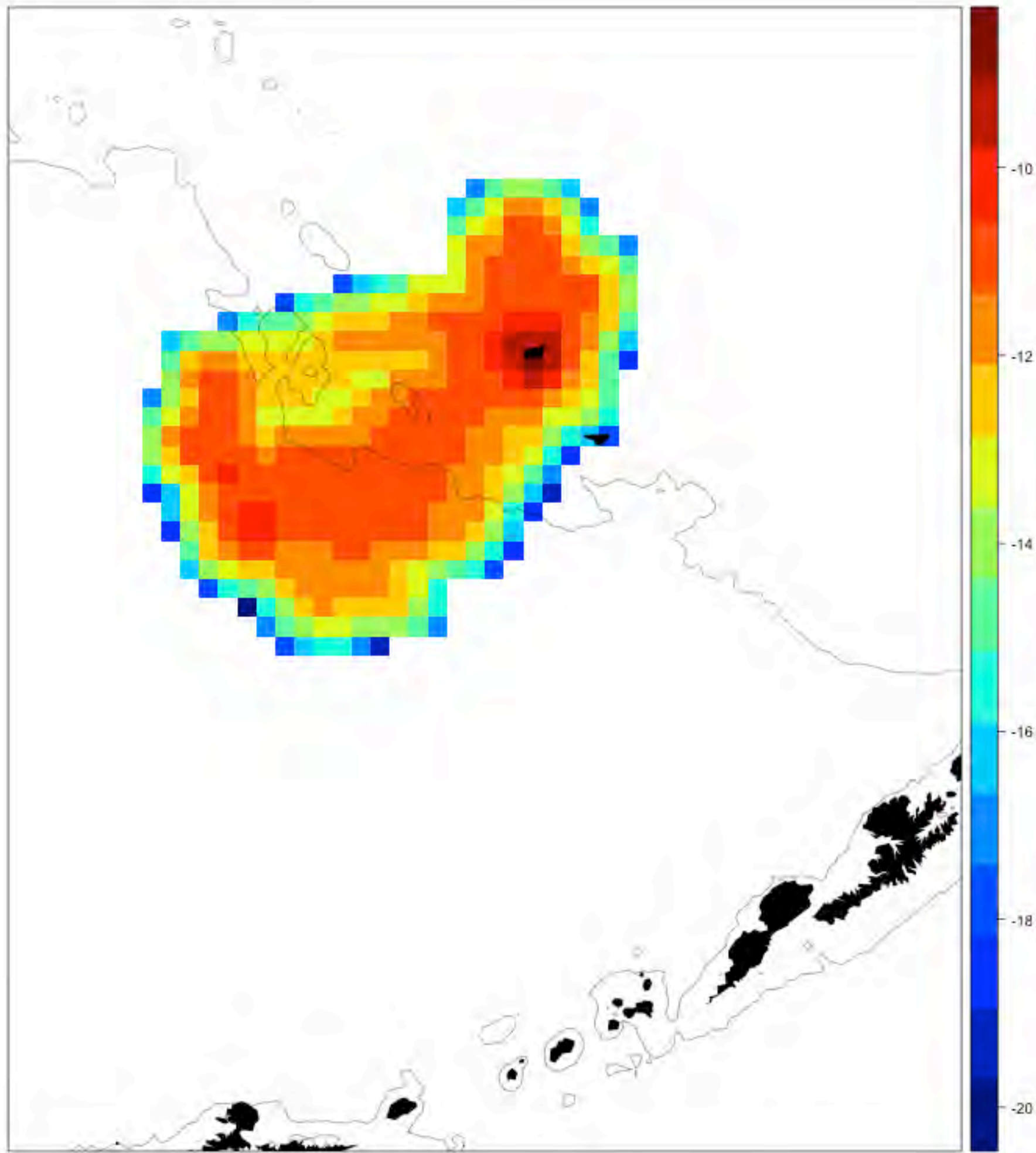
# Let's play

- GPS tracks of Black-legged Kittiwakes from the Pribilof Islands (St. Paul and St. George), courtesy of Rosana Paredes
- 30 years of at-sea surveys in the SE Bering Sea (NPPSD)





