

Counting animals

EFB 390: Wildlife Ecology and Management

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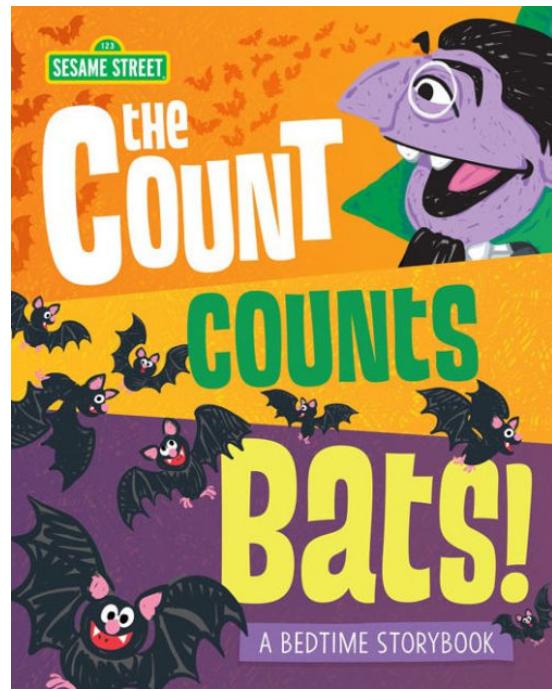
Goals of wildlife management

1. make them increase
2. make them decrease
3. keep them stable
4. do nothing - but keep an eye on them

What do we need to know!?

A count can be simple

1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16, 17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29, 30, 31, 32, 33, 34, 35, 36, 37, 38, 39, 40, 41, 42, 43, 44, 45, 46, 47, 48, 49, 50, 51, 52, 53, 54, 55, 56, 57, 58, 59, 60, 61, 62, 63, 64, 65, 66, 67, 68, 69, 70, 71, 72, 73, 74, 75, 76, 77, 78, 79, 80, 81, 82, 83, 84, 85, 86, 87, 88, 89, 90, 91, 92, 93, 94, 95, 96, 97, 98, 99, 100, 101, 102, 103, 104, 105, 106, 107, 108, 109, 110, 111, 112, 113, 114, 115, 116, 117, 118, 119, 120, 121, 122, 123, 124, 125, 126, 127, 128, 129, 130, 131, 132, 133, 134, 135, 136, 137, 138, 139, 140, 141, 142, 143, 144, 145, 146, 147, 148, 149, 150, 151, 152, 153, 154, 155, 156, 157, 158, 159, 160, 161, 162, 163, 164, 165, 166, 167, 168, 169, 170, 171, 172, 173, 174, 175, 176, 177, 178, 179, 180, 181, 182, 183, 184, 185, 186, 187, 188, 189, 190, 191, 192, 193, 194, 195, 196, 197, 198, 199, 200



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... or a count can be pretty darned complex

Variance on the estimator of the variance of a **Pacific cod** count based on on-deck observations of harvest in pots:

respectively. The expectation of Eq. 4.17 is

$$\begin{aligned} E\left(\hat{\Psi}_k\right) &= E_{s_w}\left\{\frac{M_k}{m_{2k}} \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left[\frac{N_{ki}}{n_{ki}} E_{s_O}\left(\frac{n_k}{n_{Ok}} E_{s_A}\left(\frac{N_{Om}}{n_{Am}} \psi_{Ak_i}\right)\right)\right]\right\} \\ &= E_{s_w}\left\{\frac{M_k}{m_{2k}} \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left[\frac{N_{ki}}{n_{ki}} E_{s_O}\left(\frac{n_k}{n_{Ok}} \psi_{Ok_i}\right)\right]\right\} \\ &= E_{s_w}\left[\frac{M_k}{m_{2k}} \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left(\frac{N_{ki}}{n_{ki}} \psi_{Lk_i}\right)\right] = E_{s_w}\left(\frac{M_k}{m_{2k}} \sum_{i=1}^{m_{2k}} \Psi_{ki}\right) = \Psi_k. \end{aligned}$$

