

# Sensitivity analysis identifies high influence sites for estimates of penguin krill consumption on the Antarctic Peninsula

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**Abstract:** Krill consumption by natural predators represents a critical link between surveys and models of standing krill biomass and the design of a sustainable krill fishery for the Scotia Sea. Antarctic krill (*Euphausia superba*) is a significant component of diet for penguins breeding in this region and, consequently, uncertainties regarding penguin population abundances contribute to uncertainties in krill predation estimates. We use a comprehensive database of Antarctic penguin abundances to identify 14 breeding colonies that contribute most significantly to uncertainty regarding the total number of pygoscelid penguins breeding in this region. We find that a high quality survey of Zavodovski Island alone would decrease uncertainty in total population by 24.8%, whereas high quality surveys of all 14 “high-influence” locations would decrease uncertainty by almost 72%. Updated population estimates at these sites should be considered top priority for future fieldwork in the region. Our results are based on a robust quantitative method for assessing data priorities in estimating krill consumption that is easily extended to other groups of krill predators.

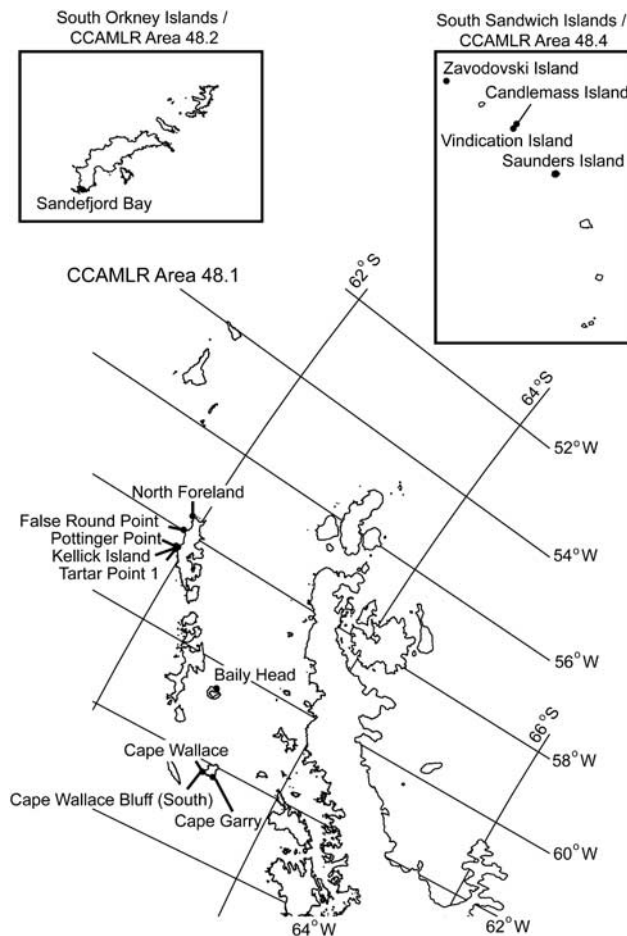
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## Introduction

The standing biomass and spatiotemporal dynamics of Antarctic krill (*Euphausia superba* Dana) is a major focus of Antarctic research, with considerable effort focused on modelling rates of krill consumption by Antarctic predators. In 2004, the Commission for the Conservation of Antarctic Marine Living Resources (CCAMLR) tasked a sub-group of the Working Group on Ecosystem Monitoring and Management (WG-EMM) to determine what was currently known about populations of Antarctic krill predators breeding in the Antarctic (Southwell *et al.* 2009). In 2008, a workshop was held in Hobart, Australia with the aim of initiating an effort to: 1) consider procedures for deriving abundance estimates for priority land-based predator species in the south-west Atlantic region between 70°W and 30°W, 2) examine available existing datasets to determine the degree to which minimum data requirements are met, and identify inadequacies or gaps in existing data, and 3) identify and prioritize gaps in existing data as a basis for assessing whether, where and how any future survey work would be conducted. Pursuant to these objectives, a comprehensive database of penguin breeding locations and abundances was created by the task group (Southwell *et al.* 2009). This database contained, for each snow-free coastal area in Food and Agricultural Organization (FAO) Statistical Area 48 either known to host breeding penguins or confirmed as