**73 ind. BLKI, St. Paul**  
**200,342 GPS locations**







STG

STP

-10

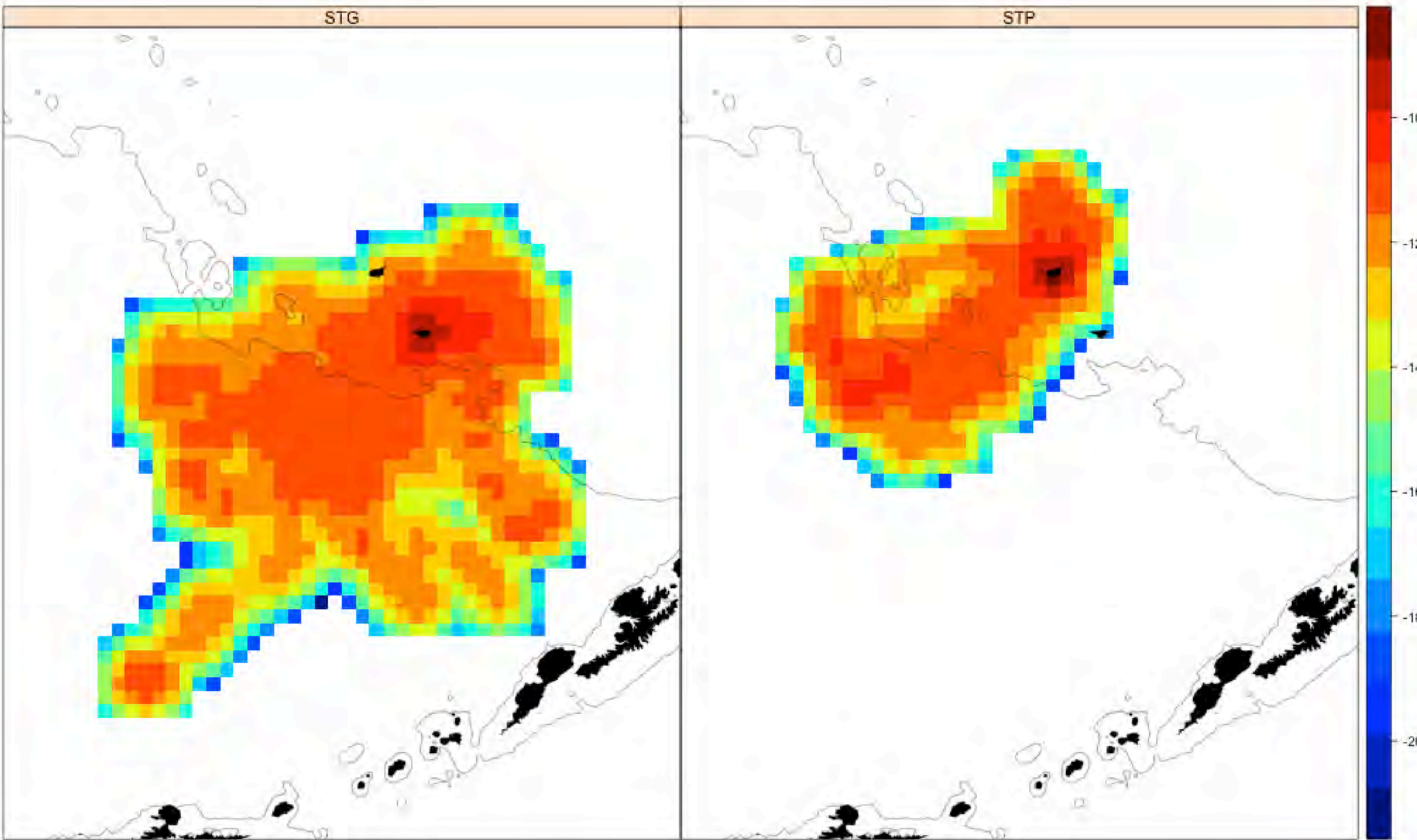
-12

-14

-16

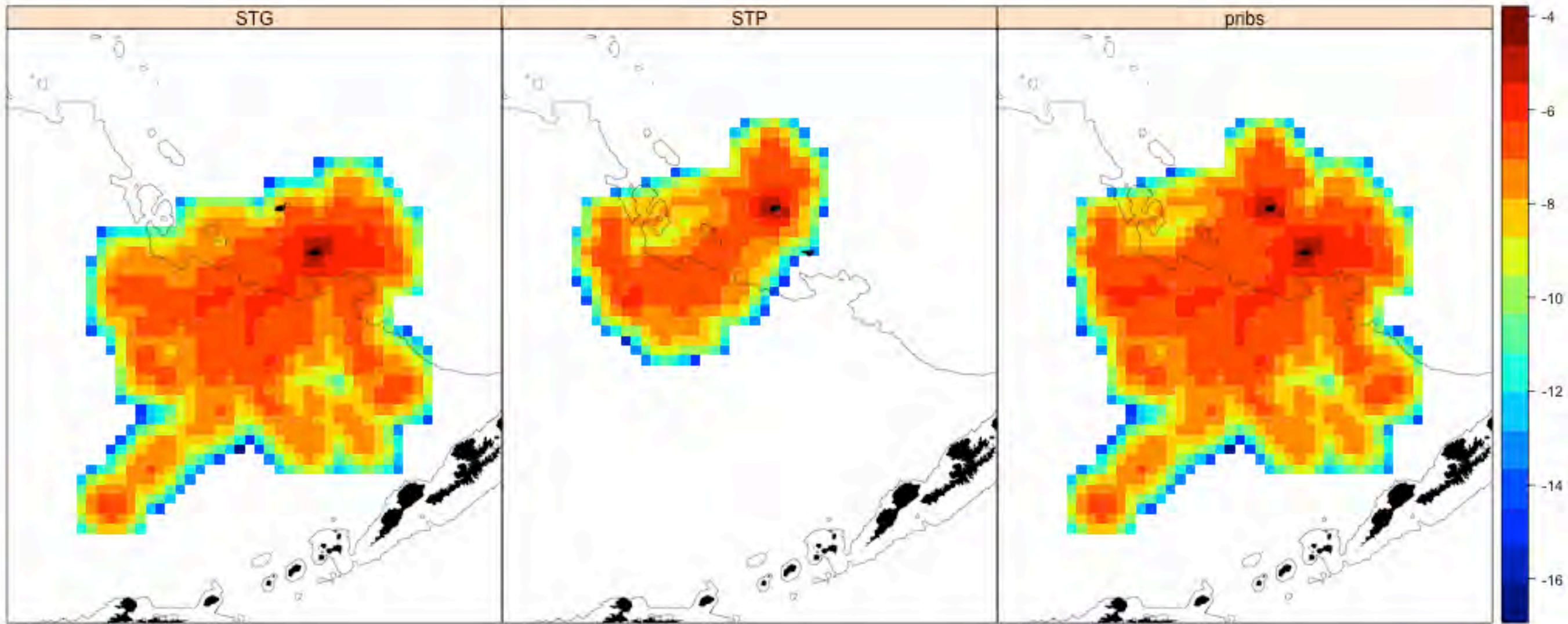