The variance of the estimator can be written as

$$\begin{aligned} V\left(\hat{\Psi}_k\right) &= V_{s_w}\underbrace{\left\{E_{s_{L_1}}\left[E_{s_O}\left(E_{s_A}\left(\hat{\Psi}_k\right)\right)\right]\right\}}_{V_1} + E_{s_w}\underbrace{\left\{V_{s_{L_1}}\left[E_{s_O}\left(E_{s_A}\left(\hat{\Psi}_k\right)\right)\right]\right\}}_{V_2} \\ &\quad + E_{s_w}\underbrace{\left\{E_{s_{L_1}}\left[V_{s_O}\left(E_{s_A}\left(\hat{\Psi}_k\right)\right)\right]\right\}}_{V_3} + E_{s_w}\underbrace{\left\{E_{s_{L_1}}\left[V_{s_O}\left(E_{s_A}\left(\hat{\Psi}_k\right)\right)\right]\right\}}_{V_4}. \end{aligned}$$

Component-wise,

$$V_1 = V_{s_w}\left(\frac{M_k}{m_{2k}} \sum_{i=1}^{m_{2k}} \Psi_{ki}\right) = M_k\left(\frac{M_k}{m_{2k}} - 1\right) \frac{\sum_{i=1}^{M_k} (\Psi_{ki} - \bar{\Psi}_k)(\Psi_{ki} - \bar{\Psi}_k)^T}{M_k - 1},$$

$$\begin{aligned} V_2 &= E_{s_w}\left[\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i=1}^{m_{2k}} V_{s_{L_i}}\left(\frac{N_{ki}}{n_{ki}} \psi_{Lk_i}\right)\right] \\ &= \frac{M_k}{m_{2k}} \sum_{i=1}^{M_k} N_{ki} \left(\frac{N_{ki}}{n_{ki}} - 1\right) \frac{N_{ki} [\text{diag}(\mathbf{P}_{ki}) - \mathbf{P}_{ki}\mathbf{P}_{ki}^T]}{N_{ki} - 1}, \end{aligned}$$

$$\begin{aligned} V_3 &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 E_{s_{L_i}}\left[V_{s_O}\left(\sum_{i=1}^{m_{2k}} \frac{N_{ki}}{n_{ki}} \frac{n_k}{n_{Ok}} \psi_{Ok_i}\right)\right]\right\} \\ &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left[\left(\frac{N_{ki}}{n_{ki}}\right)^2 V_{s_O}\left(\frac{n_k}{n_{Ok}} \psi_{Ok_i}\right)\right]\right\} \\ &\quad + E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i \neq j}^{m_{2k}} \sum_{i \neq j}^{m_{2k}} E_{s_{L_i}}\left[\frac{N_{ki} N_{kj}}{n_{ki} n_{kj}} Cov_{s_O}\left(\frac{n_k}{n_{Ok}} \psi_{Ok_i}, \frac{n_k}{n_{Ok}} \psi_{Ok_j}\right)\right]\right\} \\ &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left[\left(\frac{N_{ki}}{n_{ki}}\right)^2 n_k \left(\frac{n_k}{n_{Ok}} - 1\right) \frac{n_k [\text{diag}(\mathbf{P}_{Lk_i}) - \mathbf{P}_{Lk_i}\mathbf{P}_{Lk_i}^T]}{n_k - 1}\right]\right\} \\ &\quad - E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i \neq j}^{m_{2k}} E_{s_{L_i}}\left[\frac{N_{ki} N_{kj}}{n_{ki} n_{kj}} n_k \left(\frac{n_k}{n_{Ok}} - 1\right) \frac{n_k \mathbf{P}_{Lk_i}\mathbf{P}_{Lk_j}^T}{n_k - 1}\right]\right\} \end{aligned}$$

and

$$\begin{aligned} V_4 &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 E_{s_{L_i}}\left[V_{s_A}\left(\sum_{i=1}^{m_{2k}} \frac{N_{ki}}{n_{ki}} \frac{n_k}{n_{Ok}} \frac{N_{Om}}{n_{Am}} \psi_{Ak_i}\right)\right]\right\} \\ &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 E_{s_{L_i}}\left[\left(\frac{N_{ki}}{n_{ki}} \frac{n_k}{n_{Ok}}\right)^2 V_{s_A}\left(\frac{N_{Om}}{n_{Am}} \psi_{Ak_i}\right)\right]\right\} \\ &\quad + \sum_{i \neq j}^{m_{2k}} E_{s_O}\left[\frac{N_{ki} N_{kj}}{n_{ki} n_{kj}} \left(\frac{n_k}{n_{Ok}}\right)^2 Cov_{s_A}\left(\frac{N_{Om}}{n_{Am}} \psi_{Ak_i}, \frac{N_{Om}}{n_{Am}} \psi_{Ak_j}\right)\right]\right\} \\ &= E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i=1}^{m_{2k}} E_{s_{L_i}}\left[\left(\frac{N_{ki}}{n_{ki}} \frac{n_k}{n_{Ok}}\right)^2 N_{Om}^2 \left(\frac{N_{Om}}{n_{Am}} - 1\right) \frac{[\text{diag}(\mathbf{P}_{Oki}) - \mathbf{P}_{Oki}\mathbf{P}_{Oki}^T]}{N_{Om} - 1}\right]\right\} \\ &\quad - E_{s_w}\left\{\left(\frac{M_k}{m_{2k}}\right)^2 \sum_{i \neq j}^{m_{2k}} E_{s_{L_i}}\left[\frac{N_{ki} N_{kj}}{n_{ki} n_{kj}} \left(\frac{n_k}{n_{Ok}}\right)^2 N_{Om}^2 \left(\frac{N_{Om}}{n_{Am}} - 1\right) \frac{\mathbf{P}_{Oki}\mathbf{P}_{Okj}^T}{N_{Om} - 1}\right]\right\} \end{aligned}$$