devoid of breeding penguins, the following information: the most current census data (including confirmed absences) and, where appropriate, derived population estimates, along with ancillary information pertaining to the date of last census, the object counted (e.g. occupied nests, adults, etc.), census precision, and the method of census (e.g. count of individuals from the ground etc.). We used this database to identify those locations that contribute most significantly to uncertainty in estimates of the total breeding penguin population for FAO Statistical Area 48, which includes the Antarctic Peninsula and the South Shetland Islands (Subarea 48.1), the South Orkney Islands (Subarea 48.2), South Georgia (Subarea 48.3) and the South Sandwich Islands (Subarea 48.4) (Fig. 1). Area 48 is one area in which the Antarctic krill fishery operates and where there is the greatest potential for resource overlap between the fishery and krill-dependent predators such as penguins. We considered breeding populations of all three species of *Pygoscelis* penguin (gentoo penguins (*Pygoscelis papua* Forster), Adélie penguins (*P. adeliae* (Hombron & Jacquinot)), and chinstrap penguins (*P. antarctica* Forster)). Macaroni penguins (*Eudyptes chrysolophus* Brandt) are also important consumers of krill, however, their population in Area 48 occurs largely at South Georgia where the population has been reviewed recently by Trathan *et al.* (2012). Elsewhere in Area 48 macaroni penguin colonies are relatively small and so were not considered in our analysis.



**Fig. 1.** Study area. Map of the 14 high-influence breeding locations within CCAMLR Area 48. Note that Area 48.3 is not shown.

## Methods

Three pieces of information were included for each site in the database: 1) the population estimate (number of breeding pairs), 2) the uncertainty of the census, and 3) the year of the most recent census. Census uncertainty was defined by the commonly adopted and widely accepted five-point scale used by earlier authors (e.g. Croxall & Kirkwood 1979, Woehler 1993, Naveen & Lynch 2011; note that in our analysis the upper bound for N3 has been increased from 15% to 25% to ensure continuity):

- N(C)1 Nests (chicks) individually counted, accurate to better than  $\pm 5\%$
- N(C)2 Nests (chicks) individually counted, accurate to 5–10%
- N(C)3 Accurate estimate of nests (chicks), accurate to 10–25%
- N(C)4 Rough estimate of nests (chicks), accurate to 25–50%

**Table 1.** Penguin breeding sites for which no complete population estimates were available. “Depot islet” is an unofficial name.

Site name	Latitude	Longitude
Atriceps Island	60.76°	45.15°
Auguste Island	64.05°	61.62°
Beagle Island	63.42°	54.67°
Bernardo O’Higgins Station	63.32°	57.90°
Bruce Island	60.68°	44.90°
Bryde Island	64.87°	63.03°
Cape Belsham	61.08°	54.88°
Cape Lookout	61.27°	55.20°
Cape Murray	64.35°	61.61°
Carlota Cove	62.37°	59.69°
Christoffersen Island	60.73°	45.03°
Cockburn Island	64.20°	56.83°
Cone Island	67.69°	69.16°
Cape Hansen, Coronation Island	60.66°	45.59°
Other localities, Coronation Island	60.67°	45.44°
Depot islet	66.38°	65.92°
Dundee Island	63.44°	56.17°
Etna Island	63.09°	55.16°
Gibson Bay	63.30°	55.84°
Gourdin Island	63.20°	57.30°
Hennequin Point	62.12°	58.40°
Hermit Island	64.80°	64.03°
Hovgaard Island	65.13°	64.12°
Jenny Island	67.71°	68.44°
Jorge Island	62.34°	59.71°
Laurie Island	60.77°	44.60°
Meier Point	60.64°	45.90°
Nancy Rock	62.23°	59.09°
Nansen Island	64.57°	62.10°
Nigg Rock	60.71°	44.83°
Peine Island	63.40°	54.70°
Pirie Peninsula	60.70°	44.65°
Plato Island	63.43°	54.67°
Point Martin	60.77°	44.68°
Rip Point	62.22°	59.03°
Saddle Island	60.61°	44.82°
Spine Island	60.60°	46.03°
Sprightly Island vicinity	64.30°	61.05°
Theodolite Hill	63.48°	57.58°
Un-named island north of Dee Island	62.52°	59.78°
Weddell Island	60.63°	44.82°
Wide Open Islands	63.00°	55.83°
Withen Island	62.26°	59.14°

