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Abstract—A ship-based line-transect survey was conducted during the summer and fall of 2010 to obtain abundance estimates of cetaceans in the U.S. Hawaiian Islands Exclusive Economic Zone (EEZ). Given the low sighting rates for cetaceans in the study area, sightings from 2010 were pooled with sightings made during previous line-transect surveys within the central Pacific for calculating detection functions, which were estimated by using a multiple-covariate approach. The trackline detection probabilities used in this study are the first to reflect the effect of sighting conditions in the central Pacific and are markedly lower than estimates used in previous studies. During the survey, 23 cetacean species (17 odontocetes and 6 mysticetes) were seen, and abundance was estimated for 19 of them (15 odontocetes and 4 mysticetes). Group size and Beaufort sea state were the most important factors affecting the detectability of cetacean groups. Across all species, abundance estimates and coefficients of variation range from 133 to 72,528 and from 0.29 to 1.13, respectively. Estimated abundance is highest for delphinid species and lowest for the killer whale (Orcinus orca) and rorqual species. Overall, cetacean density in the Hawaiian Islands EEZ is low in comparison with highly productive oceanic regions.

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# Abundance estimates of cetaceans from a line-transect survey within the U.S. Hawaiian Islands Exclusive Economic Zone

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Twenty-five cetacean species are known to occur in the U.S. Hawaiian Islands Exclusive Economic Zone (EEZ). Before the 2000s, most research on cetaceans in Hawaii focused on humpback whales (Megaptera novaeangliae) (e.g., Herman and Antinoja, 1977; Mobley et al., 1999) and spinner dolphins (Stenella longirostris) (e.g., Norris and Dohl, 1980; Norris et al., 1994) because individuals of these species are concentrated (seasonally in the case of humpback whales) in nearshore waters of the main Hawaiian Islands. Although there were studies of rarer or less accessible species, such as the pygmy killer whale (Feresa attenuata) and short-finned pilot whale (Globicephala macrorhynchus) (e.g., Pryor et al., 1965; Shane and McSweeney, 1990), more frequent and directed surveys for a variety of species were not initiated until 2000 (e.g., Baird, 2005; McSweeney et al., 2007; Baird et al., 2009). Although that recent research has provided significant insight into the occurrence, distribution, abundance, stock structure, and social organization of cetaceans in Hawaii waters, the surveys were focused primarily on nearshore odontocete species associated with the main Hawaiian Islands.

In 2002, the Southwest Fisheries Science Center (SWFSC) of the National Marine Fisheries Service (NMFS) conducted the first Hawaiian Islands Cetacean and Ecosystem Assessment Survey (HICEAS), a shipbased line-transect survey designed to estimate the abundance of cetaceans in the entirety of the Hawaiian Islands EEZ. During the HICEAS in 2002, 23 cetacean species (18 odontocetes and 5 mysticetes) were encountered, and the abundance of 19 species (18 odontocetes and 1 mysticete) was estimated (Barlow, 2006). These estimates represented the first abundance estimates for most cetacean stocks in Hawaii waters and were incorporated in the stock assessment

Abundance estimates used in marine mammal stock assessment reports are considered outdated after 8 years (NMFS<sup>1</sup>). Therefore, a second HICEAS was carried out in 2010, as a collaborative effort between the SWFSC and the NMFS Pacific Islands Fisheries Science Center (PIFSC), with objectives, timing, and methods comparable to those of the HICEAS conducted in 2002. However, adjustments were made to the data collection protocol for the false killer whale (Pseudorca crassidens) during the HICEAS in 2010-changes that necessitated a separate and specialized abundance analysis for this species (Bradford et al., 2014, 2015). The objective of the present study was to estimate the abundance of the remaining cetacean stocks encountered during the HICEAS in 2010. Although the resulting abundance estimates are specific to cetacean stock assessment in the Hawaiian Islands EEZ, the analytical methods used are ap-

plicable to line-transect surveys of cetaceans in other regions.

#### Materials and methods

## Data collection

The HICEAS in 2010 was conducted aboard two 68-m NOAA research vessels within the Hawaiian Islands EEZ during the summer and fall (Fig. 1) The study area was surveyed from the NOAA ship McArthur II from 13 August to 1 December 2010 and from the NOAA ship Oscar Elton Sette from 2 September to 29 October 2010. The survey design of the HICEAS in 2010 was similar to that of the HICEAS in 2002 (Barlow, 2006). That is, both surveys were based on a grid of parallel transect lines that provided comprehensive coverage of the study area. These transect lines were the basis for the daily tracklines of each ship and were oriented from west-northwest to east-southeast in order to minimize the effects of dominant regional swells generated by northeasterly to easterly trade winds. The grid used for the HICEAS in 2002 was established by positioning transect lines parallel to a randomly placed baseline at

<sup>1</sup> NMFS (National Marine Fisheries Service). 2005. Revisions to guidelines for assessing marine mammal stocks, 24 p. [Available at website.]



Locations of cetacean groups (black dots; n=198) sighted by observers on systematic line-transect survey effort (fine lines) in Beaufort sea states 0–6 within the U.S. Hawaiian Islands Exclusive Economic Zone (thick black outline) during the Hawaiian Islands Cetacean and Ecosystem Assessment Survey in 2010. Nine sightings were of mixed-species groups, in which at least 2 species were seen. The main Hawaiian Islands are shown in gray with a thin black outline.

spacing intervals of 85 km. Transect lines for the HI-CEAS in 2010 were placed midway between each of the lines used in 2002 to maximize spatial coverage of the Hawaiian Islands EEZ over the 2 surveys. The survey effort in 2002 was stratified, and a higher density of transect lines occurred within 140 km of the main Hawaiian Islands. This stratification was not maintained for the HICEAS in 2010. Therefore, the systematic survey effort in 2010 was roughly uniform throughout the study area. The survey speed of both ships was 18.5 km/h (10 kt).

Although transits to and from ports and circumnavigations of the Northwestern Hawaiian Islands were not a part of the systematic survey grid, the observers remained on-effort and followed standard observation protocols during these periods. This nonsystematic effort differed from effort during periods when the observers were not following standard observation protocols-periods that were considered to be off-effort (e.g., during inclement weather or diversions from the tracklines). Sightings of cetaceans made during nonsystematic effort and off-effort were not applied to the density estimator (see Eq. 1 later in this section) because those sightings were not detected on the systematic transect lines. However, sightings made during nonsystematic effort were used in the estimation of species detection functions because the observation protocols did not differ between systematic and nonsystematic efforts.

