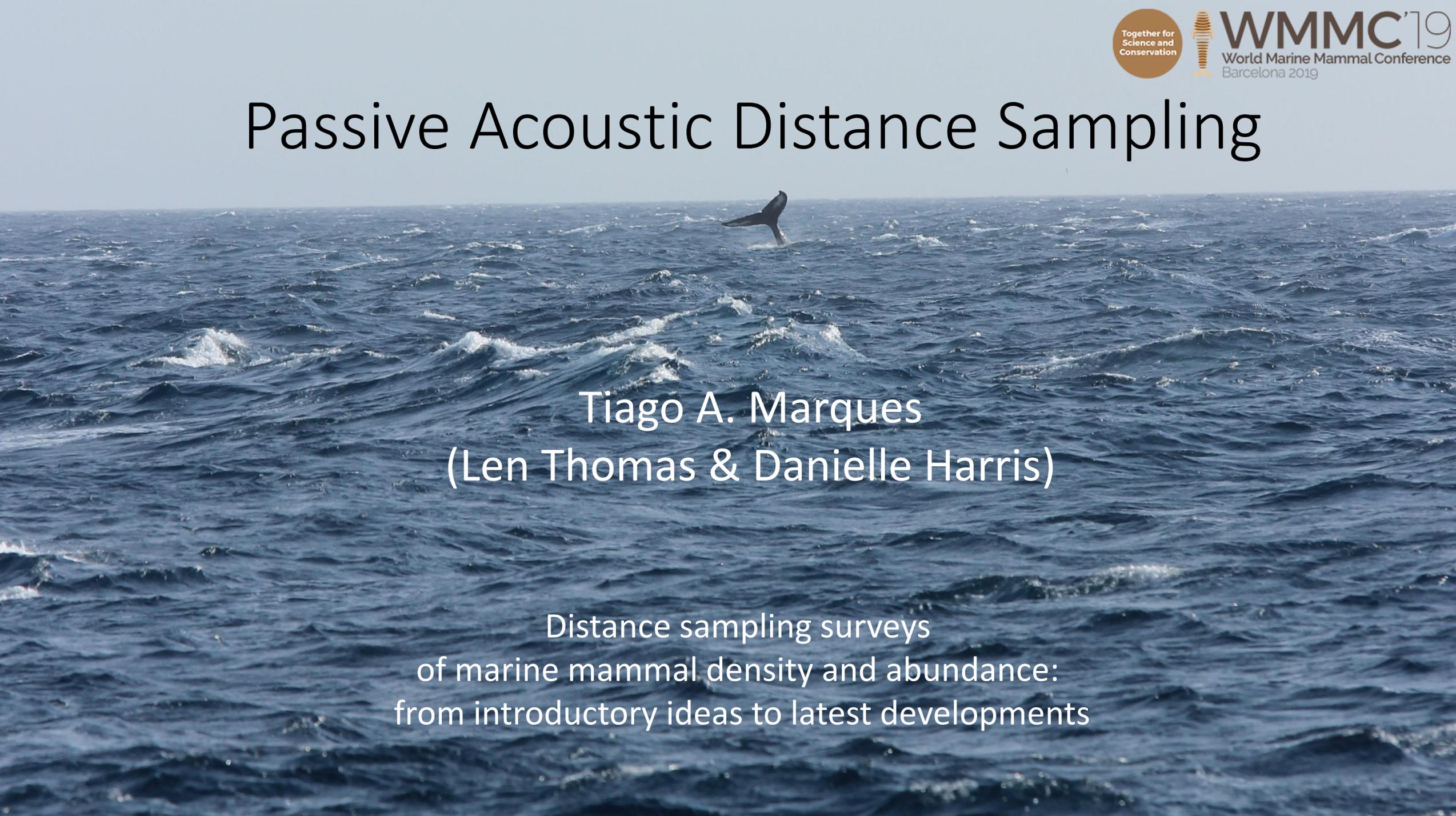




# Passive Acoustic Distance Sampling



Tiago A. Marques  
(Len Thomas & Danielle Harris)

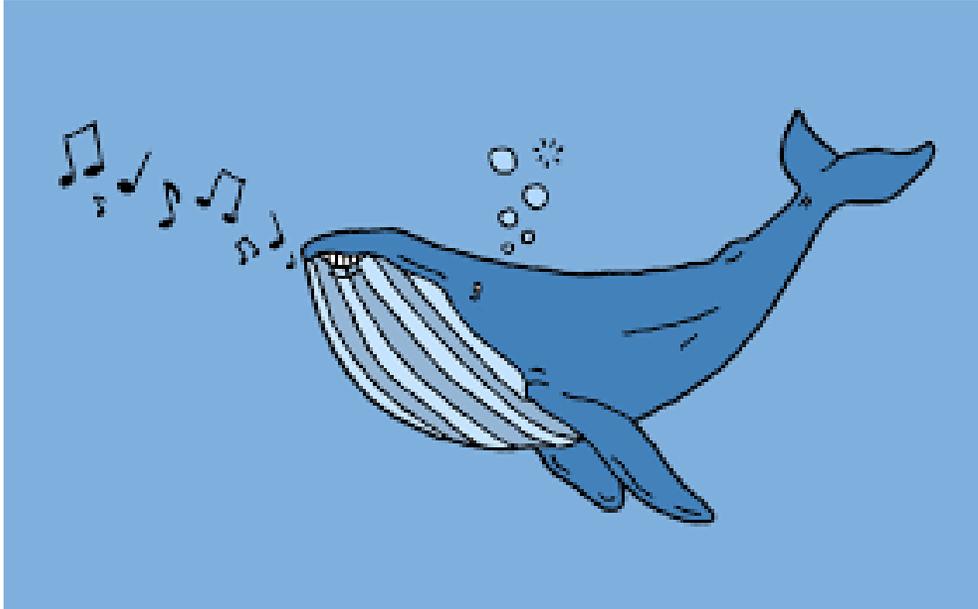
Distance sampling surveys  
of marine mammal density and abundance:  
from introductory ideas to latest developments

A polar bear is lying on its back on a snowy surface. The bear's head is on the right, and its body extends towards the left. A large thought bubble is positioned above the bear's head, containing text. To the right of the bear, a series of four smaller circles of increasing size lead from the bear's head towards the main thought bubble.

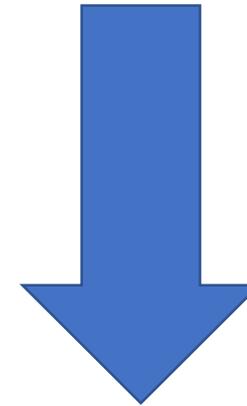
I am possibly the best  
marine mammal for  
visual surveys 😊!

# Visual methods are...

- Dependent on day light
- Dependent on weather
- Temporally restricted (hard to automate recordings, so depends heavily on humans)
- Far from ideal for animals that spend most of their time submerged



But since (most) marine mammals produce (“easily” identifiable) species specific sounds, and these can be identified often further away that visual detections can occur, passive acoustic density estimation has seen huge developments in the last decade.



Here we focus on distance sampling developments, but a range of other applications for passive acoustic data, including major developments in spatially explicit capture recapture methods, have also been developed

# Estimating animal population density using passive acoustics

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<sup>6</sup>*Sea Mammal Research Unit, Scottish Oceans Institute, University of St. Andrews, Fife, KY16 8LB, UK*

# Passive acoustic distance sampling

Actually, nothing new there, people have been doing it for many many years with birds!

*Ecological Applications*, 17(3), 2007, pp. 948–955  
© 2007 by the Ecological Society of America

## FACTORS AFFECTING AURAL DETECTIONS OF SONGBIRDS

MATHEW W. ALLDREDGE,<sup>1,4</sup> THEODORE R. SIMONS,<sup>2</sup> AND KENNETH H. POLLOCK<sup>3</sup>

<sup>1</sup>North Carolina

*Key words:* auditory detection; detection probability; observer differences; point counts; singing rate; species difference; warblers.