-18

-20

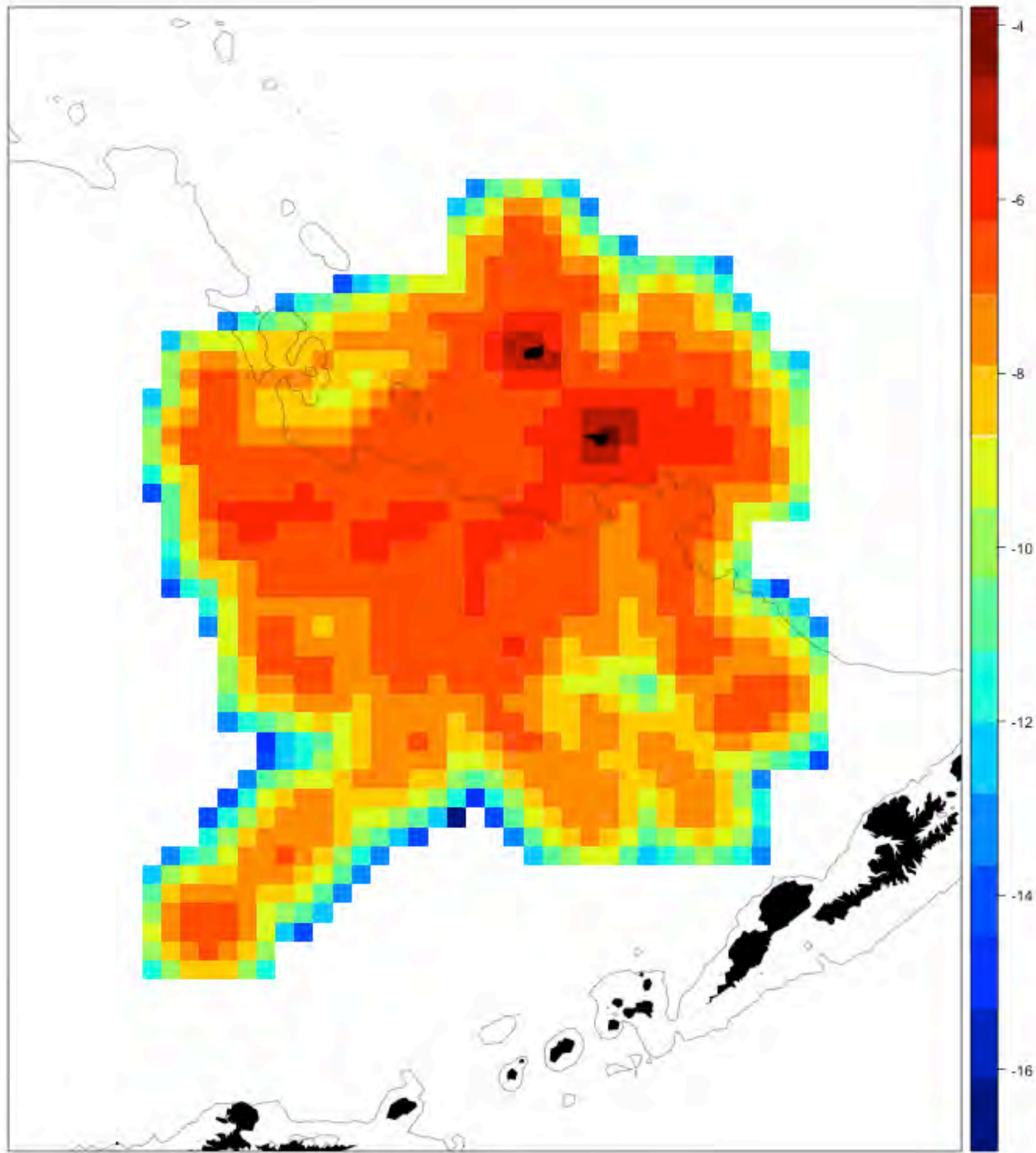




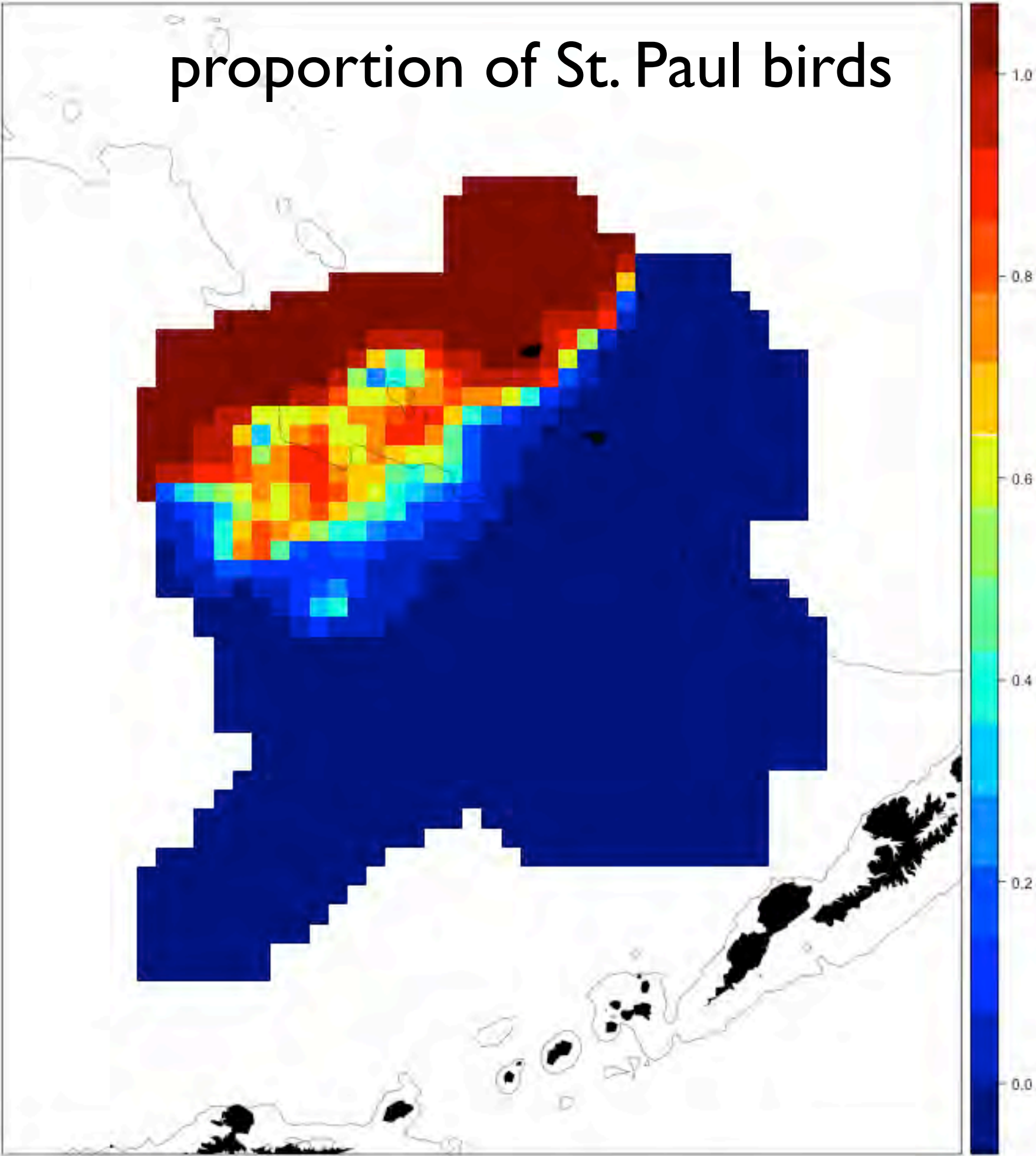
scale each island by the total number of breeders  
add all islands