where $\mathbf{P}_{ki} = \Psi_{ki}/N_{ki}$, $\mathbf{P}_{Lk_i} = \psi_{Lk_i}/n_k$ and $\mathbf{P}_{Oki} = \psi_{Oki}/N_{Om}$.

An observation



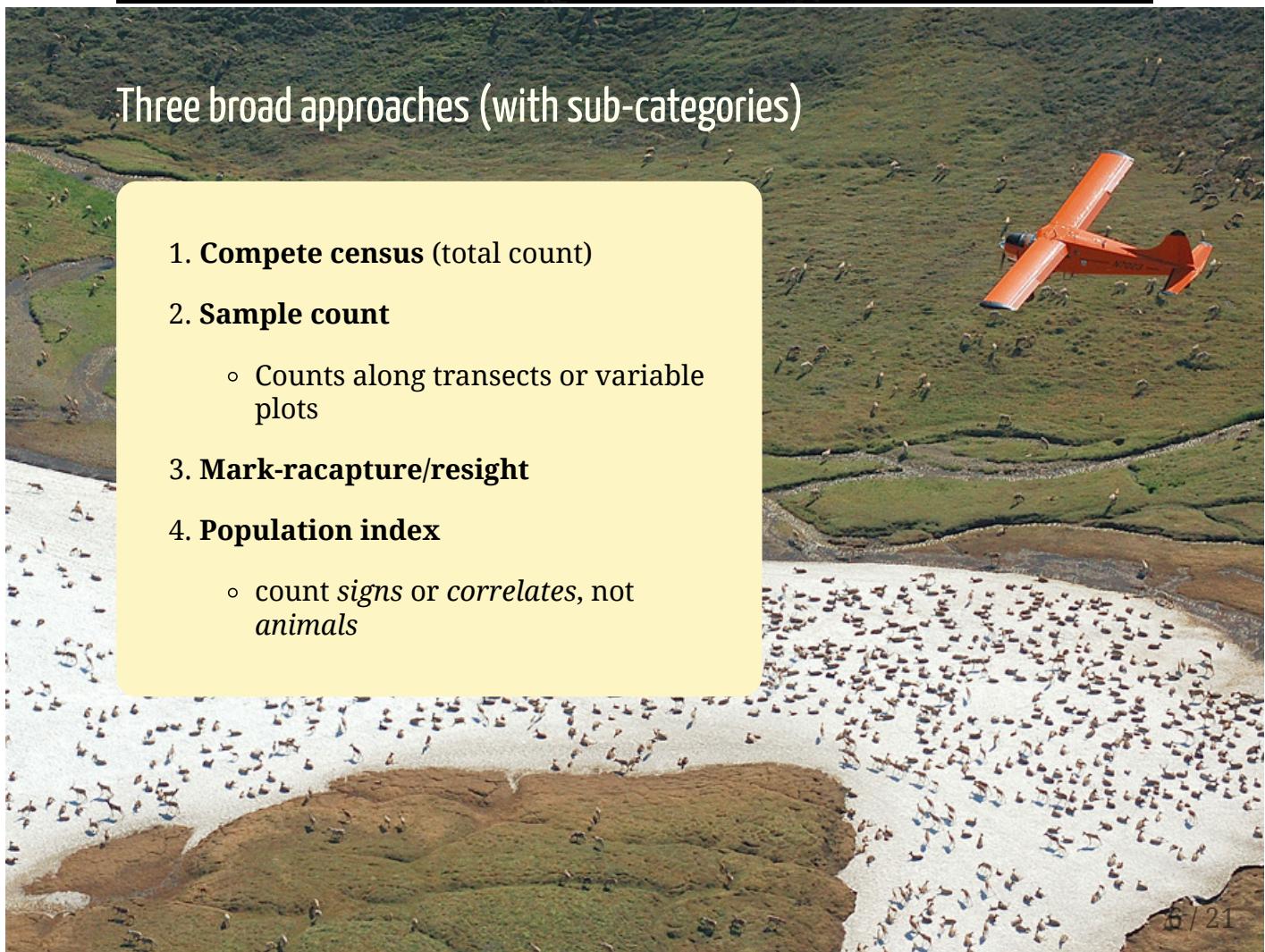
Counting **fish** is just like counting **trees**, except they're *invisible* and they *move* ...