<sup>2</sup>USGS, North Carolina

<sup>3</sup>Zoology, Biomathematics, and

### INTRODUCTION

Point count survey, in which observers record all seen or heard at a point within a specified time (Ralph et al. 1995), is the most common method used in bird population studies (Pollock et al. 2002, Diefenbach et al. 2003).

experimental approach to quantify several factors that affect detection probabilities on point count surveys.

Surveys in heavily vegetated habitats rely almost exclusively on auditory detections (Faanes and Bystrak 1981, Scott et al. 1981, Dejong and Emlen 1985), and most use unadjusted counts as an index of population

A key aspect of those forest studies always has been that the focus of the survey, the object of interest, were the animals themselves

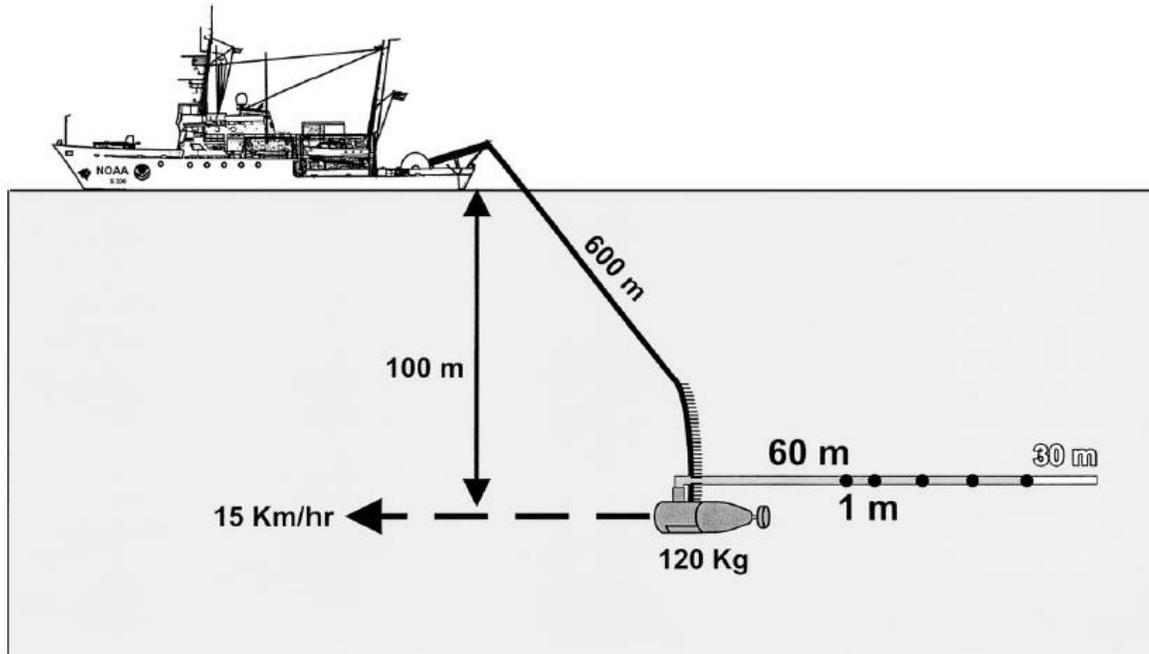


Therefore key constraints were animal movement and double counting of animals

# Fixed PAM vs. Towed PAM

Line transects

Point transects



*Figure 1.* Diagram showing the tow cable, depressor weight, and horizontal hydrophone array used for the acoustic survey (not to scale). The lower 30 m of the tow cable was fared to reduce drag and cable strum. A nylon rope was used to stabilize the last 30 m at the tail of the array.

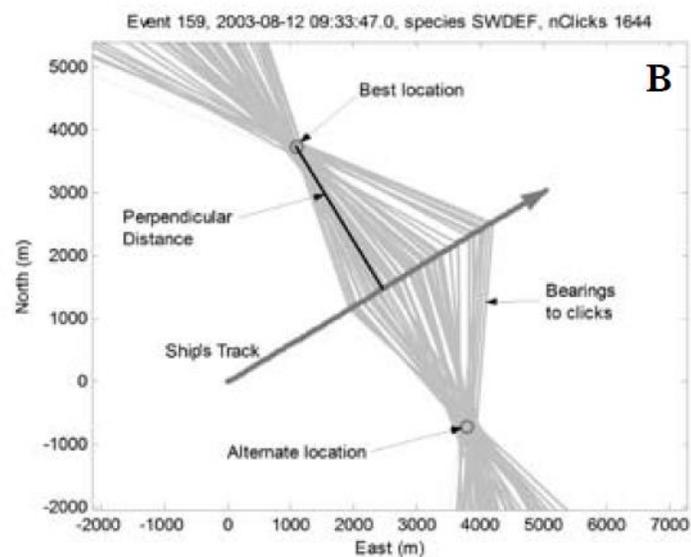
MARINE MAMMAL SCIENCE, 21(3):429–445 (July 2005)  
© 2005 by the Society for Marine Mammalogy

## ESTIMATES OF SPERM WHALE ABUNDANCE IN THE NORTHEASTERN TEMPERATE PACIFIC FROM A COMBINED ACOUSTIC AND VISUAL SURVEY

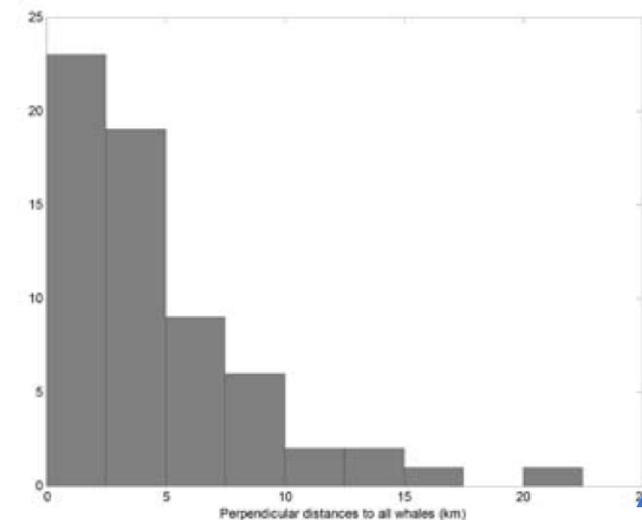
JAY BARLOW  
BARBARA L. TAYLOR  
Southwest Fisheries Science Center  
8604 La Jolla Shores Drive, La Jolla, California 92037, U.S.A.  
jay.barlow@noaa.gov

# Sperm whale distribution and seasonal density in the Faroe Shetland Channel

GORDON D. HASTIE\*, RENÉ J. SWIFT\*, JONATHAN C.D. GORDON†, GEORGE SLESSER‡ and WILLIAM R. TURRELL‡



**Figure 2.** (A) Angle, relative to boat, of the clicks of two sperm whales as the vessel passed by; (B) reconstruction of one whale's position to estimate perpendicular distance.