N(C)5 Estimate of nests (chicks) to nearest order of magnitude

Our analysis involved a stochastic simulation in which the current penguin population at each site was drawn from a random distribution based on available information. An ensemble of these random draws resulted in a statistical distribution reflecting the accumulation of all pertinent sources of uncertainty. The simulation involved six stages. We illustrate this here using an N2 count of penguins in 1995. Note that for clarity, all stochastically drawn variables are capitalized and given the index *i* to emphasize that the entire process is repeated to build a distribution that informs

**Table II.** High leverage sites identified by our analysis, ranked by the p-value associated with Levene's test as applied to the population variance before and after updating a site's counts (see text). Results from the randomization test are also included for comparison.

Rank	Location (lat, long)	Individual contribution (% of total uncertainty)	Levene's test F value (p-value)	p-value from randomization test	Cumulative percentage
1	Zavodovski Island (56.30°, 27.57°)	24.8%	3390.7 (< 0.001)	< 0.001	24.8%
2	Sandefjord Bay (60.62°, 46.05°)	9.6%	472.4 (< 0.001)	< 0.001	37.2%
3	Cape Wallace (63.23°, 62.23°)	6.4%	184.9 (< 0.001)	< 0.001	48.2%
4	Pottinger Point (61.94°, 58.35°)	3.3%	47.2 (< 0.001)	< 0.001	53.6%
5	Cape Garry (63.34°, 62.23°)	2.9%	39.7 (< 0.001)	< 0.001	59.8%
6	False Round Point (61.90°, 57.99°)	2.4%	26.0 (< 0.001)	< 0.001	65.4%
7	Kellick Island (61.92°, 58.39°)	1.4%	13.0 (< 0.001)	0.001	65.9%
8	Cape Wallace Bluff (south) (63.23°, 62.23°)	1.3%	12.0 (0.001)	0.001	67.9%
9	Candlemass Island (57.08°, 26.67°)	1.5%	9.5 (0.002)	< 0.001	69.3%
10	Tartar Point 1 (61.93°, 58.43°)	1.1%	6.1 (0.013)	0.007	69.6%
11	North Foreland (61.89°, 57.68°)	0.9%	3.8 (0.051)	0.016	69.9%
12	Baily Head (62.96°, 60.50°)	0.9%	3.0 (0.082)	0.025	70.6%
13	Saunders Island (57.78°, 26.47°)	0.8%	2.1 (0.151)	0.037	71.4%
14	Vindication Island (57.10°, 26.79°)	0.7%	1.7 (0.186)	0.041	71.5%

us as to the variability in the population estimates. The simulation procedure was as follows:

1. Draw a fractional error for the original census. Using our example of an N2 count in 1995/96, we would draw a number ( $E^i$ ) from the uniform distribution  $\text{Unif}(0.05, 0.10)$  to represent the assumed uncertainty of the original count, i.e.

$$E^i \sim \text{Unif}(0.05, 0.10)$$

2. Draw a count for the true population size ( $C_{true}^i$ ) at the time of the most recent census (in this case, 1995/96), i.e.

$$C_{true}^i \sim N\left(C_{original}, \left[\frac{E^i}{2} C_{original}\right]^2\right),$$

Where  $C_{original}$  is the actual census count and we have assumed that  $E^i$  represents two standard deviations.