The observation methods used during the HICEAS in 2010 were developed by the SWFSC and have been in use for the last 3 decades (e.g., Barlow, 2006). To summarize these methods, observation teams consisted of 6 observers who rotated through 3 roles (port and starboard observers and a data recorder) and searched for cetaceans  $180^{\circ}$  forward of the vessel by using  $25 \times$ binoculars (port and starboard observers) and with unaided eyes (data recorder) from the flying bridge (approximately 15 m above the sea surface on both ships). When cetaceans were sighted within 5.6 km (3 nmi) of the trackline by 1 of the 3 on-effort observers, systematic search effort was suspended and the ship diverted from the trackline toward the sighting so that species, species composition (for mixed-species groups), and group size could be determined. In addition to basic environmental data (e.g., Beaufort sea state, swell height, and visibility), data collected for each sighting included the time, location, initial bearing and radial distance to the cetacean group (used to calculate the perpendicular distance of the sighting to the trackline), species identity, proportion of each species present (mixed-species groups), and identity of observers and their independent estimates of sighting group size (recorded as a "best," "high," and "low" estimate for each observer). If species identity could not be determined for a sighting, the lowest possible taxonomic category was applied (see Table 1 for the categories relevant to the HICEAS in 2010). After the identification of species and estimation of group size for some sightings, depending on weather, animal behavior, and research priorities, a small boat was launched to collect photoidentification images and biopsy samples.

Additionally, an acoustics team worked independently from the observers, detecting cetacean vocalizations by using a hydrophone array towed behind each ship during daylight hours. This team did not inform the observer team of acoustic detections. The abundance estimation reported in the present study is based solely on the sightings made by the observers. That is, cetaceans that were detected only acoustically were not included in the abundance analysis. The acoustic detections from the HICEAS in 2010 are currently being processed for future line-transect analyses.

#### Estimation of abundance

Cetacean abundance in the Hawaiian Islands EEZ was estimated by using a multiple-covariate line-transect approach (Buckland et al., 2001; Marques and Buckland, 2004). Specifically, detection functions were modeled as a function of factors known to affect the detectability of cetacean groups. Sighting rates are low in the Hawaiian Islands EEZ (Barlow, 2006), and as were the sample sizes during the HICEAS in 2002, sample sizes for each species sighted during the HICEAS in 2010 were inadequate for modeling the detection functions. Therefore, as with analysis of sightings from the HICEAS in 2002 (Barlow, 2006), sightings from the HICEAS in 2010 were pooled with sightings collected during previous NMFS ship-based line-transect surveys of the eastern Pacific. The estimation of detection functions for the HICEAS in 2002 incorporated sightings made throughout the eastern Pacific during SWFSC surveys conducted from 1986 through 2002, but the sighting pool for the analysis of the 2010 data was restricted to sightings made in the central Pacific (defined here as the area of the eastern Pacific north of 5°S, south of 40°N, west of 120°W, and east of 175°E) during SWFSC and PIFSC surveys from 1986 through 2010. The pooled sightings (collected during both systematic and nonsystematic efforts) were limited to the central Pacific to minimize heterogeneity resulting from geographical differences in species associations and behavior-complex factors that can be difficult to represent as covariates.

Despite survey data from the present study being pooled with previous survey data, sample sizes for most species remained insufficient for estimating the detection function. Therefore, sightings of species with similar detection characteristics (e.g., size, surface behavior, group sizes) were also combined for modeling the detection function. Specifically, 6 species pools were formed: 1) small delphinids with relatively large group sizes; 2) small and medium delphinids with relatively small group sizes; 3) large delphinids and co-occurring beaked whales with similar behavior (Barlow, 2006); 4) large and highly conspicuous odontocetes (Barlow et al., 2011a); 5) beaked whales with relatively small group sizes; and 6) baleen whales (see Table 2 for the composition of each species pool).

A half-normal model was used to evaluate the detection probabilities for the sightings in each species pool as a function of perpendicular distance from the trackline and of relevant covariates. Only half-normal models were used because of the greater stability they exhibit when fitting sighting data for cetaceans (Gerrodette and Forcada, 2005). The 5–10% most distant sightings in each species pool were truncated to improve model fit (Buckland et al., 2001), although no truncation distance exceeded the 5.6-km limit at which the ship would not divert from the trackline for a sighting. Covariate models were built by using a forward stepwise procedure and were selected by using Akaike's information criterion corrected for a small sample size (AICc; Hurvich and Tsai, 1989).

Although several factors have the potential to affect the perpendicular sighting distances to cetaceans (Barlow et al., 2001), a smaller set of covariates identified as important and robust in estimating detection probabilities (Barlow et al., 2011a) was considered for analysis in the present study. Of the covariates identified by Barlow et al. (2011a), visibility and swell anomaly could not be tested because these variables were not recorded during SWFSC surveys before 1991, and region was not applicable because the pooled sightings were restricted to the central Pacific. The remaining covariates evaluated were *Beaufort* (Beaufort sea state, treated as a continuous variable), group size (the natural logarithm of the sighting group size, which in-

#### Table 1

Names and number of sightings of cetacean species observed in the U.S. Hawaiian Islands Exclusive Economic Zone during the Hawaiian Islands Cetacean and Ecosystem Assessment Survey in 2010. Stock names refer to those used in the National Marine Fisheries Service stock assessment reports (Carretta et al., 2014). N<sub>TOT</sub> is the number of systematic, nonsystematic, and off-effort sightings (n=398); N<sub>SYS</sub> is the number of sightings made while on systematic effort in Beaufort sea states 0–6 (n=211); and N<sub>EST</sub> is the number of sightings made while on systematic effort that were within the analytical truncation distance and, therefore, used in the abundance estimation (n=177). The abundance of some species could not be estimated (N/A). NWHI=Northwestern Hawaiian Islands.