**Figure 3.** Histogram of perpendicular distances to all located sperm whales.

25km

*J. Mar. Biol. Ass. U.K.* (2007), **87**, 353–357  
Printed in the United Kingdom

doi: 10.1017/S0025315407054896

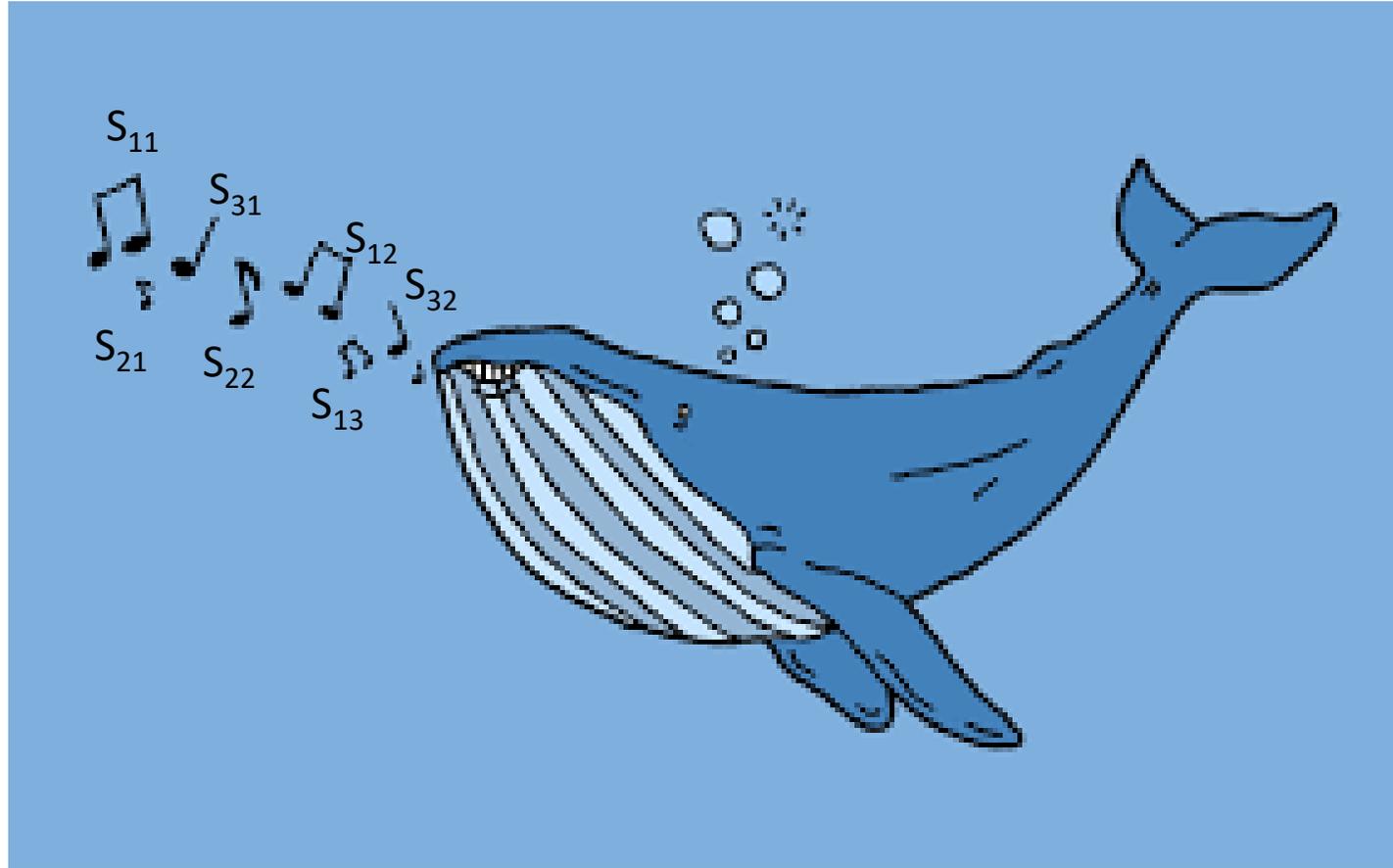
## Sperm whale abundance estimates from acoustic surveys of the Ionian Sea and Straits of Sicily in 2003

T. Lewis\*, D. Gillespie, C. Lacey, J. Matthews, M. Danbolt, R. Leaper, R. McLanaghan and A. Moscrop

'Song of the Whale' Team, International Fund for Animal Welfare, 87–90 Albert Embankment, London, SE1 7UD, UK.

\*Corresponding author, e-mail: whalesong@ifaw.org

The use of passive acoustics distance sampling for marine mammals greatly leveraged on switching the focus from animals to cues (here the individual sounds)



So was that something new from acoustics?

... not really 😊!

# Cue counting: using whale blows to estimate whale abundance (needs a blow rate production)



Minke whale abundance estimation from the NASS 1987 and 2001 aerial cue-counting surveys taking appropriate account of distance estimation errors

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## ABSTRACT

We estimate the abundance of minke whales (*Balaenoptera acutorostrata*) from the Icelandic coastal shelf aerial surveys carried out as part of the 1987 and 2001 North Atlantic Sightings Surveys (NASS). In the case of the 1987 survey, the probability of detecting animals at distance zero ( $g(0)$ ) is very close to 1 but there is substantial random measurement error in estimating distances. To estimate abundance from these data, we use methods which assume  $g(0)=1$  but which include a distance measurement error model. In the case of the 2001 survey, measurement errors were sufficiently small to be negligible, and we use double platform methods which estimate  $g(0)$  and assume no measurement error to estimate abundance. From the 1987 survey, we estimate abundance to be 24,532 animals, with 95% CI (13,399; 44,916). From the 2001 NASS survey data, minke whale abundance is estimated to be 43,633 animals, with 95% CI (30,148; 63,149).

Borchers, D.L., Pike, D.G., Gunnlaugsson, Th. and Víkingsson, G.A. 2009. Minke whale abundance estimation from the NASS 1987 and 2001 aerial cue-counting surveys taking appropriate account of distance estimation errors. *NAMMCO Sci. Publ.* 7:95-110.

# Estimating cetacean population density using fixed passive acoustic sensors: An example with Blainville's beaked whales

First output from  
DECAF project

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*Centre for Research into Ecological and Environmental Modelling, The Observatory,  
University of St Andrews, St Andrews KY16 9LZ, Scotland*