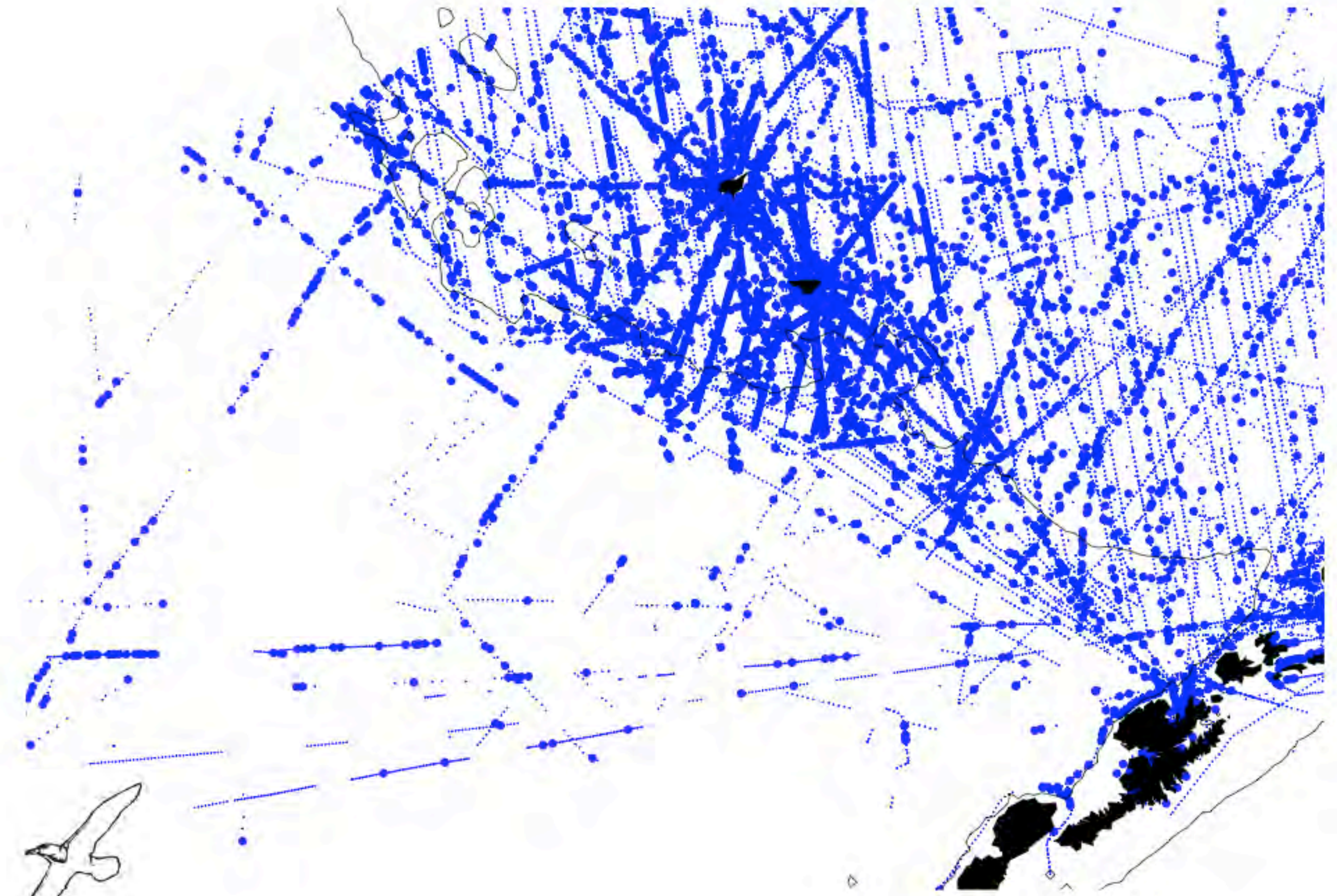




# proportion of St. Paul birds



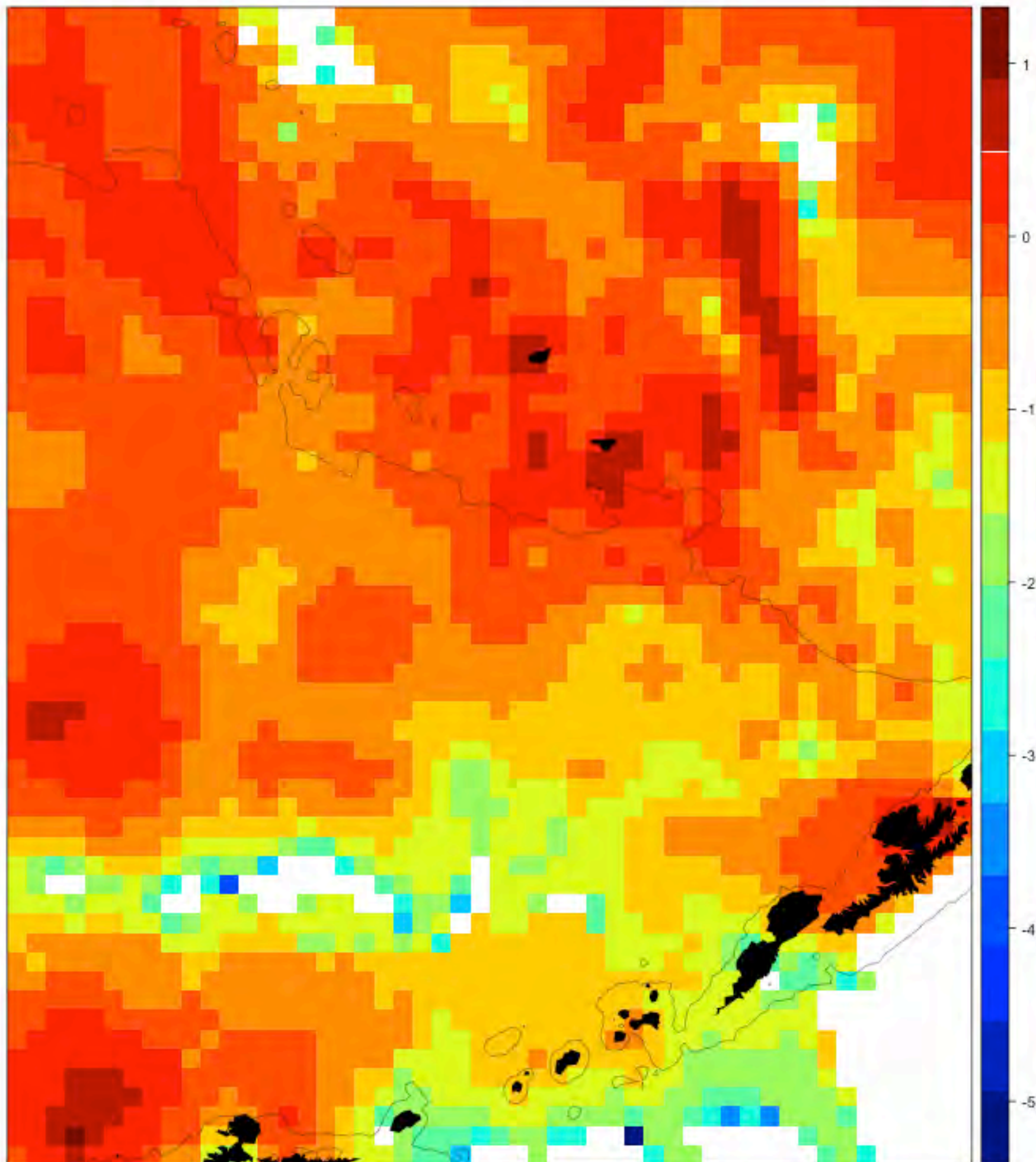