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Three broad approaches (with sub-categories)

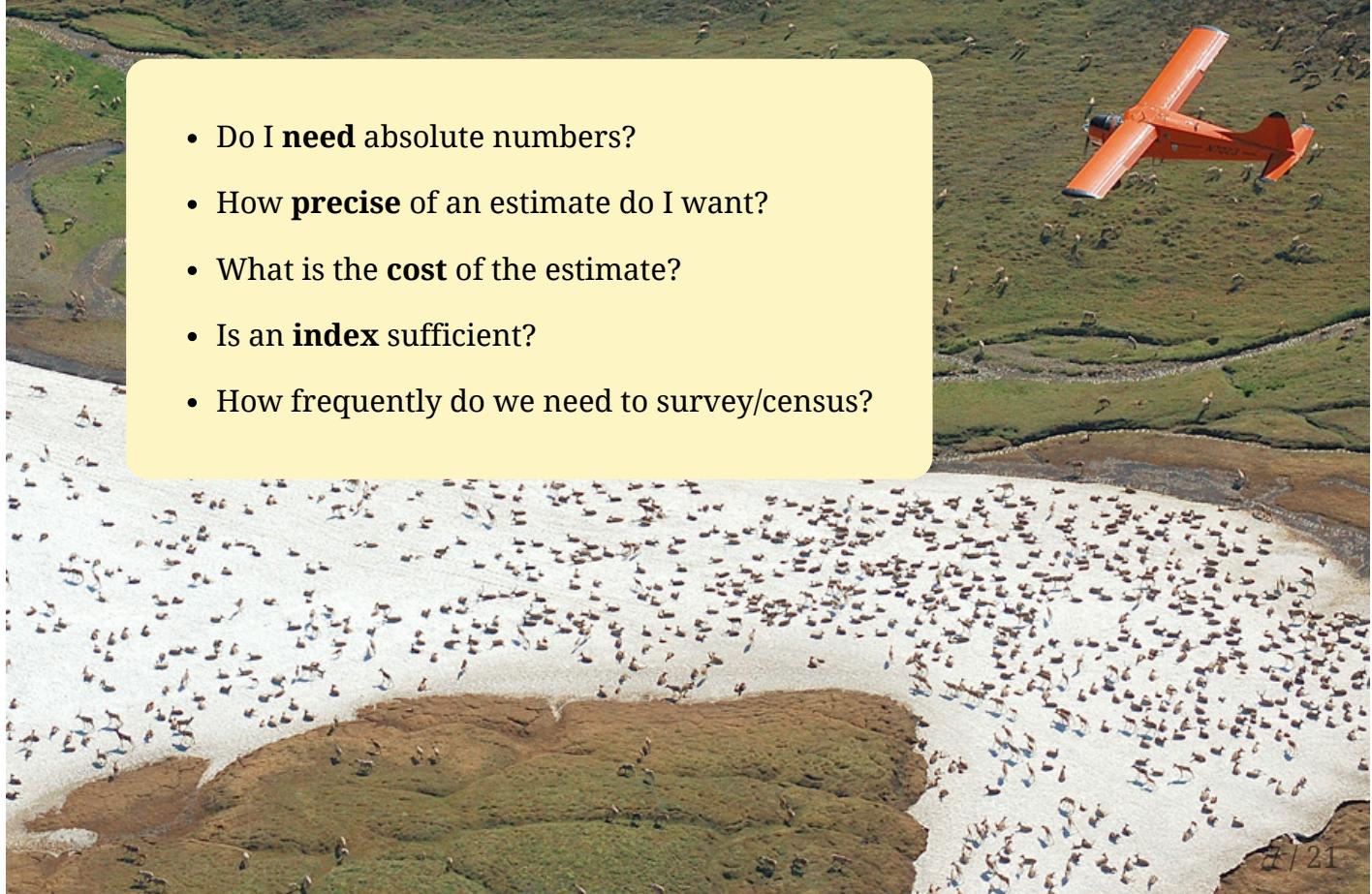
1. **Complete census** (total count)
2. **Sample count**
 - Counts along transects or variable plots
3. **Mark-racapture/resight**
4. **Population index**
 - count *signs* or *correlates*, not *animals*