Jessica Ward and Nancy DiMarzio

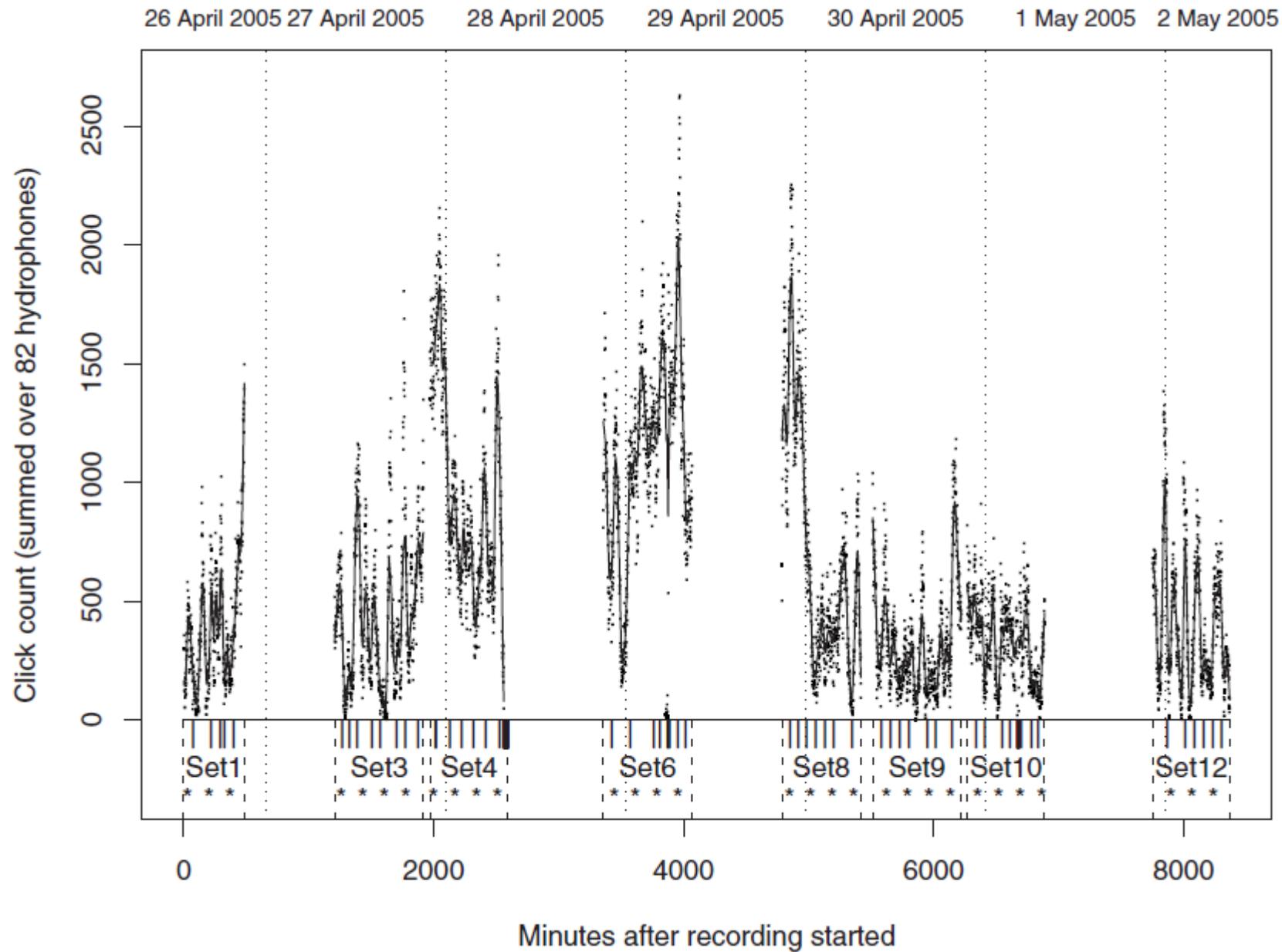
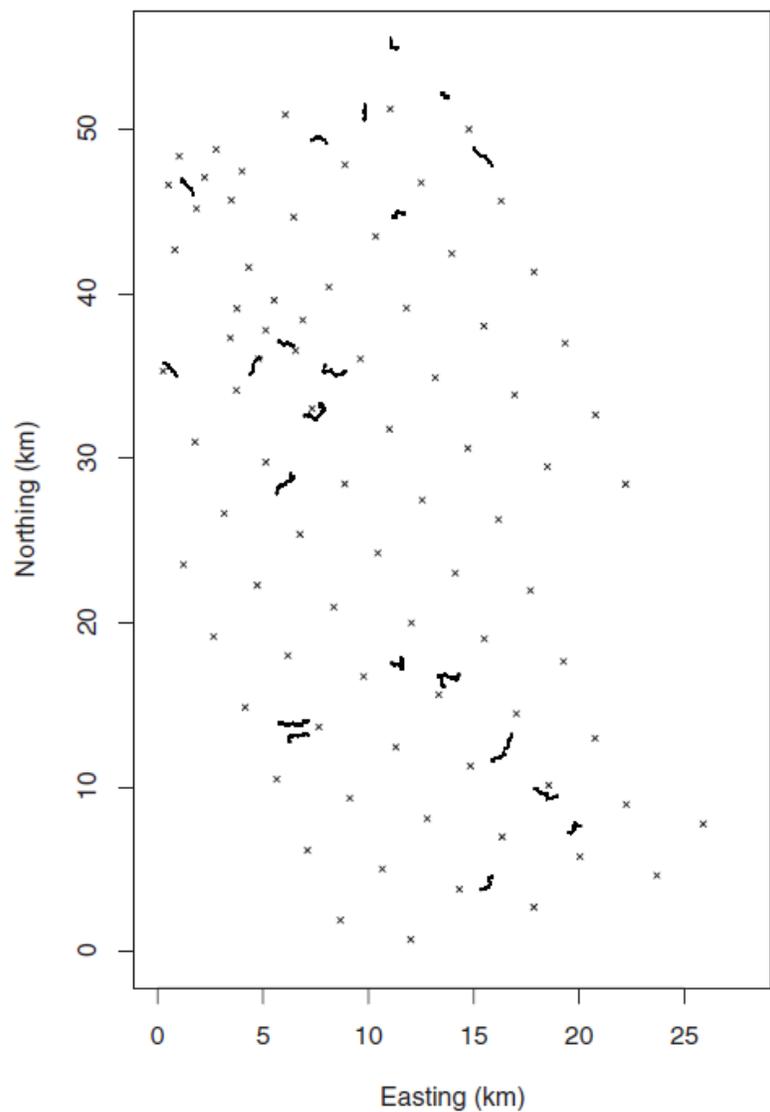
*Naval Undersea Warfare Center Division, 1176 Howell Street, Newport, Rhode Island 02841*

Peter L. Tyack

*Woods Hole Oceanographic Institution, Woods Hole, Massachusetts 02543*

(Received 2 December 2008; revised 3 February 2009; accepted 5 February 2009)

Methods are developed for estimating the size/density of cetacean populations using data from a set of fixed passive acoustic sensors. The methods convert the number of detected acoustic cues into animal density by accounting for (i) the probability of detecting cues, (ii) the rate at which animals produce cues, and (iii) the proportion of false positive detections. Additional information is often required for estimation of these quantities, for example, from an acoustic tag applied to a sample of animals. Methods are illustrated with a case study: estimation of Blainville's beaked whale density over a 6 day period in spring 2005, using an 82 hydrophone wide-baseline array located in the Tongue of the Ocean, Bahamas. To estimate the required quantities, additional data are used from digital acoustic tags, attached to five whales over 21 deep dives, where cues recorded on some of the dives are associated with those received on the fixed hydrophones. Estimated density was 25.3 or 22.5 animals/1000 km<sup>2</sup>, depending on assumptions about false positive detections, with 95% confidence intervals 17.3–36.9 and 15.4–32.9. These methods are potentially applicable to a wide variety of marine and terrestrial species that are hard to survey using conventional visual methods. © 2009 Acoustical Society of America. [DOI: 10.1121/1.3089590]