NPPSD

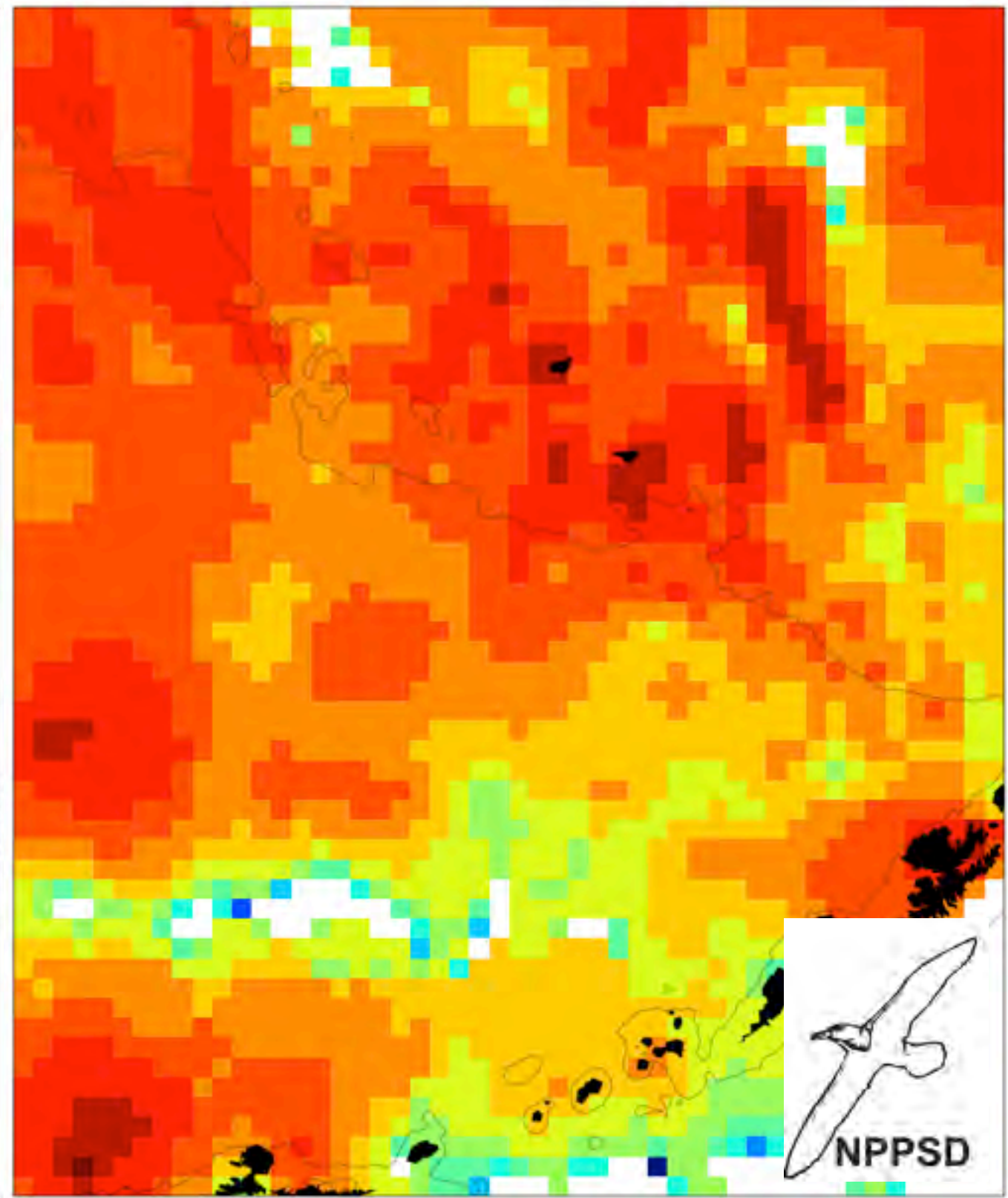
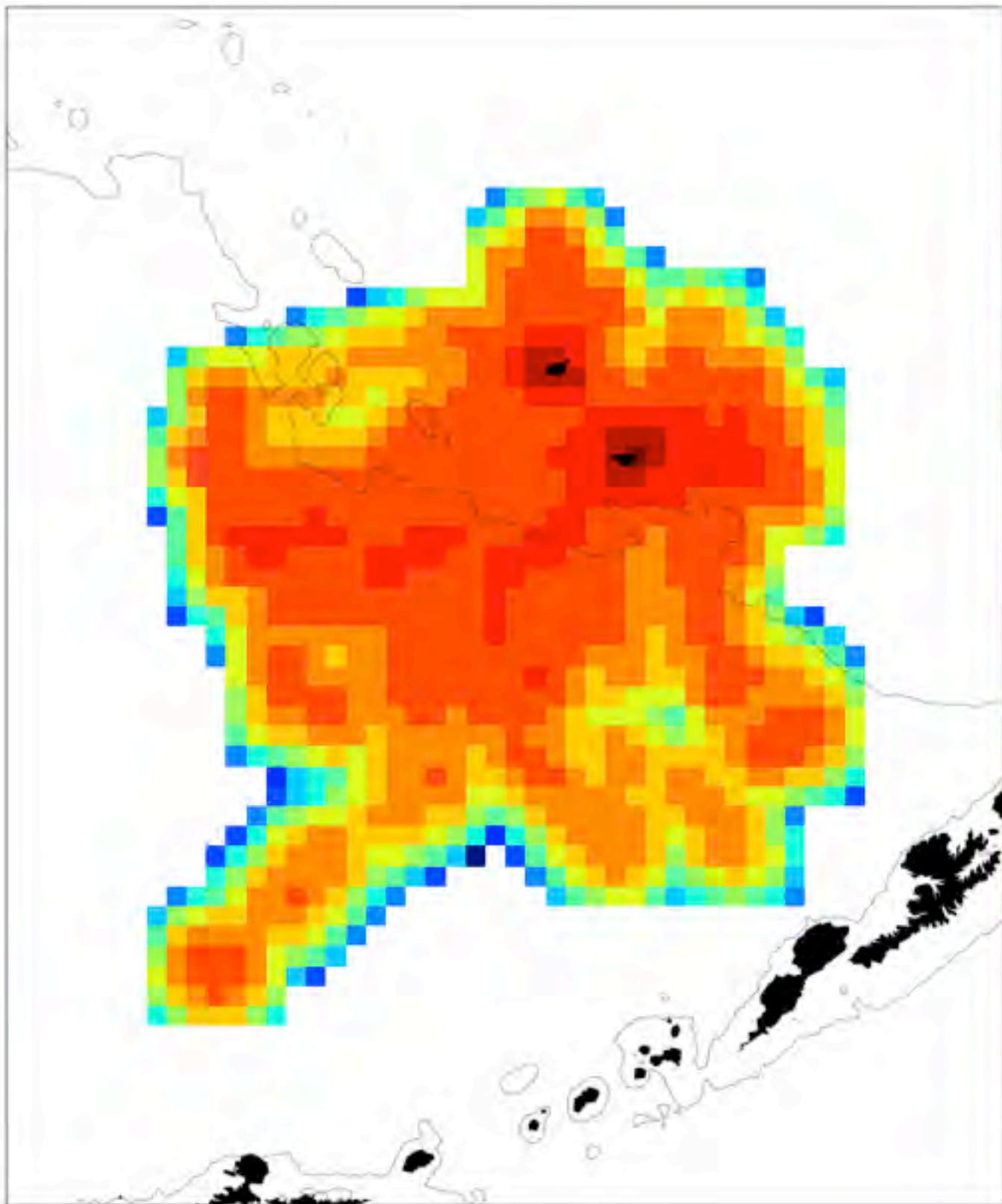