3. To extrapolate from the date of the original count to the present, we used species-specific estimates of the annual population multiplier ( $R_{sp}$ ) (1 + annual rate of change  $\pm$  1 standard error) from Lynch *et al.* (2012a) ( $0.989 \pm 0.008$  (chinstrap),  $0.966 \pm 0.013$  (Adélie),  $1.024 \pm 0.003$  (gentoo)). These represent the best available estimates of regional population

change. For each year  $t$  since the last census, we draw a rate of population change  $R^{i,t}$  from this distribution:

$$R^{i,t} \sim N(R_{sp}, \sigma_{sp}^2).$$

4. We extrapolate from the date of original census to the 2011/12 season using

$$C_{updated}^i = C_{true}^i \times \prod_t R^{i,t},$$

where  $t$  includes each year between 2011/12 and the season of the original count (in our example, 1995/96).

5. Updated counts ( $C_{updated}^i$ ) for each of the  $N$  sites in the database are summed to arrive at an estimate of the total penguin population for that iteration ( $P^i$ ):

$$P^i = \sum_{j=1}^N C_{updated}^j.$$

6. Steps 1–5 were repeated 50 000 times to construct distributions for  $P^i$  and  $C_{updated}^i$  denoted  $P$  and  $C_{updated}$ .

Sites contributed significantly to variance in  $P$  (i.e. uncertainty in the total population of pygoscelid penguins) for one or more of three reasons: 1) large breeding

population, 2) only low precision estimates were available, or 3) the most recent population estimate was old. We weighted each species equally in our analysis, although data on krill consumption (and associated uncertainties) could be easily integrated as they become available.

A total of 30 sites were selected for consideration based on the absolute width of their  $C_{updated}$  distributions. We compared variance of  $P$  using the original data ( $P_{original}$ ) with the variance of  $P$  when a given site's census precision and dates were modified to a high quality count (N1) in the 2011/12 field season ( $P_{updated}$ ). Sites were considered "high influence" if the variance ratio  $VR = \text{var}(P_{original}) / \text{var}(P_{updated})$  was statistically significant. The distributions of  $P$  were marginally non-normal due to heavy tails, and therefore we used two tests of the variance ratio robust to non-normality. The first approach was to use Levene's test (centred at the 5% trimmed mean; function 'levene.test' in the R package 'car' (Fox & Weisberg 2011)) to test for equality of variances (Brown & Forsythe 1974). The second approach was a non-parametric randomization test in which VR was compared against the same statistic ( $VR^*$ ) calculated for 999 trials in which group membership for each population estimate  $P$  (i.e. belonging to  $P_{original}$  or to  $P_{updated}$ ) was randomly assigned. Using a one-tailed test, a  $p$ -value was assigned based on the fraction of randomization trials in which  $VR^* > VR$ . If only a small number of  $VR^*$  were larger than VR, this indicated that a variance ratio as large as VR was unlikely to have occurred by random chance. While recognizing the limitations inherent to such hypothesis tests (e.g. Cohen 1994), we inferred the relative importance of different sites by their before-updating vs after-updating variance ratios (VR) and used  $P = 0.05$  as an arbitrary but widely used cut-off for statistical significance.

It should be noted that all data available up to 31 December 2011 were used for this analysis. Several key censuses have been completed recently, but data were not available at the time of this analysis. These are addressed in the Discussion.

## Results

The total number of pygoscelid penguins in this region is estimated to be  $5.2 \pm 0.5$  (mean  $\pm$  2 s.e.) million breeding pairs, constituting over 84% of all the krill consuming penguins breeding in this region. This estimate is probably an underestimate, as we know of 43 breeding colonies (Table I) for which no estimates are available, some of which are known to have significant penguin populations.