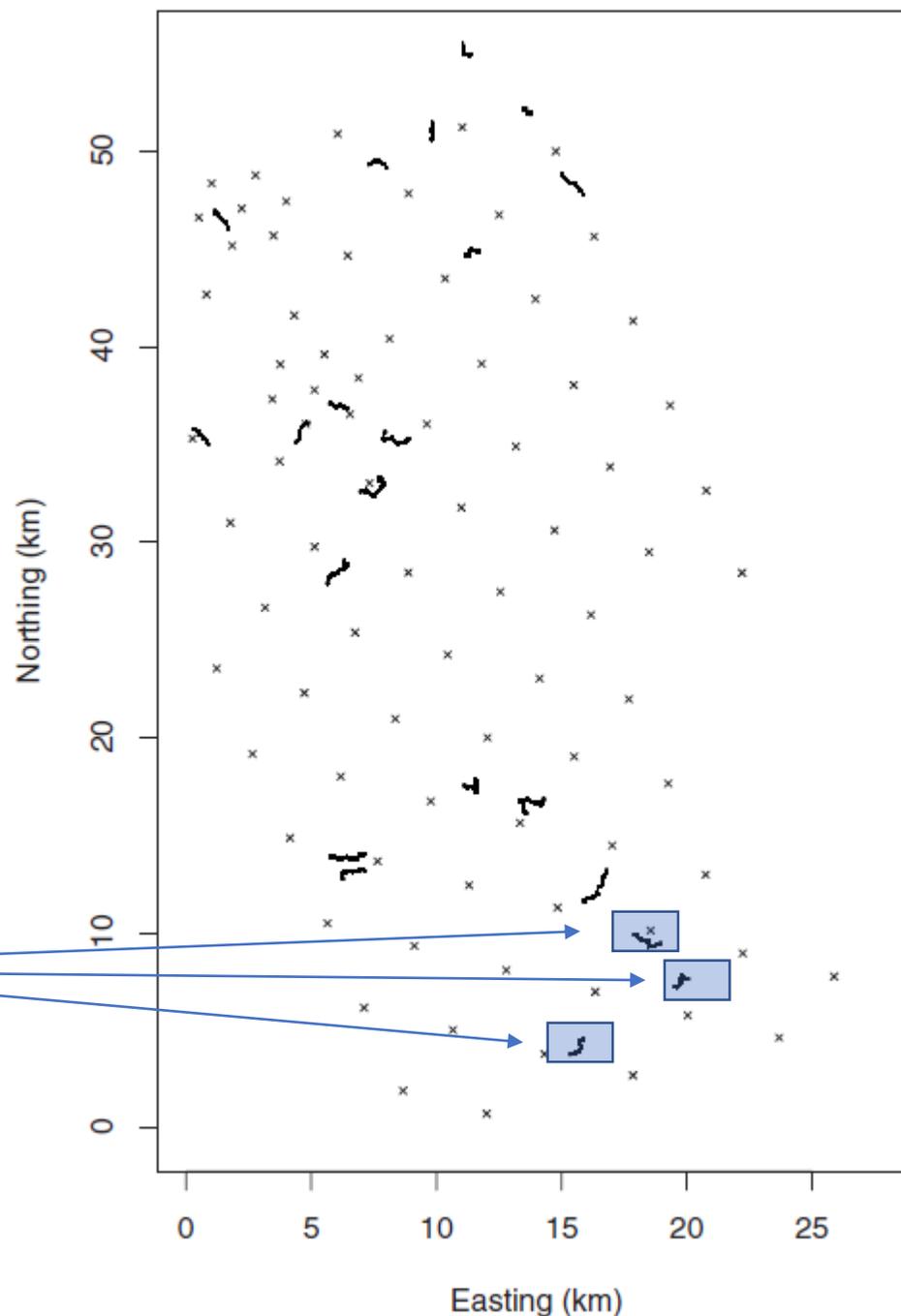


song unit, echolocation click, etc. Considering Eq. (2), an estimate of density  $\hat{D}$  from the  $n_c$  detected cues over a time period  $T$  (and additional information detailed below) can be obtained by

$$\hat{D} = \frac{n_c(1 - \hat{c})}{K\pi w^2 \hat{P} \hat{r}} \quad (3)$$

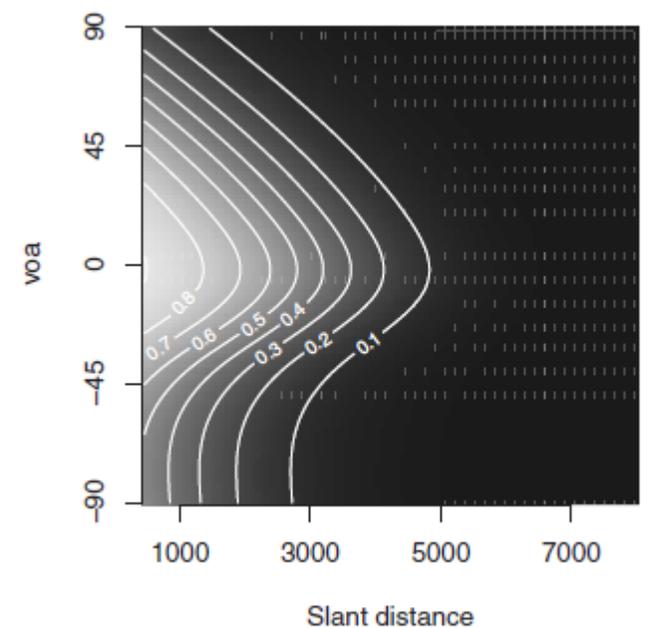
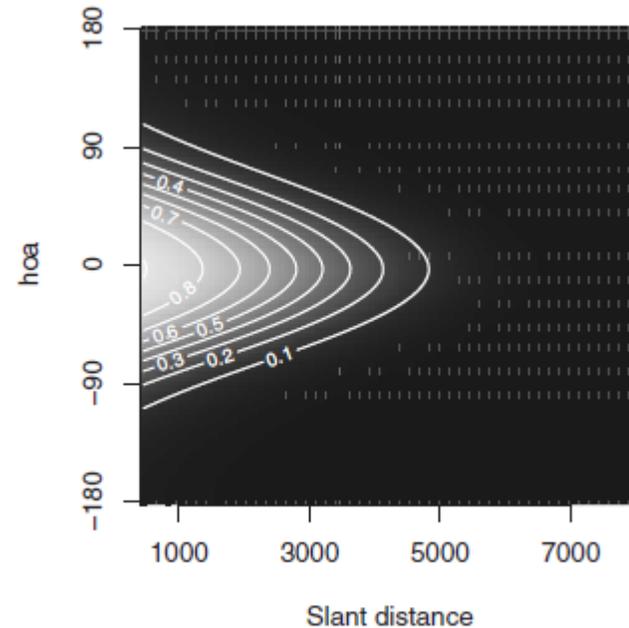
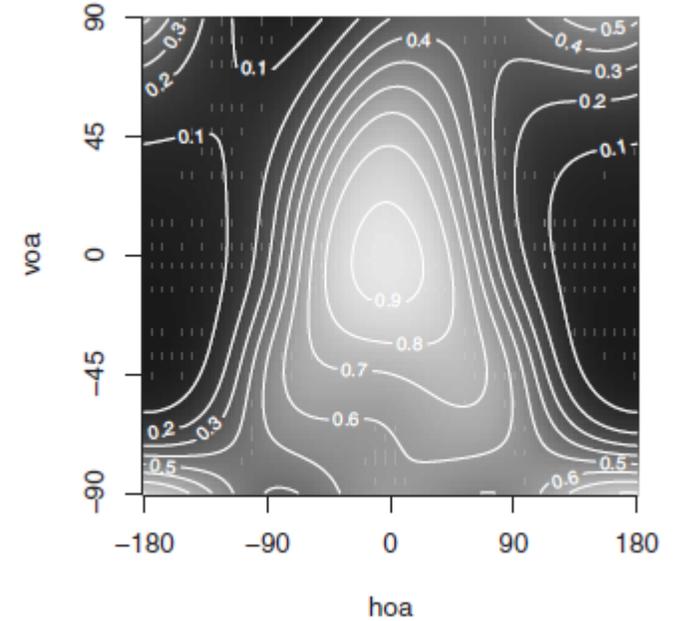
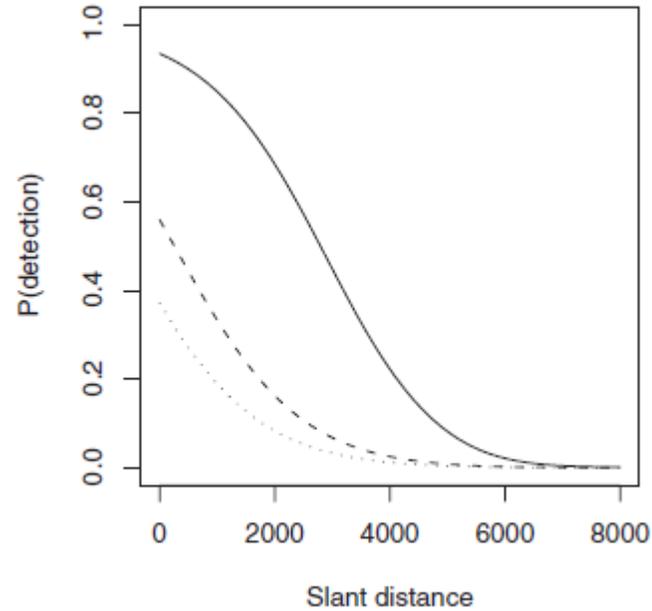
where  $w$  is the distance away from the hydrophones beyond which cues are assumed to not be detected,  $\hat{P}$  is the estimated average probability of detecting a cue made within distance  $w$ ,  $\hat{r}$  is the estimated cue production rate,  $\hat{c}$  is the estimated proportion of false positive detections, and  $K$  is the number of replicate sensors used.

Tag	Date	Number of Dives	Dives for $g(y)$
Md296	23 Oct 2006	3	3
Md227	15 Aug 2007	6	0
Md245	2 Sep 2007	4	3
Md248a	5 Sep 2007	4	4
Md248b	5 Sep 2007	4	3
Total		21	13



Each click produced by a tagged whale was detected, or not, in the surrounding hydrophones

We don't know the distances to detected clicks, but we can model the detection probability and get a detection probability!