Common name	Scientific name	Stock name	$N_{TOT}$	$\rm N_{SYS}$	N <sub>EST</sub>	
Pantropical spotted dolphin	Stenella attenuata	Pelagic	12	11	10	
Striped dolphin	Stenella coeruleoalba	Hawaii	25	20	18	
Spinner dolphin	Stenella longirostris	Pelagic	4	0	N/A	
Rough-toothed dolphin	Steno bredanensis	Hawaii	24	8	8	
Bottlenose dolphin	Tursiops truncatus	Pelagic	19	7	6	
Risso's dolphin	Grampus griseus	Hawaii	10	9	9	
Fraser's dolphin	Lagenodelphis hosei	Hawaii	4	3	3	
Melon-headed whale	Peponocephala electra	Hawaiian Islands	1	1	1	
Pygmy killer whale	Feresa attenuata	Hawaii	5	4	4	
False killer whale <sup>1</sup>	Pseudorca crassidens	Pelagic and NWHI	14	6	6	
Short-finned pilot whale	Globicephala macrorhynchus	Hawaii	36	15	11	
Killer whale	Orcinus orca	Hawaii	1	1	1	
Sperm whale	Physeter macrocephalus	Hawaii	41	26	23	
Dwarf sperm whale	Kogia sima	Hawaii	1	0	N/A	
Unidentified Kogia	Kogia sima/breviceps	N/A	1	0	N/A	
Blainville's beaked whale	Mesoplodon densirostris	Hawaii	2	1	1	
Cuvier's beaked whale	Ziphius cavirostris	Hawaii	23	2	2	
Longman's beaked whale	Indopacetus pacificus	Hawaii	3	3	ŝ	
Unidentified Mesoplodon	Mesoplodon spp.	N/A	10	6	6	
Unidentified beaked whale	Ziphiid whale	N/A	27	4	ŝ	
Minke whale	Balaenoptera acutorostrata	Hawaii	1	0	N/A	
Bryde's whale	Balaenoptera edeni	Hawaii	32	19	19	
Sei whale	Balaenoptera borealis	Hawaii	2	2	2	
Fin whale	Balaenoptera physalus	Hawaii	2	1	1	
Blue whale	Balaenoptera musculus	Western North Pacific	1	1	1	
Humpback whale	Megaptera novaeangliae	Central North Pacific	1	1	N/A	
Sei or Bryde's whale	Balaenoptera borealis/edeni	N/A	12	9	8	
Unidentified rorqual	Balaenopterid whale	N/A	11	9	6	
Unidentified small dolphin	Small delphinid	N/A	17	10	6	
Unidentified medium dolphin	Medium delphinid	N/A	6	3	1	
Unidentified large dolphin	Large delphinid	N/A	3	2	6 4	
Unidentified dolphin	Delphinid	N/A	19	9	6	
Unidentified small whale	Small whale or large dolphin	N/A	1	1	1	
Unidentified large whale	Large baleen or sperm whale	N/A	8	6	N/A	
Unidentified whale	Small or large whale	N/A	3	2	2	
Unidentified cetacean	Cetacean	N/A	16	9	7	

<sup>1</sup>Abundance estimation of the pelagic and NWHI stocks of false killer whales is covered in Bradford et al. (2014, 2015) and was not considered further in this study.

cludes the total number of individuals in mixed-species groups, treated as a continuous variable), *cruise number* (the number assigned to each survey on a given ship in a given year, treated as a categorical variable), *ship* (the survey ship, treated as a categorical variable), *year* (the survey year, treated as a categorical variable), and *species* (the most abundant species within a group, treated as a categorical variable). The categorical covariates were tested only if there were at least 10 observations for each factor level. To correct for the tendency of individual observers to over- or underestimate group size, correction factors were applied to the "best" estimates of sighting group size made by observers who were calibrated during previous SWFSC surveys by a comparison of observer group size estimates and counts of the same cetacean groups from aerial photographs (Gerrodette and Forcada, 2005). An indirect regression-based calibration method was used to calibrate noncalibrated observers in relation to the calibrated observers (Barlow, 1995;

## Table 2

Detection functions modeled by using pooled sightings collected in the central North Pacific during line-transect surveys conducted from 1986 through 2010 by the NOAA Southwest and Pacific Islands Fisheries Science Centers. The estimated detection functions are listed along with the associated factor levels used to test the *species* covariate (see text for covariate descriptions).  $N_{TOT}$  is the number of available systematic and nonsystematic sightings in Beaufort sea states 0–6, and  $N_{DET}$  is the number of sightings that fell within the analytical truncation distance (TD; in kilometers). If a model with an additional covariate was within 2 Akaike's information criterion (corrected for a small sample size) units of the best-fit covariate model, the second covariate is shown in parentheses.

Detection function	N <sub>TOT</sub> N <sub>DET</sub>		TD	Covariates tested	Best-fit model	
Pantropical spotted dolphin 274		247	4.5	Beaufort, group size, species	Group size(+Beaufort)	
Pantropical spotted dolphin	83	73				
$Other^1$	191	174				
Species pool 1	282	255	4.5	Beaufort, group size, ship	$Ship(+group \ size)$	
Striped dolphin	249	223				
Fraser's dolphin	23	22				
Melon-headed whale	7	7				
Other	3	3				
Species pool 2	231	216	5.0	Beaufort, group size, species	Group size+species	
Rough-toothed dolphin	58	55			1 1	
Bottlenose dolphin	56	50				
Risso's dolphin	64	61				
Pygmy killer whale	14	14				
Other	39	36				
Species pool 3	152	138	4.5	Beaufort, group size, ship	Null(+ <i>ship</i> )	
Short-finned pilot whale	138	126		,,		
Longman's beaked whale	5	5				
Other	9	7				
Species pool 4	144	128	5.5	Beaufort, group size, species	Null(+species)	
Killer whale	34	34				
Sperm whale	109	94				
$Other^2$	1	0				
Species pool 5	143	136	5.0	Beaufort, group size	Beaufort+group size	
Blainville's beaked whale	7	7	0.0	2000,0,0,0,000 0020	Deadjoi ti gi cap cize	
Cuvier's beaked whale	46	43				
Unidentified Mesoplodon	39	39				
Unidentified beaked whale	50	46				
Other	1	1				
Species pool 6	150	139	5.0	Beaufort, group size	Null(+ <i>Beaufort</i> )	
Bryde's whale	81	77	0.0	Deadlort, group ouse	1, and (1200000000)	
Sei whale	11	9				
Fin whale	5	5				
Blue whale	4	4				
Sei or Bryde's whale	44	39				
Other	5	5				
Unidentified rorqual	61	47	5.5	Beaufort, group size	Null	
Unidentified dolphin	316	281	5.5	Beaufort, group size, ship	Beaufort+group size	
Unidentified cetacean	162	144	5.5	Beaufort, group size, ship Beaufort, group size	Beaufort(+group size)	

<sup>1</sup>A justification for testing for a *species* effect on this single-species detection function is provided in the text. <sup>2</sup> The "other" sighting in this pool was within the TD but was removed for other reasons (see text for details).

Barlow and Forney, 2007). Sighting group size used in detection function modeling was a weighted geometric mean of the calibrated "best" estimates of group size made by each observer for each sighting (weighted by the inverse of the mean squared estimation error).