Fourteen sites were identified as having high influence on total penguin population (Table II, Fig. 1), including four sites that were marginally insignificant according to Levene's test but were significant ( $P < 0.05$ ) using the randomization test. By far the most critical site for future census work was Zavodovski Island, in the South Sandwich

Islands (Subarea 48.4, Fig. 1) which contains (at last estimate) 1.5 million chinstrap penguins. The number of chinstrap penguins breeding on this island represents *c.* 30% of the global population and most recent estimates stem from Convey *et al.*'s survey work in 1997 and 1998 (Convey *et al.* 1999). A high quality (N1) census of Zavodovski Island would decrease uncertainty in the total penguin population by 24.8%. The next twelve sites contributed a smaller proportion of the total uncertainty, from 9.6% (Sandefjord Bay) to only 0.7% (Vindication Island). Updated high quality (N1) censuses for all 14 top priority sites decreased uncertainty in total penguin population by 71.5%.

## Discussion

Historically, logistical challenges have limited most penguin census work in Area 48 to either carefully studied but geographically limited populations adjacent to research stations or other permanent establishments (e.g. Fraser & Patterson 1997, Trathan *et al.* 2008, Carlini *et al.* 2009), and vessel-based opportunistic census work that is geographically extensive but not targeted to specific populations (e.g. Poncet & Poncet 1987, Naveen *et al.* 2000, Lynch *et al.* 2008, 2012a). By synthesizing a single database of all available penguin census records, we are able to identify those penguin colonies that are contributing most significantly to uncertainties surrounding the total population of penguins in the region, and subsequently, to estimates of natural predation of krill by penguins. Our analysis has shown the disproportionate impact that a small set of sites can have on overall uncertainties. These sites should be considered top priority for future census work. In fact, recent censuses of the South Sandwich Islands (including Zavodovski Island, Candlemass Island, Saunders Island, and Vindication Island) and of Deception Island (including Baily Head) were designed to address some of these concerns. These results however, were not available at the time of the analysis. Recent work demonstrating the utility of high-resolution commercial satellite imagery for quantitative penguin population estimates (Fretwell & Trathan 2009, Fretwell *et al.* 2012, Lynch *et al.* 2012b) offers a promising alternative to field studies and is one of the viable options for updating site-wide population estimates for the locations highlighted in Tables I & II.

Our analysis addressed uncertainties in the total population of penguins breeding in Area 48. A more direct estimate of uncertainties in krill predation will require more data on interspecific differences in per-capita krill consumption, which themselves may vary spatially and/or interannually. Our modelling approach is easily extended to include these differences and associated uncertainties. Despite its limitations, our analysis is the first to quantify the impact of census uncertainties on regional population estimates. Future efforts will focus on cross-taxa comparisons to

quantify the relative contribution to total krill consumption of each major krill predator in this region.