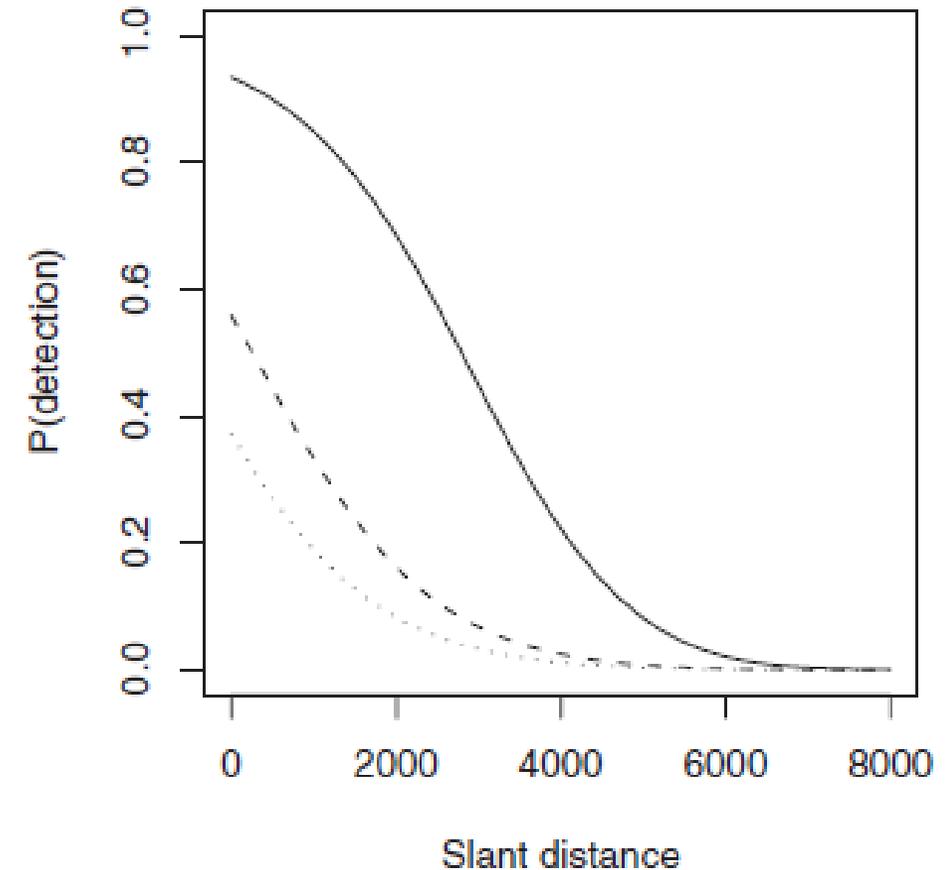


Exactly the same detection function concept, just estimated with a different type of data (detected vs. non detected, i.e. a logistic regression)

Why not straightforward distance sampling?

Because distances could not be directly obtained from the detected sounds.

Well... not often... but sometimes they can!



# From echolocation clicks to animal density—Acoustic sampling of harbor porpoises with static dataloggers

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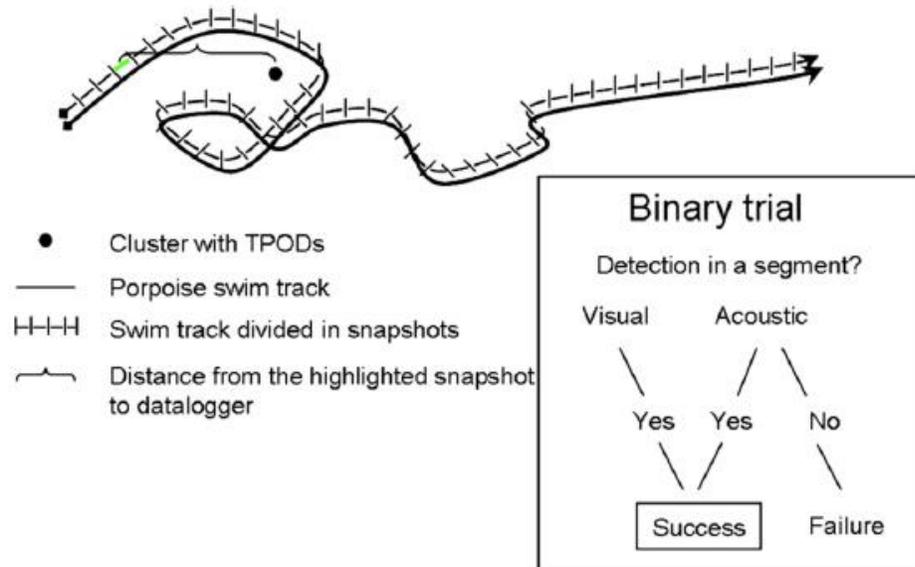
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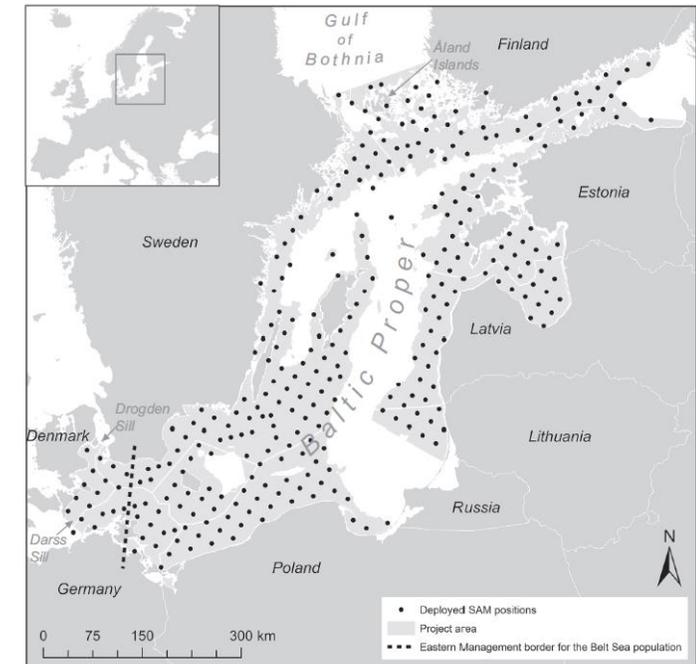
(Received 24 March 2011; revised 5 October 2011; accepted 19 October 2011)



## Basin-scale distribution of harbour porpoises in the Baltic Sea provides basis for effective conservation actions



Ida Carlén<sup>a,b,\*</sup>, Len Thomas<sup>c</sup>, Julia Carlström<sup>a,1</sup>, Mats Amundin<sup>d,2</sup>, Jonas Teilmann<sup>e</sup>, Nick Tregenza<sup>f</sup>, Jakob Tougaard<sup>e</sup>, Jens C. Koblitz<sup>g,3,4</sup>, Signe Sveegaard<sup>e</sup>, Daniel Wennerberg<sup>d</sup>, Olli Loisa<sup>h</sup>, Michael Dähne<sup>g</sup>, Katharina Brundiers<sup>g</sup>, Monika Kosecka<sup>i,5</sup>, Line Anker Kyhn<sup>e</sup>, Cinthia Tiberi Ljungqvist<sup>d,6</sup>, Iwona Pawliczka<sup>i</sup>, Radomil Koza<sup>i</sup>, Bartłomiej Arciszewski<sup>i</sup>, Anders Galatius<sup>e</sup>, Martin Jabbusch<sup>g</sup>, Jussi Laaksonlaita<sup>h</sup>, Jussi Niemi<sup>h</sup>, Sami Lyytinen<sup>h</sup>, Anja Gallus<sup>g</sup>, Harald Benke<sup>g</sup>, Penina Blankett<sup>j</sup>, Krzysztof E. Skóra<sup>i</sup>, Alejandro Acevedo-Gutiérrez<sup>k</sup>