# kriged BLKI, June-July



GPS

survey





strength

weakness

survey

direct measure of density  
4 decades of historic data  
all species

coverage (winter, offshore)  
ship attraction, detection

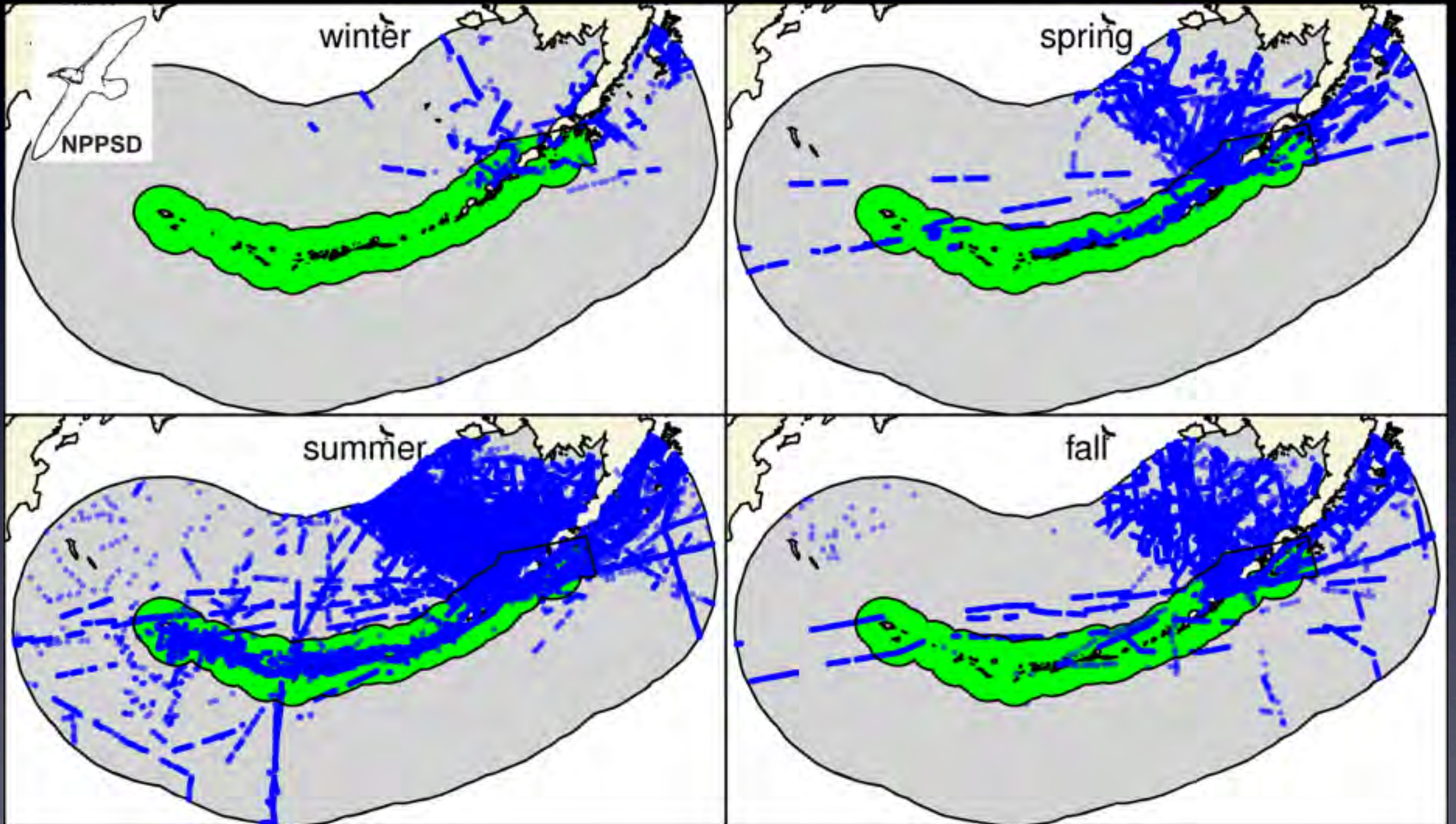
track

full spatial coverage  
(temporal coverage)

representative sample?  
population size known?