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Some considerations

- Do I **need** absolute numbers?
- How **precise** of an estimate do I want?
- What is the **cost** of the estimate?
- Is an **index** sufficient?
- How frequently do we need to survey/census?



Two important considerations:

ACCURACY AND PRECISION
ARE NOT THE SAME THING

ACCURACY
TRUE TO INTENTION

PRECISION
TRUE TO ITSELF

The diagram shows four targets arranged in a row. The first two targets have multiple red dots clustered in their centers, while the last two have fewer, more widely spaced dots. Arrows point from the definitions above to the corresponding targets. Below each target is a label: the first is crossed out, the second is crossed out, the third is 'ACCURATE PRECISE', and the fourth is 'ACCURATE PRECISE'.

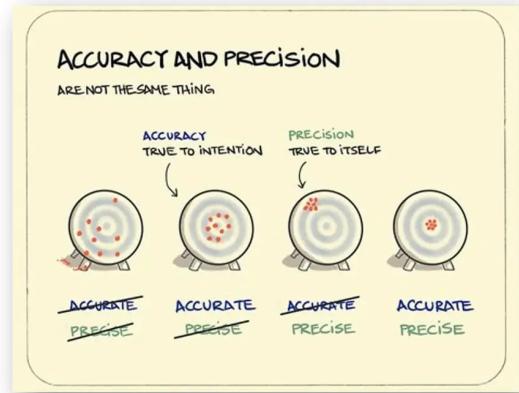
Accuracy

Is the estimate **biased**?

- On average, on target

Determined by **design**.

- how well you throw the dart?



Can be difficult to assess.

- because there isn't usually a dartboard!

Precision

What is the **error** or **variance** or **spread** on the resulting estimate?

Quantified with **Confidence Intervals (C.I.)** (or **coefficients of variation (C.V.)**)

Determined by **effort** and computed with (sometimes very fancy) **statistics**.

Generally: bigger the **sample** = smaller **error** = higher **precision**.

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Very accurate, but very imprecise:



What nuclear secrets could Trump have possibly taken?

A nuclear weapons historian explains why it's so hard to know what material Trump took.

By Christian Paz | @realcpaz | Aug 12, 2022, 7:30pm EDT

"It could be anything ranging from something that would endanger the lives of hundreds of millions of people to something that has no impact on anything whatsoever. That's how vague the classified categorization is," Alex Wellerstein, a historian of science and nuclear weapons, told me.

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General Goal of Abundance Estimation

Increase both **accuracy** and **precision** as constraints on **effort** (& costs).

Generally, there is a higher premium on **accuracy**

- (i.e. better an unbiased but imprecise estimate, than a highly precise but biased estimate).

When might BIAS not be so important?

If the bias is consistent, repeated measures can tell you how things are *changing*

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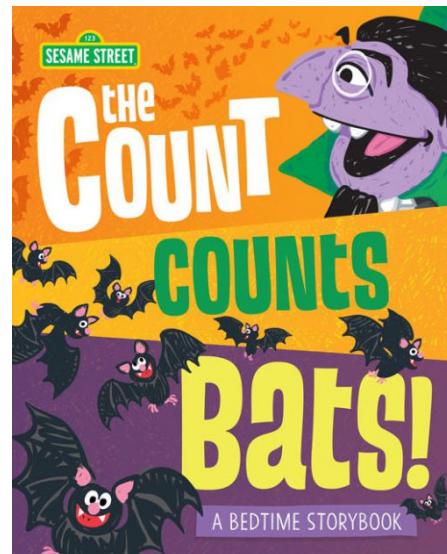
Method I: Total Count, aka. Census

Pros

- Simple to explain!
- Simple math (*arithmetic*!)
- Very precise

Cons

- Usually - VERY difficult / expensive to perform
- Only possible for certain kinds of animals
- Almost always biased!



What kinds of animals can we census?