To obtain the number of individuals of each species in sightings of mixed-species groups (as needed for density estimation, see the next paragraph), the sighting group size was multiplied by the proportion of each species present (averaged over all observers). For some sightings of mixed-species groups, the most abundant species within a sighted group was not one of the pooled species—an outcome that complicated the use of the *species* covariate. The factor level for these sightings was labeled as "other" to account for the collective influence of nonpooled species on the detection function (Table 2). For the species pool that includes killer whales (Orcinus orca) and sperm whales (Physeter microcephalus), the low number of "other" sightings (n=1) prevented testing the species covariate. Upon further examination, this sighting was found to contain a species co-occurrence not observed in the Hawaiian Islands EEZ and not represented in any of the other pooled sightings. Therefore, this sighting was removed from the pool used to estimate the detection function so that a species effect could be evaluated. Although the sample size was sufficient to model the detection function of pantropical spotted dolphins (Stenella attenuata) separately, the species covariate and the "other" factor level were used to explore the influence of a large number of sightings in which the pantropical spotted dolphin was not the most abundant species.

Given the estimated covariate detection function and the sightings within the established truncation distance from the systematic effort during the HICEAS in 2010, the density (D) of each species was estimated by using a Horvitz-Thompson-like estimator (Marques and Buckland, 2004):

$$D = \frac{1}{2 \cdot L \cdot g(0)} \sum_{j=1}^{N} f(0, \boldsymbol{c}_j) \cdot \boldsymbol{s}_j, \tag{1}$$

- where L = the length of systematic-effort transect lines in the study area;
  - g(0) = the probability of detection on the trackline;
  - $f(0, c_j)$  = the probability density of the detection function evaluated at zero distance for sighting j with associated covariates c;
    - $s_j$  = the number of individuals of the species in sighting *j*; and
    - N = the number of sightings of the species during systematic-effort within the analytical truncation distance.

The value of  $f(0, \mathbf{c}_j)$  that was applied was a weighted average of all covariate models within 2 AICc units of the best-fit model. The inverse of  $f(0, \mathbf{c}_j)$  is the effective strip width (ESW), which is the distance from the trackline beyond which as many sightings were made as were missed within.

Barlow (2006) used estimates of g(0) adapted from previous studies of delphinids and large whales (Barlow, 1995), sperm whales (Barlow and Sexton<sup>2</sup>), and beaked whales and *Kogia* spp. (Barlow, 1999). However, results from recent work in which g(0) was derived from apparent densities in different Beaufort sea state conditions (assuming that true density is not affected by sea state) indicate that g(0) had been previously overestimated, particularly for high sea states (Barlow, 2015). Barlow (2015) estimated g(0) in Beaufort sea states 0–6 for 20 cetacean taxa by using a model that accounted for spatial and temporal differences in density. This model was fitted to cetacean sighting data from the eastern Pacific, which included the on-effort sightings from the HICEAS in 2010. Therefore, the resulting estimates of g(0) can be applied to the estimation of cetacean abundance for the HICEAS in 2010.

The estimates of g(0) by Barlow (2015) were relative to a value of 1 at a Beaufort sea state of 0 for most species or species groups considered, with the exception of the Cuvier's beaked whale (Ziphius cavirostris) and Mesoplodon spp., for which scaled absolute estimates of g(0) were determined for Beaufort sea states 0-6. In the absence of absolute estimates of g(0) for most of the remaining taxa, the relative values of g(0) from Barlow (2015) were assumed to be absolute values in the present study. Estimates of g(0) for the HICEAS in 2010 (Table 3) were obtained by taking a weighted average of both the Beaufort-specific values of g(0) and the associated coefficients of variation (CVs) presented in Barlow (2015), where the weights were the proportion of systematic effort in each sea state category (0-6) during the HICEAS in 2010.

For species not covered in Barlow (2015) because of small sample sizes, g(0) was assumed to be similar to the g(0) estimates of associated species in the species pools formed to model the detection functions, given the similar detection characteristics (e.g., size, surface behavior, group sizes) of the species in each pool (Table 2). Therefore, g(0) for these species was obtained either by using the estimate of another species in the species pool or, if more than one estimate was available, by averaging the available estimates. Specifically, for the HICEAS in 2010, the estimate of g(0)for striped dolphins (Stenella coeruleoalba) was used for Fraser's dolphins (Lagenodelphis hosei) and melonheaded whales (Peponocephala electra), the estimate for short-finned pilot whales was used for Longman's beaked whales (Indopacetus pacificus), and the estimates for rough-toothed dolphins (Steno bredanensis), bottlenose dolphins (Tursiops truncatus), and Risso's dolphins (Grampus griseus) were averaged for pygmy killer whales (Table 3).

The abundance of each species was determined by multiplying the density estimate by 2,447,635 km<sup>2</sup>the area of the Hawaiian Islands EEZ minus the area of the land masses of the main and Northwestern Hawaiian Islands. However, the ranges of the pelagic stocks of pantropical spotted and bottlenose dolphins, which are the stocks involved in the estimation (Table 1), do not span the entirety of the Hawaiian Islands EEZ (Carretta et al., 2011, 2014). Therefore, the area of the ranges of island-associated stocks of pantropical spotted and bottlenose dolphins was subtracted from the larger area, resulting in areas of 2,392,576 km<sup>2</sup> and 2,425,900 km<sup>2</sup> for pantropical spotted and bottlenose dolphins, respectively. The mixed parametric and nonparametric bootstrap routine described in Barlow (2006) and refined by Barlow and Rankin<sup>3</sup> was used

<sup>&</sup>lt;sup>2</sup> Barlow, J., and S. Sexton. 1996. The effect of diving and searching behavior on the probability of detecting track-line groups,  $g_0$ , of long-diving whales during line-transect surveys. Southwest Fish. Sci. Cent. Admin. Rep. LJ-96-14, 21 p. [Available from Southwest Fisheries Science Center, National Marine Fisheries Service, 8901 La Jolla Shores Dr., La Jolla, CA 92037.]

<sup>&</sup>lt;sup>3</sup> Barlow, J., and S. Rankin. 2007. False killer whale abun-

## Table 3

Estimates of abundance and associated parameters for cetacean species and taxonomic categories sighted by observers on systematic effort during the Hawaiian Islands Cetacean and Ecosystem Assessment Survey within the U.S. Hawaiian Islands Exclusive Economic Zone in 2010. Mean group size (GS) is the average estimated GS (calibrated and proportioned to species; see text) of the sightings used in the abundance estimation ( $N_{EST}$  in Table 1). Mean effective strip width (ESW) is the average ESW of the  $N_{EST}$  sightings (computed from the covariates associated with each sighting) and represents the distance (in kilometers) from the trackline beyond which as many sightings were made as were missed within. As described in the text, probabilities of detection on the trackline (g(0)) were derived from Barlow (2015); coefficients of variation (CV) for g(0) estimates are included in parentheses. The values in the CV column apply to estimates of both density, measured as individuals per 1000 km<sup>2</sup>, and abundance. Log-normal 95% confidence intervals (CIs) for the abundance estimates are also shown.