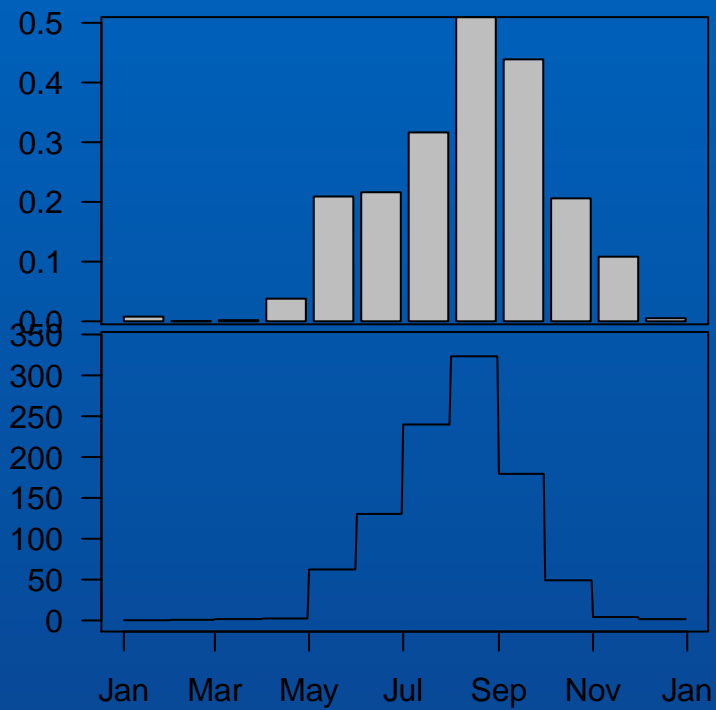
> 100,000 records



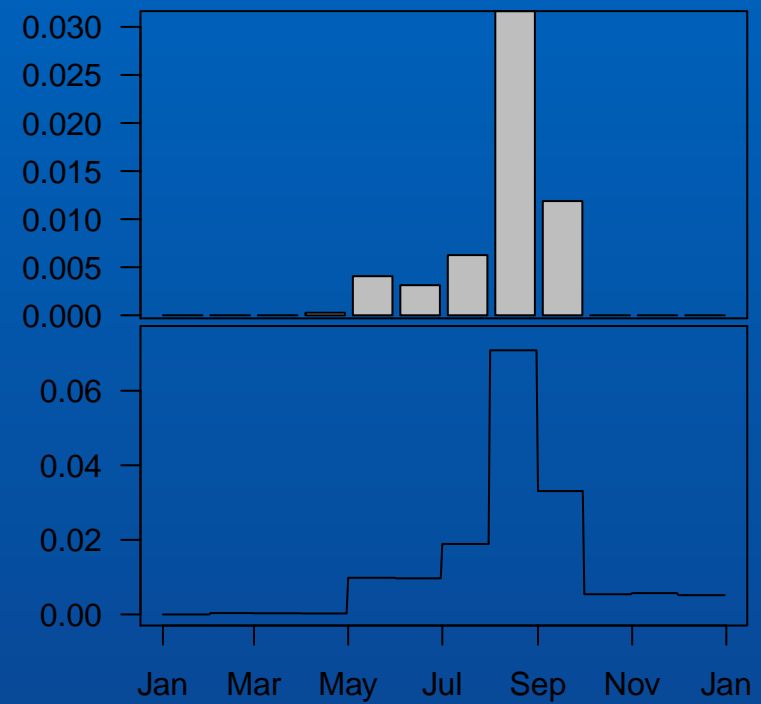
# Modeling Problems

% occurrence

Unidentified Dark Shearwater



Arctic Tern

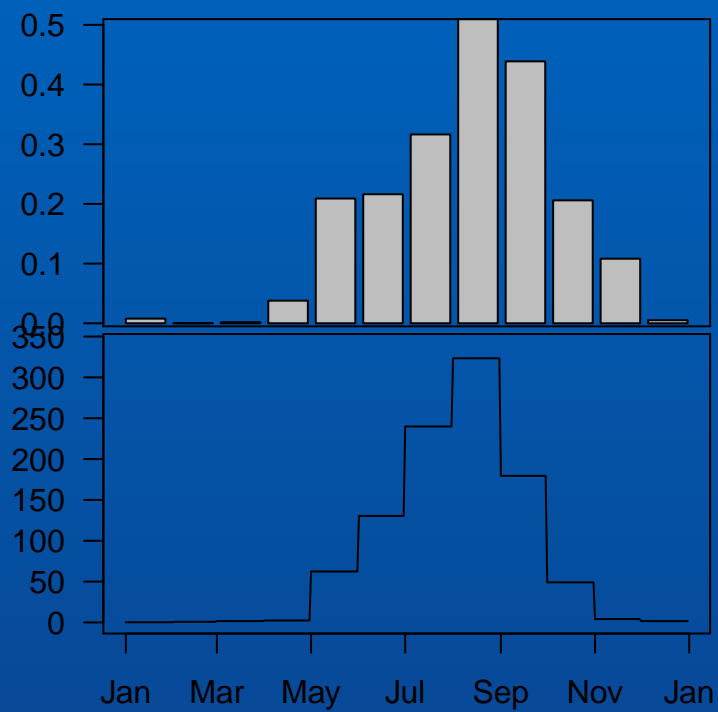


RF density

# Modeling Problems

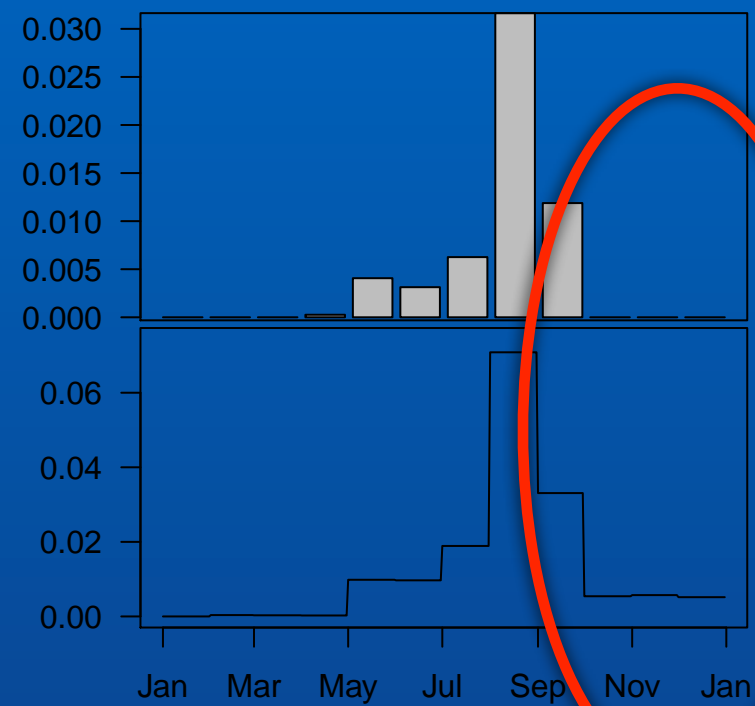
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# How after all?

Ideas to discuss

# How after all?

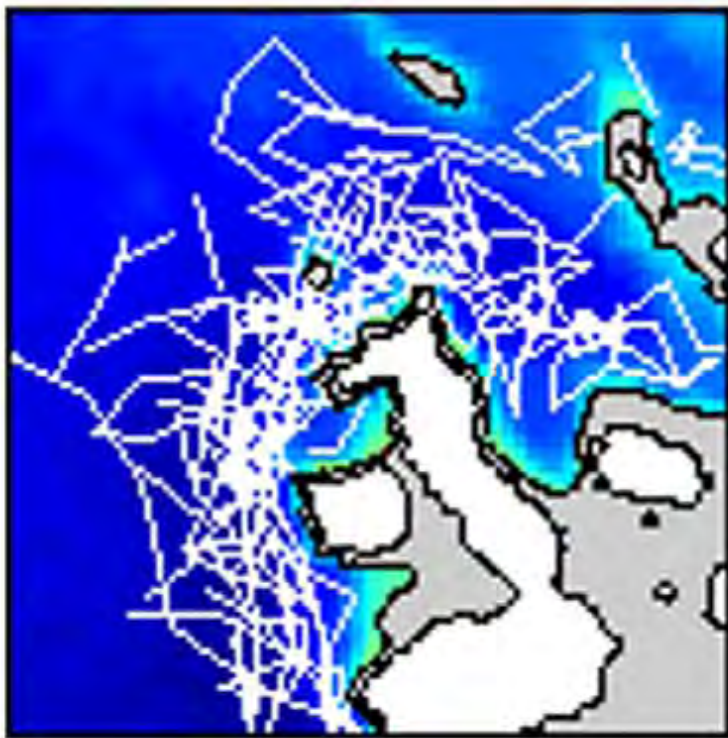
## Ideas to discuss

- Whitehead & Jonsen 2013  
(STAL, cetaceans)

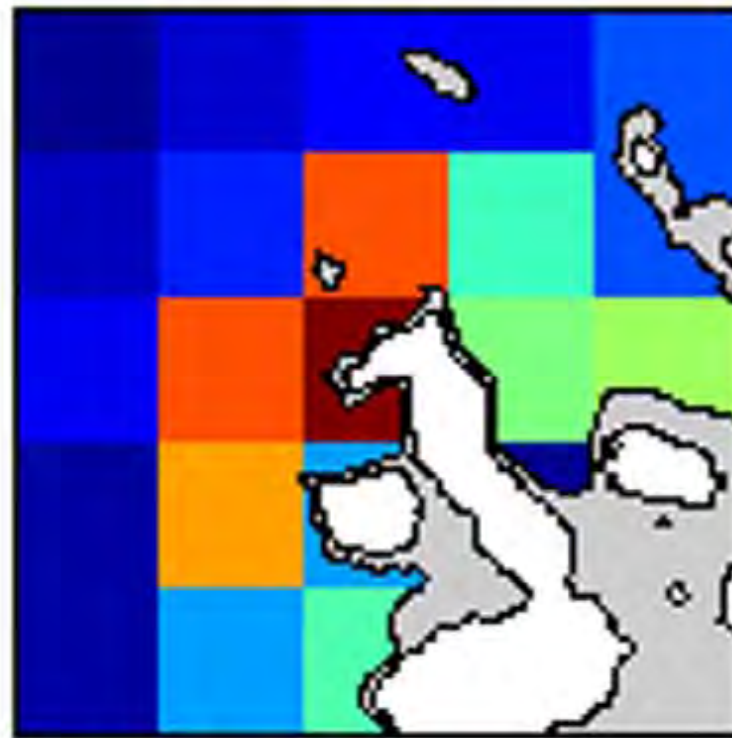
# Whitehead & Jonsen 2013

## Sperm Whale

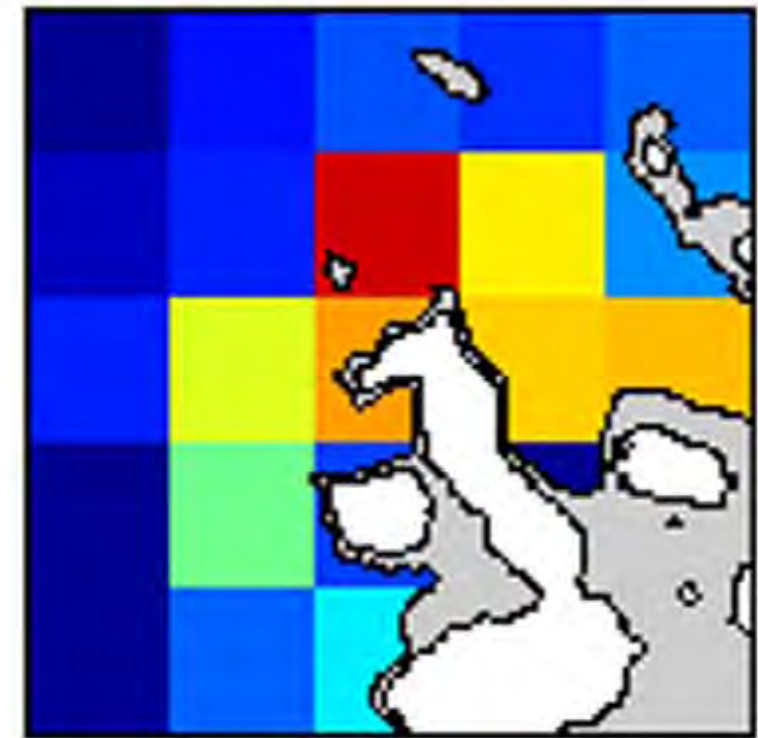
Tracks



Track density



Markov density





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- other spp: boundary = ?
- replace “colony effect”