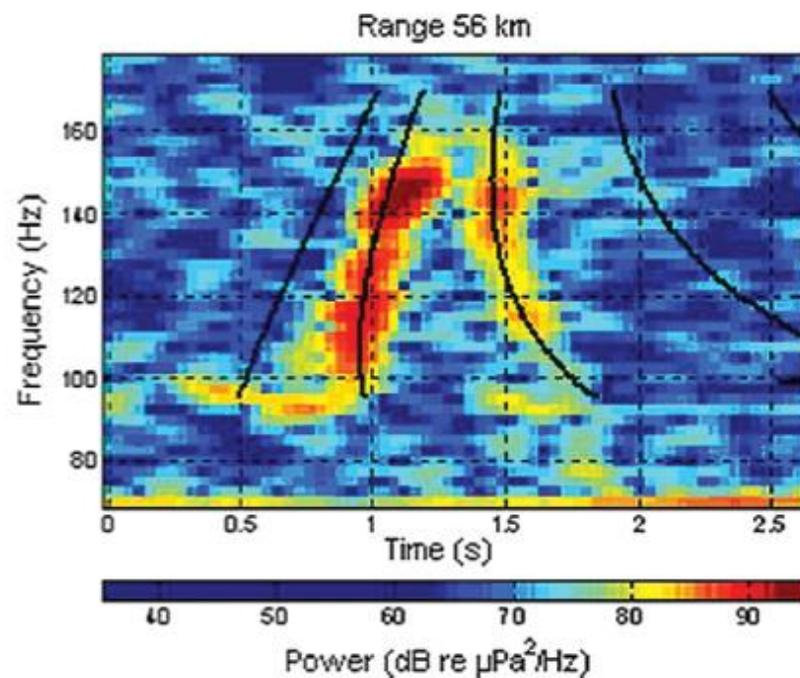
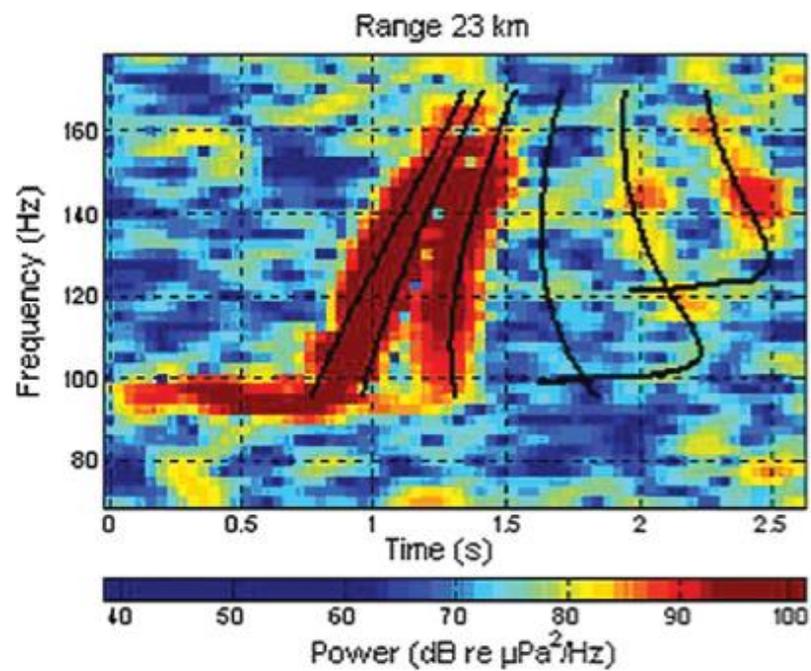


FIG. 3. (Color online) Spectrograms of a single right whale call received on two easternmost ARPs (site C and D), with overlaid normal mode arrivals of synthetic call based on range estimates, given above each call. Figure adapted with permission from Wiggins *et al.* (2004) in Canadian Acoustics.



# Estimating North Pacific right whale *Eubalaena japonica* density using passive acoustic cue counting

Tiago A. Marques<sup>1,2,\*</sup>, Lisa Munger<sup>3</sup>, Len Thomas<sup>1</sup>, Sean Wiggins<sup>3</sup>,  
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<sup>3</sup>Scripps Institution of Oceanography, University of California San Diego, 9500 Gilman Drive, La Jolla,  
California 92093-0205, USA

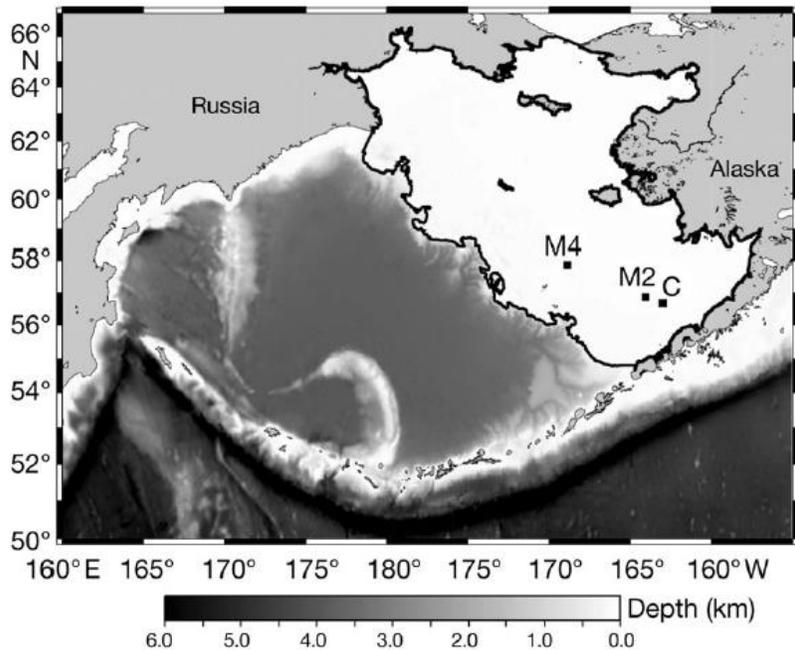


Fig. 1. Bering Sea, with location of sensors (C, M2, and M4) shown. Land masses are light gray. The eastern Bering Sea shelf is outlined with a thick black line including the 200 m depth contour along its western edge. Bathymetry data were taken from Amante & Eakins (2009)

Big No No's!



3 sensors...