Species or category	Mean GS Mea	n ESW	g(0) (CV)	Density	Abundance	CV	95% CI
Pantropical spotted dolphin	43.2	2.05	0.28 (0.07)	23.32	55,795	0.40	26,355 to 118,123
Striped dolphin	52.6	3.61	$0.33\ (0.07)$	25.00	61,201	0.38	29,991 to 124,890
Rough-toothed dolphin	25.3	2.68	0.08 (0.21)	29.63	72,528	0.39	34,786 to 151,219
Bottlenose dolphin	33.5	2.46	0.27 (0.14)	8.99	21,815	0.57	7673 to 62,023
Risso's dolphin	26.6	2.53	0.58(0.07)	4.74	11,613	0.43	5199 to 25,940
Fraser's dolphin	283.3	3.89	0.33(0.07)	21.04	51,491	0.66	15,870 to 167,069
Melon-headed whale	153.0 4	4.06	0.33 (0.07)	3.54	8666	1.00	1693 to 44,372
Pygmy killer whale	25.7 2	2.28	0.31 (0.06)	4.35	10,640	0.53	4022 to 28,148
Short-finned pilot whale	40.9	2.88	0.60 (0.09)	7.97	19,503	0.49	7889 to 48,214
Killer whale	4.7 3	3.93	0.62 (0.26)	0.06	146	0.96	30 to 710
Sperm whale	7.4 4	4.42	0.64 (0.19)	1.86	4559	0.33	2450 to 8484
Blainville's beaked whale	7.0 2	2.29	0.11 (0.16)	0.86	2105	1.13	355 to 12,496
Cuvier's beaked whale	1.0	1.61	0.13 (0.16)	0.30	723	0.69	212 to 2471
Longman's beaked whale	59.8	2.97	0.60 (0.09)	3.11	7619	0.66	2348 to 24,723
Unidentified Mesoplodon	2.2	1.87	0.11 (0.16)	1.89	4624	0.48	1890 to 11,314
Unidentified beaked whale	3.1	1.95	0.12 (0.12)	1.17	2852	0.74	783 to 10,393
Bryde's whale	1.4 2	2.88	0.41 (0.12)	0.72	1751	0.29	1010 to 3035
Sei whale	3.1 2	2.85	0.41 (0.12)	0.16	391	0.90	87 to 1764
Fin whale	2.0 2	2.90	0.34 (0.17)	0.06	154	1.05	28 to 831
Blue whale	2.8 2	2.90	0.55 (0.21)	0.05	133	1.09	24 to $752$
Sei or Bryde's whale	1.5 2	2.95	0.41 (0.12)	0.31	766	0.47	320 to 1833
Unidentified rorqual	1.6	4.04	0.43 (0.11)	0.17	423	0.46	180 to 991
Unidentified dolphin	15.2	3.31	0.36 (0.04)	5.82	14,241	0.33	7572 to 26,782
Unidentified cetacean	2.0 2	2.73	1.00 (N/A)	0.23	554	0.51	216 to 1421

(n=1000 iterations) to estimate the CV for each abundance estimate. Survey effort from all years (1986–2010) was divided into 150-km effort segments (the distance generally surveyed in 1 day). The bootstrap randomly sampled these effort segments with replacement and accounted for the variance associated with sampling variation, modeling the detection function (including model selection and averaging), and uncertainty in the estimate of g(0). Following Barlow (2006), uncertainty in g(0) was estimated by modeling g(0) as a random normal deviate (logit-transformed) with a mean and variance chosen to provide the estimated g(0) and CV used in the present study (Table 3).

Abundances were not estimated for seasonally mi-

grating species of baleen whales and for most categories of unidentified cetaceans (i.e., not identified to species) sighted during the HICEAS in 2002 (Barlow, 2006). For the HICEAS in 2010, abundance estimates were determined for all species of baleen whales sighted while the observers were on systematic effort, with the exception of the humpback whale because the nearshore breeding range of this species was not representatively sampled during the survey. However, recent mark-recapture abundance estimates exist for humpback whales in the North Pacific (Barlow et al., 2011b), including the portion of the stock that overwinters in Hawaii waters (Allen and Angliss, 2014).

For completeness, the abundance of unidentified cetaceans encountered during the HICEAS in 2010 was also estimated. Specifically, abundance estimates were produced for unidentified *Mesoplodon* beaked whales; unidentified beaked whales; rorquals identified as either sei (*Balaenoptera borealis*) or Bryde's (*B. edeni*) whales; unidentified rorquals; unidentified small, medium, and large dolphins; unidentified dolphins; un-

dance and density: preliminary estimates for the PICEAS study area south of Hawaii and new estimates for the U.S. EEZ around Hawaii. Southwest Fish. Sci. Cent. Admin. Rep. LJ-07-02, 15 p. [Available from Southwest Fisheries Science Center, National Marine Fisheries Service, 8901 La Jolla Shores Dr., La Jolla, CA 92037.]

identified small and large whales; unidentified whales; and unidentified cetaceans (Table 1). Sightings of unidentified *Mesoplodon* beaked whales, unidentified beaked whales, and rorquals identified as either sei or Bryde's whales were pooled with associated species for modeling the detection function (Table 2). Sightings of unidentified small, medium, and large dolphins and unidentified dolphins were combined into a single category, "unidentified dolphins," for detection function and abundance estimation. Likewise, sightings of unidentified small and large whales and unidentified whales and cetaceans were combined into the category "unidentified cetaceans."

The detection functions for unidentified rorquals, "unidentified dolphins," and "unidentified cetaceans" were estimated separately and without testing for the effect of *species*. The g(0) estimate for unidentified beaked whales was an average of the estimates for Cuvier's beaked whales and *Mesoplodon* spp.; the g(0)estimate of unidentified rorquals was an average of the estimates for fin whales, blue whales, and sei or Bryde's whales; and the g(0) estimate of "unidentified dolphins" was an average of the estimates for pantropical spotted, striped, rough-toothed, bottlenose, and Risso's dolphins and short-finned pilot whales (Table 3). A g(0) estimate was not applied to the "unidentified cetaceans" because an appropriate value could not be determined, given the broad taxonomic range of this category.