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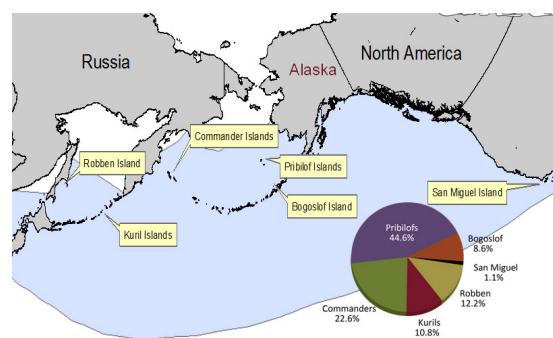
Census Examples

- U.S. Census
- Hippopotomuses in clear rivers*
- Large game (elephants, rhinos, wildebeest) within some parks / game reserves in African savanna*
- Apparently - until the 1950's - many deer / elk herds in the West.*

*- examples from Fryxell book ... but a bit tricky to confirm.

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Northern Fur Seals *Callorhinus ursinus*



- Once extremely abundant
- VERY heavily harvested
- Paid off 1867 purchase Alaska in 30 years
- Reproduce (essentially) in only 6 **rookeries** worldwide
- At heart of the first international wildlife management treaty.



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Count 'em!

Tyuleni Island

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Lovushki Island Fur Seal Pup Count

technology: Count Clickers | Notepad



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Lovushki Island Fur Seal Pup Count

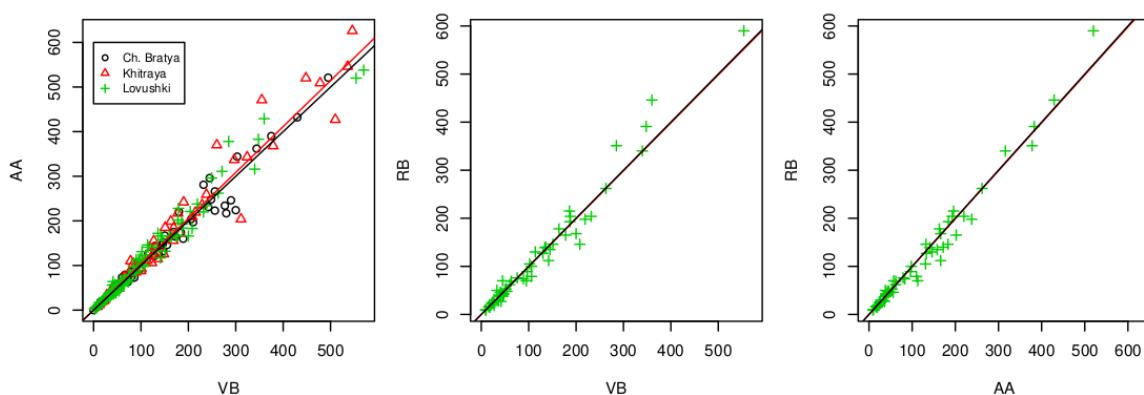
technology: Bamboo poles for self-defense



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Fur seal count: Source of variation?

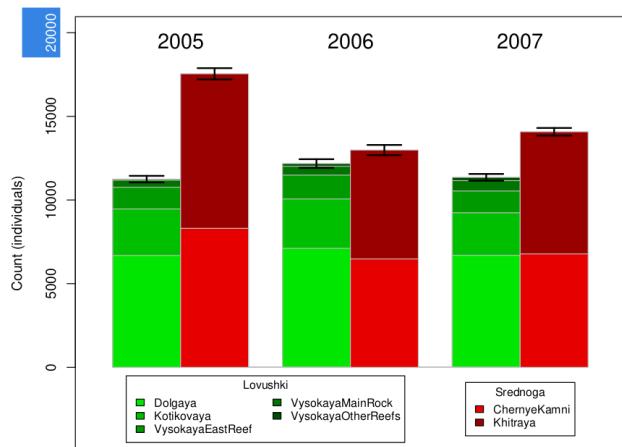
Individual counters



Pretty good agreement.

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Fur seal count: High Precision!



Point Estimate:

$$\widehat{N} = 28,792$$

Standard Error (s.e.):

$$\sigma_e = 216$$

95% Confidence Interval

$$\widehat{N} \pm 2\sigma_e = (28,630 - 29,220)$$

Coefficient of variation

$$\frac{\sigma_e}{\widehat{N}} = 0.75\%$$

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Fur seal count: Ecological question?

What does **the number of pups** really tell you about a population?



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