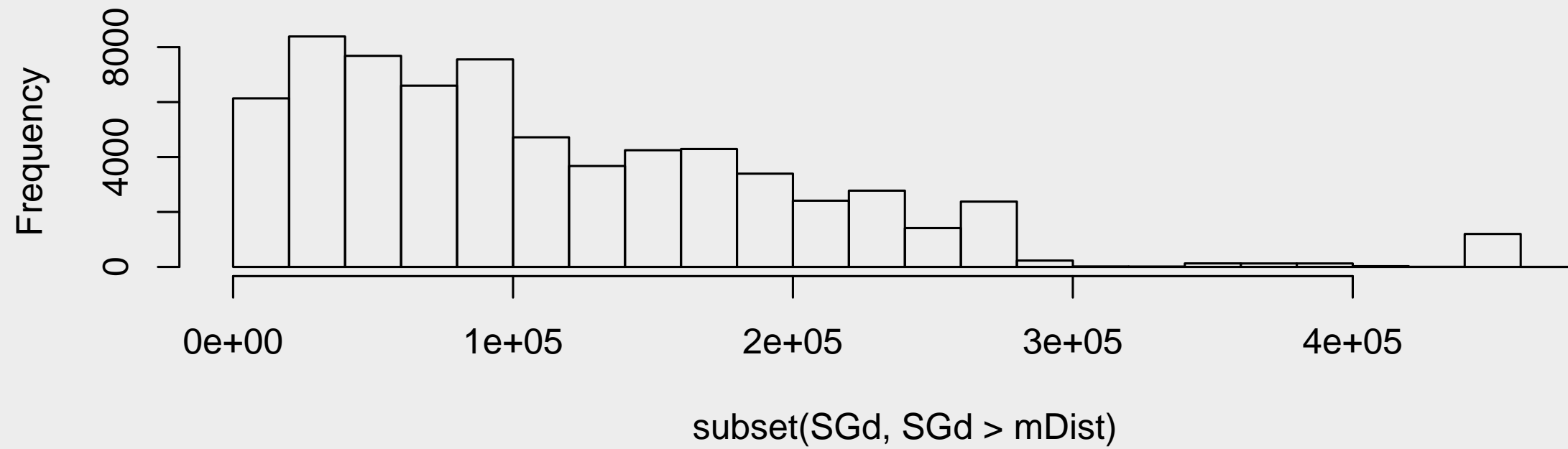


# How after all?

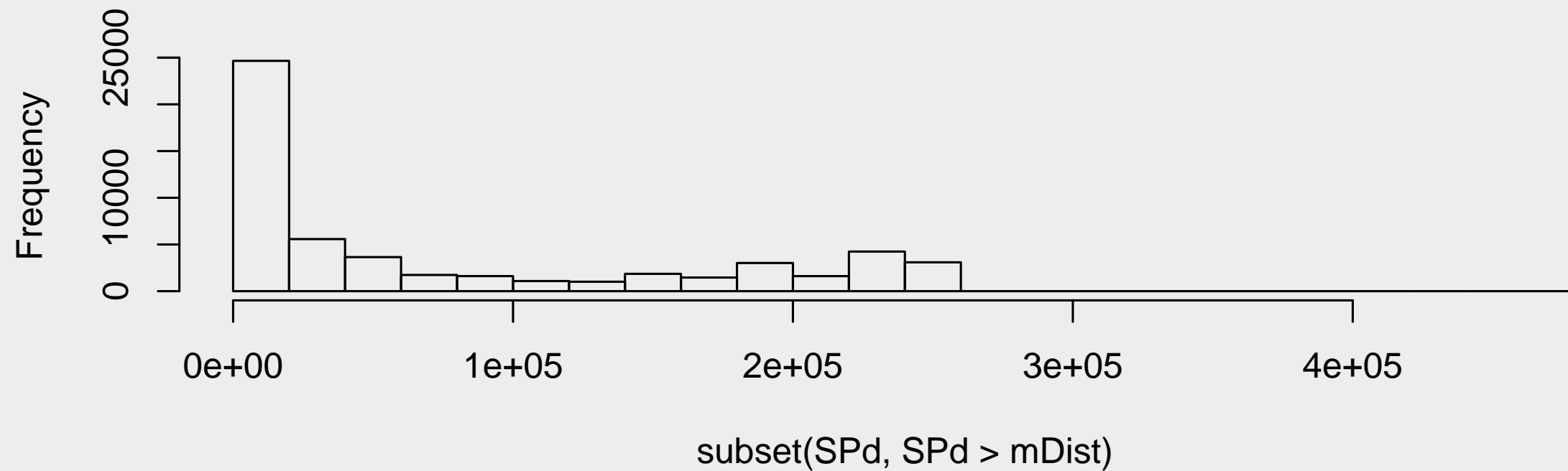
## Ideas to discuss

- Whitehead & Jonsen 2013  
(STAL, cetaceans)
- other spp: boundary = ?
- replace “colony effect”
- improve “colony effect”

### BLKI distance from Saint George



### distance from Saint Paul



# How after all?

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- regression survey~track
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# How after all?

## Ideas to discuss

- Whitehead & Jonsen 2013 (STAL, cetaceans)
- regression survey~track
- use hard cut-offs
- other spp: boundary = ?
- replace “colony effect”
- improve “colony effect”

# Hard cut-offs?

- use all locations to define presence/absence
- Build spatial-temporal, not environmentally driven model
- phenology of long-distance migrants
- winter areas, if adequate sampling available (likely from satellite/geolocators, not summer GPS)



# How after all?

## Ideas to discuss

- Whitehead & Jonsen 2013 (STAL, cetaceans)
- other spp: boundary = ?
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- calibrate survey (vessel attraction)



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## Ideas to discuss

- Whitehead & Jonsen 2013 (STAL, cetaceans)
- other spp: boundary = ?
- replace “colony effect”
- improve “colony effect”
- regression survey~track
- isolated areas (Prips)
- use hard cut-offs
- calibrate survey (vessel attraction)
- bayesian model

Proceed with caution

# Promising



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- well mixed species:

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  - cetaceans (within stocks)

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  - short-tailed albatross



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  - non-breeding seabirds?

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- well mixed species:
  - cetaceans (within stocks)
  - short-tailed albatross
  - stack all colonies (LAAL, BFAL)
  - non-breeding seabirds?
- complement select locations (boundaries = ?)



# Where it doesn't work

- most seabird and seal species during breeding season?
- not representatively sampled
  - many colonies, sampled on land
  - Aleutian seabirds, gulls, WHAU

# Summary

- Survey and tracking data complement each other
- Merging them is not straightforward and may only happen in special cases

# Future



# Future

NSA

CIA

# Future

NSA

CIA

- snoop on every individual

- fly drones

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NSA

CIA

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- fly drones

What is sound investment?