## Results

#### Survey sightings

During the HICEAS in 2010, the systematic and nonsystematic visual search effort spanned 20,568 km of transect lines in Beaufort sea states 0-6 within the Hawaiian Islands EEZ. During this effort and while off-effort, the observers sighted 379 cetacean groups (n=198 during systematic effort, n=101 during nonsystematic effort, n=80 during off-effort), which include 13 groups with more than one species present. Accounting for these mixed-species groups, the 379 group sightings represent 398 sightings of 23 species (17 odontocetes and 6 mysticetes) and 13 unidentified species categories (Table 1). With the exception of the pygmy sperm whale (Kogia breviceps) and the extremely rare North Pacific right whale (Eubalaena japonica), all cetacean species known to occur in the Hawaiian Islands EEZ were sighted during the HICEAS in 2010.

The systematic effort that was relevant to the abundance estimation encompassed 16,145 km of transect lines in Beaufort sea states 0–6 for most cetaceans sighted (Fig. 1), but for pantropical spotted and bottlenose dolphins, the effort covered 15,747 km and 16,100 km, respectively. As with the HICEAS in 2002 (Barlow, 2006), windy conditions prevailed during the HICEAS in 2010, and most (94.5%) of the systematic effort occurred in Beaufort sea states 3–6. Adjusting for mixed-species groups (n=9), the 198 groups sighted on systematic effort correspond to 211 sightings of 20 species and 11 unidentified species categories (Table 1; Fig. 2). The 3 species not sighted by the observers while on systematic effort during the HICEAS in 2010 were the spinner dolphin, the dwarf sperm whale (Kogia sima), and the minke whale (Balaenoptera acutorostrata).

By using the 177 sightings within the respective analytical truncation distances (N<sub>EST</sub> in Table 1), abundance was estimated for 19 cetacean species (15 odontocetes and 4 mysticetes; see the Materials and methods section for the rationale for excluding humpback whales) and for the 11 unidentified species categories, although the latter were combined into 6 taxonomic categories (as described in the Materials and methods section). Of the 48 sightings of unidentified cetaceans used in the estimation of abundance, 9 sightings correspond with acoustic detections of dolphin whistles, odontocete clicks, or baleen whale calls. These detections were examined for possible insights into species identification. However, this effort did not lead to any gains in species identification because of either the poor quality of the recordings, the non-specificity of the vocalizations, or the confounding presence of an associated species.

## **Detection function**

Of the 6 covariates of interest, only 4 (*Beaufort, group* size, ship, and species) were tested in the 10 models of detection function, although only the noncategorical covariates *Beaufort* and group size could be tested in all cases (Table 2). Insufficient samples sizes by cruise number and year prevented testing for the effect of these covariates on any of the detection functions. *Group* size and *Beaufort* most frequently contributed to the model-averaged estimates of detection function. Specifically, group size was selected in 6 detection functions and *Beaufort*, in 5 detection functions.

For the 7 detection functions in which species was a consideration, this covariate was tested in 3 cases and selected in 2 (Table 2). For the 4 species pools that had a limited sample size for testing the effect of species, follow-up modeling was performed in 3 cases to evaluate the potential for a species effect on the detection function. Specifically, for "species pool 1," a "striped dolphin" and "not striped dolphin" influence was examined. For "species pool 3," the evaluation was between "pilot whale" and "not pilot whale" sightings. For "species pool 5," the "other" sighting was excluded and a "Cuvier's beaked whale," "Mesoplodon spp.," and "unidentified beaked whale" effect was explored. By reducing the number of factor levels, species did enter 1 of the 4 acceptable models for the "species pool 5" detection function, but this covariate otherwise remained unselected for the 3 species pools. Follow-up modeling was not undertaken for "species pool 6" because there were not enough sightings to evaluate a "sei or Bryde's" and "not sei or Bryde's" effect. Overall, this post-hoc analysis of a species effect produced equivocal



Sightings ( $N_{SYS}$  in Table 1; n=211) of cetacean species and taxonomic categories made by observers on systematic survey effort (fine lines) in Beaufort sea states 0–6 within the U.S. Hawaiian Islands Exclusive Economic Zone (thick black outline) during the Hawaiian Islands Cetacean and Ecosystem Assessment Survey in 2010. Sightings are grouped by detection function species pool (Table 2): (**A**) pantropical spotted dolphin, (**B**) species pool 1, (**C**) species pool 2, (**D**) species pool 3, (**E**) species pool 4, (**F**) species pool 5, (**G**) species pool 6, (**H**) unidentified rorqual, (**I**) unidentified dolphin, and (**J**) unidentified cetacean. The main Hawaiian Islands are shown in gray with a thin black outline.

results and, therefore, was not used in the abundance estimation.

#### Estimation of abundance

The mean group size and ESW of the sightings used in the estimation of abundance are shown in Table 3 for each species and taxonomic category. Mean group sizes range from 1.0 to 283.3 individuals and are highest for the small delphinids and lowest for the rorquals and beaked whales. One exception is the mean group size for the 3 sightings of Longman's beaked whales. At 59.8 individuals (range: 30.0–100.0 individuals), this mean group size is unexpectedly high given the mean group size (10.1 individuals; range: 1.0-20.4 individuals) of all available sightings of Longman's beaked whales (n=9) made in the eastern Pacific by the SWFSC before 2010. Mean ESWs range from 1.61 to 4.42 km, are highest for the small delphinids (with the largest mean group sizes) and for killer and sperm whales, and are lowest for beaked whales (excluding Longman's beaked whales).

For most species sighted during the HICEAS in 2010, the proportions of systematic effort in Beaufort sea states 0–6 that were used to obtain survey-specific estimates of g(0) from the values published in Barlow (2015) are 0.001, 0.012, 0.042, 0.122, 0.473, 0.304, and 0.046, respectively. The proportions used for pantropical spotted dolphins are 0.001, 0.012, 0.041, 0.124, 0.474, 0.301, and 0.046, and those used for bottlenose dolphins are 0.001, 0.012, 0.042, 0.122, 0.472, 0.303, and 0.046. The resulting estimates of g(0) (Table 3) are substantially lower than those used in the estimation of abundance for the HICEAS in 2002 (Barlow, 2006, table 2).