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### References

- BROWN, M.B. & FORSYTHE, A.B. 1974. Robust tests for the equality of variances. *Journal of the American Statistical Association*, **69**, 364–367.
- CARLINI, A.R., CORIA, N.R., SANTOS, M.M., NEGRETE, J., JUARES, M.A. & DANERI, G.A. 2009. Responses of *Pygoscelis adeliae* and *P. papua* populations to environmental changes at Isla 25 de Mayo (King George Island). *Polar Biology*, **32**, 1427–1433.
- COHEN, J. 1994. The Earth is round ( $p < 0.05$ ). *American Psychologist*, **49**, 997–1003.
- CONVEY, P., MORTON, A. & PONCET, J. 1999. Survey of marine birds and mammals of the South Sandwich Islands. *Polar Record*, **35**, 107–124.
- CROXALL, J.P. & KIRKWOOD, E.D. 1979. *The distribution of penguins on the Antarctic Peninsula and islands of the Scotia Sea*. Cambridge: British Antarctic Survey, 186 pp.
- FOX, J. & WEISBERG, S. 2011. *An R companion to applied regression*, 2nd ed. Thousand Oaks, CA: Sage Publications, 472 pp.
- FRASER, W.R. & PATTERSON, D.L. 1997. Human disturbance and long-term changes in Adélie penguin populations: a natural experiment at Palmer Station, Antarctic Peninsula. In BATTAGLIA, B., VALENCIA, J. & WALTON, D.W.H., eds. *Antarctic communities: species, structure, and survival*. Cambridge: Cambridge University Press, 445–452.
- FRETWELL, P.T. & TRATHAN, P.N. 2009. Penguins from space: faecal stains reveal the location of emperor penguin colonies. *Global Ecology and Biogeography*, **18**, 543–552.
- FRETWELL, P.T., LARUE, M.A., MORIN, P., KOOYMAN, G.L., WIENECKE, B., RATCLIFFE, N., FOX, A.J., FLEMING, A.H., PORTER, C. & TRATHAN, P.N. 2012. An emperor penguin population estimate: the first global, synoptic survey of a species from space. *PLoS ONE*, **7**, e33751.
- LYNCH, H.J., NAVEEN, R. & FAGAN, W.F. 2008. Censuses of penguin, blue-eyed shag *Phalacrocorax atriceps* and southern giant petrel *Macronectes giganteus* populations on the Antarctic Peninsula, 2001–2007. *Marine Ornithology*, **36**, 83–97.
- LYNCH, H.J., NAVEEN, R., TRATHAN, P.N. & FAGAN, W.F. 2012a. Spatially integrated assessment reveals widespread changes in penguin populations on the Antarctic Peninsula. *Ecology*, **93**, 1367–1377.
- LYNCH, H.J., WHITE, R., BLACK, A.D. & NAVEEN, R. 2012b. Detection, differentiation, and abundance estimation of penguin species by high-resolution satellite imagery. *Polar Biology*, **35**, 963–968.
- NAVEEN, R. & LYNCH, H.J. 2011. *Antarctic Peninsula compendium*, 3rd ed. Washington, DC: Environmental Protection Agency, 374 pp.
- NAVEEN, R., FORREST, S.C., DAGIT, R.G., BLIGHT, L.K., TRIVELPIECE, W.Z. & TRIVELPIECE, S.G. 2000. Censuses of penguin, blue-eyed shag, and southern giant petrel populations in the Antarctic Peninsula region, 1994–2000. *Polar Record*, **36**, 323–334.
- PONCET, S. & PONCET, J. 1987. Censuses of penguin populations of the Antarctic Peninsula, 1983–87. *British Antarctic Survey Bulletin*, No. 77, 109–129.
- SOUTHWELL, C., FORCADA, J., GOEBEL, M., HINKE, J., LYNCH, H., LYVER, P., MCKINLAY, J., RATCLIFFE, N., RAMM, D., REID, K., REISS, C., TRIVELPIECE, W., TRIVELPIECE, S. & TRATHAN, P. 2009. Update on progress in inter-session work from the Predator Survey workshop. Document *WG-EMM-09/39*. Hobart, TAS: CCAMLR, 7 pp.
- TRATHAN, P.N., RATCLIFFE, N. & MASDEN, E.A. 2012. Ecological drivers of change at South Georgia: the krill surplus, or climate variability. *Ecography*, 10.1111/j.1600-0587.2012.07330.x.
- TRATHAN, P.N., FORCADA, J., ATKINSON, R., DOWNIE, R.H. & SHEARS, J.R. 2008. Population assessments of gentoo penguins (*Pygoscelis papua*) breeding at an important Antarctic tourist site, Goudier Island, Port Lockroy, Palmer Archipelago, Antarctica. *Biological Conservation*, **141**, 3019–3028.
- WOEHLER, E.J. 1993. *The distribution and abundance of Antarctic and sub-Antarctic penguins*. Cambridge: Scientific Committee on Antarctic Research, 76 pp.