Cue rate from another time  
and another place

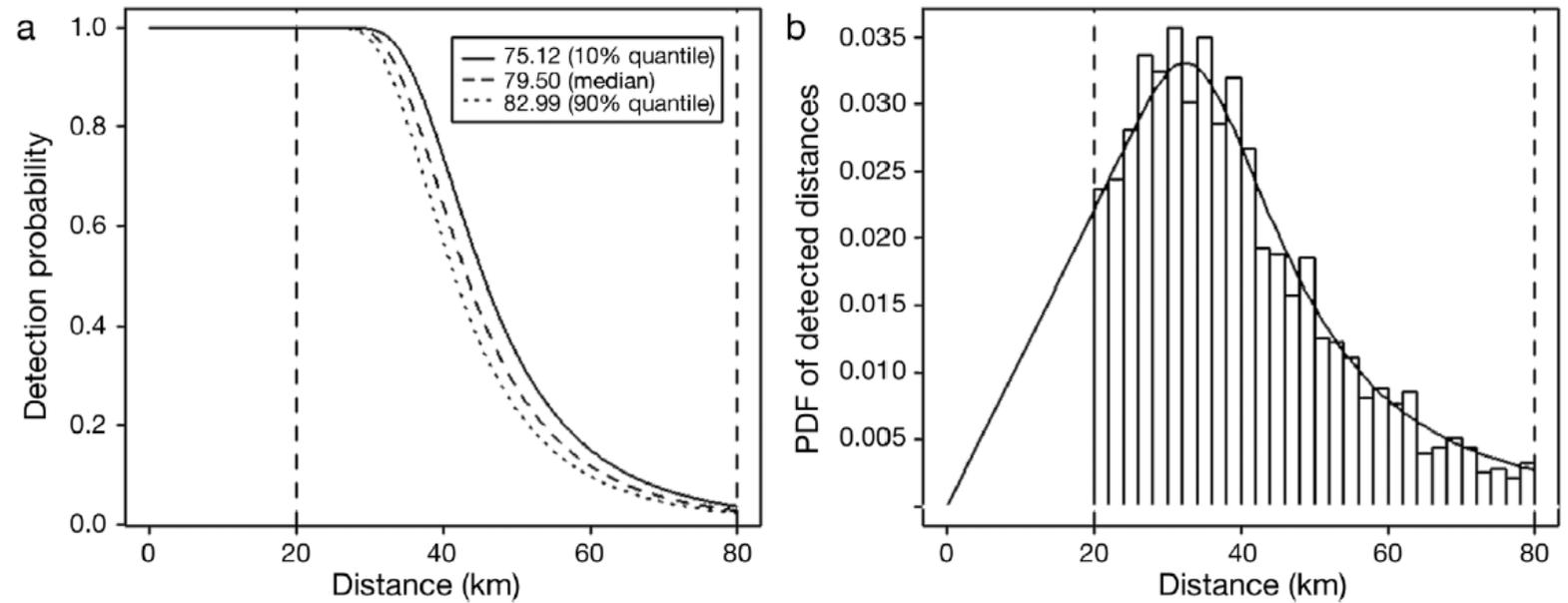
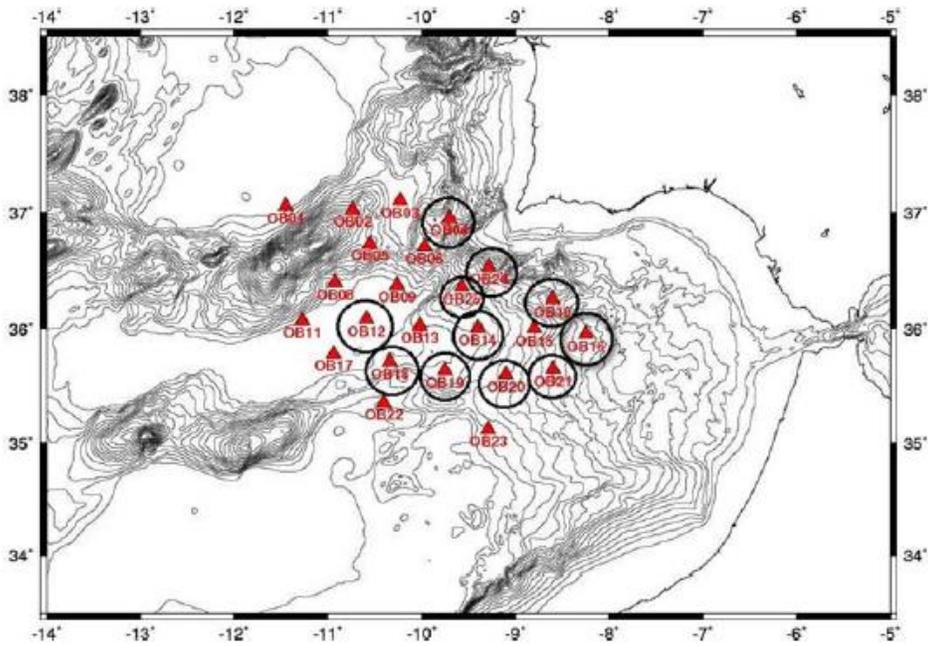


Fig. 2. Distances to detected right whale calls and fitted model: (a) shows the detection function (as a function of distance, for 3 values of the noise covariate, namely the 10, 50, and 90% quantile of the observed distribution) and (b) corresponds to the probability density function (PDF) of detection distances, and goodness-of-fit could be judged based on this plot. Vertical dashed lines represent the left and right truncation distances

## Implications for right whale management

This study presents the first abundance estimate for North Pacific right whales based on acoustic data, and is strikingly similar to the numbers recently estimated by other authors (Wade et al. 2011) using mark-recapture techniques for photographic and genetic data.



# Applying distance sampling to fin whale calls recorded by single seismic instruments in the northeast Atlantic

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*Scottish Oceans Institute, Institiud Chuantan na h-Alba, East Sands, St Andrews, KY16 8LB, Scotland, United Kingdom*

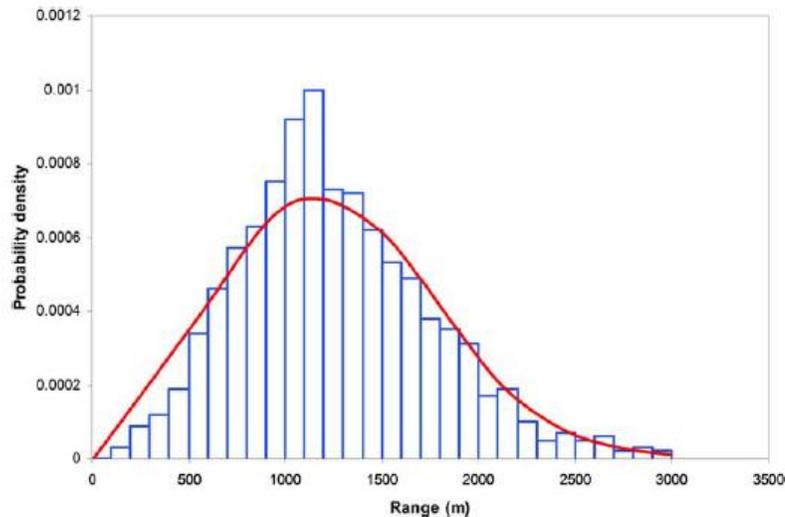
Wolfram H. Geissler

*Alfred-Wegener-Institut für Polar- und Meeresforschung, Am Alten Hafen 26, D-27568 Bremerhaven, Germany*

(Received 30 June 2012; revised 25 July 2013; accepted 12 August 2013)

Automated methods were developed to detect fin whale calls recorded by an array of ocean bottom seismometers (OBSs) deployed off the Portuguese coast between 2007 and 2008. Using recordings collected on a single day in January 2008, a standard seismological method for estimating earthquake location from single instruments, the three-component analysis, was used to estimate the relative azimuth, incidence angle, and horizontal range between each OBS and detected calls. A validation study using airgun shots, performed prior to the call analysis, indicated that the accuracy of the three-component analysis was satisfactory for this preliminary study. Point transect sampling using cue counts, a form of distance sampling, was then used to estimate the average probability of detecting a call via the array during the chosen day. This is a key step to estimating density or abundance of animals using passive acoustic data. The average probability of detection was estimated to be 0.313 (standard error: 0.033). However, fin whale density could not be estimated due to a lack of an appropriate estimate of cue (i.e., vocalization) rate. This study demonstrates the potential for using a sparse array of widely spaced, independently operating acoustic sensors, such as OBSs, for estimating cetacean density. © 2013 Acoustical Society of America.

[<http://dx.doi.org/10.1121/1.4821207>]



Gliders and drifters – not as fast as a line transect, not as slow as a point transect

# Investigating the potential of a wave glider for cetacean density estimation – a Scottish study



← NOT Scotland



Danielle Harris and Doug Gillespie



ongoing work related to methods development

Monday

December 09, 2019

3:00 PM - 3:15 PM

3:00 PM

**Abundance estimation for Mesoplodon beaked whale species using drifting acoustic recorders. (147)**

3:15 PM

**Part of session: *Hearing and Passive Acoustic Monitoring***

📍 Room 112

📁 Talks

## Authors

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Ocean Associates Inc.

# Take Home Messages

Passive acoustics can have significant advantages over visual based methods, especially for deep divers

Passive acoustic monitoring of marine mammals is now routinely applied, but density estimates still not routinely implemented

Distance sampling is a go-to method if distances to sounds can be obtained (or detection function estimated any other way – experiments and sound propagation models)

Both towed systems and bottom mounted systems being routinely used, but drifting buoys and gliders likely to catch up soon

Key issue (for cue based methods) is lack of knowledge about cue rate production – if you are interested on this come talk to me about ACCURATE