Estimated densities of cetaceans by species and overall in the Hawaiian Islands EEZ during the HICEAS in 2010 are low (Table 3)—a finding that is consistent with results from the HICEAS conducted in 2002 (Barlow, 2006). Estimates of species density do not exceed approximately 30 individuals/1000 km<sup>2</sup>, although more than half of the estimates are less than 2 individuals/ 1000 km<sup>2</sup>. Accounting for the estimated density of false killer whales (Bradford et al., 2014, 2015), total cetacean density during the HICEAS in 2010 was approximately 146 individuals/1000 km<sup>2</sup>. The most abundant species in the Hawaiian Islands EEZ during the summer-fall period of 2010 were the rough-toothed, striped, pantropical spotted, and Fraser's dolphins. The least abundant species were the blue whale (Balaenoptera musculus), killer whale, and fin whale (B. physalus). Approximately 4% of the estimated delphinid abundance represents unknown species, but more than 30% of the rorqual abundance and 40% of the beaked whale abundance could not be identified to species. The estimated abundance of cetaceans with unknown taxonomic status (i.e., "unidentified cetaceans") is relatively low. As expected, given the low number of sightings of most species, the CVs for the estimates of density and abundance are generally high.

## Discussion

Although the HICEAS in 2010 was a follow-up survey to the HICEAS in 2002, comparisons between the data collected and the parameters estimated from the 2 surveys are complicated by several factors. At a basic level, there is random variation in the sampling process (e.g., survey conditions) and in the sighting attributes (e.g., group size) of the 2 surveys, and that variation can have a pronounced influence on the data and estimates, given the low sighting rates. For example, the mean group size of the 1 sighting of Longman's beaked whales made during the HICEAS in 2002 is 17.8 individuals (Barlow, 2006), compared with the mean of 59.8 individuals for the 3 sightings during the HICEAS in 2010. The single, chance sighting of 100 Longman's beaked whales in 2010 is alone a basis for expecting marked differences in the abundance estimates between the 2 surveys. In addition, although the total length of systematic survey effort during the HICEAS in 2010 (16,145 km) was similar to that of the HICEAS in 2002 (17,050 km), survey coverage within the pelagic portion of the Hawaiian Islands EEZ was somewhat greater in 2010 than in 2002 because 3350 km of the HICEAS in 2002 was dedicated to an intensive survey of the main Hawaiian Islands (Barlow, 2006). This shift in survey coverage along with random variation likely contributed to differences in the total number and species composition of sightings.

More broadly, there likely was interannual variation in oceanographic conditions between the 2 surveys that led to differences in the distribution and density of species in the study area (Forney et al., 2015). This factor becomes particularly important because the Hawaiian Islands EEZ is a jurisdictional rather than a biological stock boundary, and individuals from many associated stocks move into and out of the study area. Therefore, apparent differences in species stock density and abundance between the 2 surveys may not represent actual changes in the underlying population (or populations), but rather indicate a change in the proportion of the population within the Hawaiian Islands EEZ.

Finally, although data collection protocols were consistent and a similar analytical framework was used for each survey, differences in the estimation process make the resulting estimates difficult to compare. Although sightings from both the HICEAS in 2002 and 2010 were pooled with sightings from previous surveys for modeling detection functions, the pooled sightings for the 2010 estimation were limited geographically to minimize heterogeneity resulting from geographical differences in species associations and behavior and were further combined with sightings of species with similar detection characteristics. Differences in the pooled sightings used for modeling the detection functions likely partially explain differences in the estimates of mean ESW in 2002 and 2010 for many species (Barlow, 2006, table 3; Table 3).

However, the biggest difference in the estimation procedure for each survey is the use of the g(0) estimates of Barlow (2015) in the analysis of data from the HICEAS in 2010. The present study is the first to apply these values to species in the central Pacific, and the resulting g(0) estimates (Table 3) are markedly lower than those used by Barlow (2006), as well as those used in all known previous analyses of line-transect surveys of cetaceans. The g(0) estimates in the present study reflect the effect of the sighting conditions during the HICEAS in 2010, represented by Beaufort sea state, and range from being 1.3 times (78.9%) smaller (i.e., for short-finned pilot whales and Longman's beaked whales) to almost 9 times (11.2%) smaller (i.e., for rough-toothed dolphins) than the g(0) estimates of Barlow (2006). The estimates of g(0) for 2010 are even more reduced than the values from 2002 for sightings with more than 20 individuals because g(0) previously was assumed to be 1 for larger groups of most species (Barlow, 2006).

The lower g(0) estimates for 2010, in combination with group sizes numbering in the tens to hundreds of individuals, are responsible for the relatively large estimates of abundance for the small and medium delphinids (Table 3)-values that are strikingly higher than the estimates determined by Barlow (2006). Point estimates of abundance in Barlow (2006) are larger than those of the present study for only 4 species: the killer and sperm whales, Blainville's beaked whale (Mesoplodon densirostris), and Cuvier's beaked whale. The estimates for killer and sperm whales are of the same magnitude in both studies and indicate that random variation in other aspects of the estimation (e.g., the number of encounters and group size for killer whales and the mean ESW for sperm whales) likely countered the effects of the slightly lower g(0) estimates for the HICEAS in 2010.

The encounter rate for beaked whales was much lower for the HICEAS in 2010 because survey effort in Beaufort sea states 0-6 was used in the abundance estimation, but only effort in Beaufort sea states 0-2 was used in the analysis for the HICEAS in 2002 (Barlow, 2006). The corresponding decrease in g(0) for the HICEAS in 2010 was not enough to reduce the effect of the decreased encounter rate for Cuvier's beaked whales, and random variation did not mitigate the effect, as the larger group size of the sighting in 2010 did for Blainville's beaked whales. As a result, the abundance estimate for Cuvier's beaked whales was more than 20 times larger for 2002 than for 2010. Results of an analysis in which habitat associations were used to estimate the densities and abundances of a subset of species encountered during the HICEAS in 2002 and 2010 (Forney et al., 2015) are also not directly comparable with results from the present study because Forney et al. (2015) used g(0) estimates of the same order of magnitude as those in Barlow (2006).

A major assumption with cetacean line-transect analyses that was challenged by the estimation of g(0)by Barlow (2015) is that g(0) is equal to 1 for large groups of dolphins (Brandon et al.<sup>4</sup>; Gerrodette and Forcada, 2005). However, the model used to infer the relative values of g(0) in different sighting conditions did not specifically test for the effect of group size on g(0) or allow for potential interactions between group size and sighting conditions. The analysis did determine that group sizes decreased with increasing Beaufort sea state for many of the species considered (Barlow, 2015). If individuals of some species do form smaller groups in rougher sea conditions, abundance estimates based on observations of these groups would be positively biased. However, Barlow (2015) suggested that the decrease in group sizes at higher Beaufort sea states is more likely due to the underestimation of group size in rougher sea conditions.

Although more testing is needed, there is no evidence that actual group size changes as a function of Beaufort sea state (Barlow, 2015). Further, the Barlow (2015) g(0) model not explicitly incorporating group size is presumably not an issue for the estimation in the present study unless the distribution of group sizes in the data subset from the HICEAS in 2010 is different from that of the full data set of the Barlow (2015) model. This question is difficult to assess qualitatively because summaries of mean group sizes from other study locales represented in the full data set (e.g., Ferguson et al., 2006; Barlow and Forney, 2007) do not reflect the underlying distribution of group sizes overall or by Beaufort sea state. Additional analyses are needed to quantitatively evaluate the effect of group size on the Beaufort-specific estimates of g(0)and, therefore, to confirm that the estimates can be applied to all group sizes in the study locations covered by Barlow (2015). Validation of the actual g(0) estimates (e.g., by comparisons with acoustic detections) would also be valuable.

For the species that were sighted during the HI-CEAS in 2010 (Table 3), but were not included in the analysis of Barlow (2015) (i.e., the Fraser's dolphin, melon-headed and pygmy killer whales, and Longman's beaked whale), use or averages of the g(0) estimates of associated species in the detection function species pools (Table 2) may not have been appropriate and could have biased the estimation of abundance for these species. Future efforts to estimate g(0) for these species when sufficient sample sizes are available would resolve this issue and are recommended.

The rough-toothed dolphin was noted as an outlier in the estimation of g(0) by Barlow (2015), showing the most rapid decline in g(0) with increasing Beaufort sea state of all the species. The impact of this effect is clear in the abundance estimation for the HICEAS in 2010 in that the value of g(0) for the rough-toothed dolphin is the lowest of all the species and the resulting abundance estimate is the highest (Table 3). Given their relatively small group sizes and subtle surfacing behavior (i.e., surfacing without conspicuous splashes), rough-toothed dolphins have been described by experienced observers as difficult to detect (Yin<sup>5</sup>), but this characterization has not been explicitly quantified and is not readily apparent from qualitative comparisons of multispecies data. For example, the mean group size and ESW for rough-toothed dolphins in this study are

<sup>&</sup>lt;sup>4</sup> Brandon, J., T. Gerrodette, W. Perryman, and K. Cramer. 2002. Responsive movement and g(0) for target species of research vessel surveys in the eastern tropical Pacific Ocean. Southwest Fish. Sci. Cent. Admin. Rep. LJ-02-02, 28 p. [Available from Southwest Fisheries Science Center, National Marine Fisheries Service, 8901 La Jolla Shores Dr., La Jolla, CA 92037.]

<sup>&</sup>lt;sup>5</sup> Yin, S. 2015. Personal commun. Hawaii Marine Mammal Consortium, Kamuela, HI 96743.

not smaller than those of the other medium delphinids (Table 3).

In a multispecies assessment of odontocetes in Hawaii that was based on small-boat surveys, Baird et al. (2013) found that measures reflecting the detectability of rough-toothed dolphins (i.e., mean group size, mean distance when first sighted, and sightings per unit of effort) were nearly identical to those for bottlenose dolphins, and individuals of both species are frequently sighted around the main Hawaiian Islands. Resighting rates of individual rough-toothed dolphins were high enough to indicate that island-associated populations are not exceptionally large (Baird et al., 2008). The results from Baird et al. (2008) pertain to island-associated populations, but Barlow (2006) estimated that the density of rough-toothed dolphins was approximately 2.5 times higher within 140 km of the main Hawaiian Islands than throughout the rest of the Hawaiian Islands EEZ. Therefore, there are no available quantitative measures that would indicate that rough-toothed dolphins are particularly more difficult to see than individuals of other species or have especially high abundance in the Hawaiian Islands EEZ. Further, roughtoothed dolphins frequently associate with individuals of other species and are generally not known to avoid vessels (Baird et al., 2008). Hence, a source of negative bias in the g(0) estimates of Barlow (2015) for roughtoothed dolphins is not obvious.

Rough-toothed dolphins were used as a case study in an evaluation of the use of passive acoustics as an independent detection platform for observers in the eastern tropical Pacific (Rankin et al.<sup>6</sup>). That study estimated that a majority of groups of rough-toothed dolphins were missed on the trackline. Because additional species were not assessed, it is unclear how often rough-toothed dolphins were missed in comparison with individuals of other species. Overall, the low g(0) estimates and correspondingly high abundance estimates of rough-toothed dolphins in the Hawaiian Islands EEZ cannot be explained.

As with the abundance estimates from the HICEAS in 2002 (Barlow, 2006), the precision of the estimates from the HICEAS in 2010 is generally poor (Table 3). For both sets of estimates, this imprecision is largely a result of the low number of sightings of most species. That is, these low numbers of sightings led to a high variance in each encounter rate that dominated the overall CV estimate (Barlow, 2006). However, the CVs of most estimates of abundance for 2010 are lower than the estimates for 2002, despite the addition of covariate model selection and averaging in the bootstrap procedure used in the estimation for 2010. This slight increase in precision could be linked to the greater number of sightings during the HICEAS in 2010. Sample sizes for modeling the detection functions were generally higher in the analysis for 2002 because pooled sightings from throughout the eastern North Pacific were used (Barlow, 2006). Although restricting the assessment for 2010 to sightings from the central North Pacific reduced available sample sizes for the estimation of detection functions, it likely reduced heterogeneity that could not be accounted for by covariate testing and could have resulted in more precise abundance estimates for 2010.

Cetaceans were sighted throughout the Hawaiian Islands EEZ (Fig. 1), but the distributions of sightings, by species, indicate areas of concentration for some species (Fig. 2). For example, sightings of pantropical spotted dolphins were concentrated south of the main Hawaiian Islands, and sightings of sperm whales were concentrated in the northwestern portion of the Hawaiian Islands EEZ. The underlying distributions represent species-specific habitat associations and can vary temporally and spatially, leading to differences in species distributions between the HICEAS in 2002 and 2010 (Forney et al., 2015). These habitat associations were used to predict higher densities around the Hawaiian Archipelago for several species, although not for all of them (Forney et al., 2015).

Even with island-influenced productivity, the waters of the Hawaiian Islands EEZ are generally oligotrophic—a condition that is reflected in the low density of cetaceans in the Hawiian Islands EEZ compared with densities in areas with relatively high production (e.g., Wade and Gerrodette, 1993; Mullin and Fulling, 2004; Barlow and Forney, 2007). For example, total cetacean density in the eastern tropical Pacific was estimated to be 520 individuals/1000 km<sup>2</sup> (Wade and Gerrodette, 1993), and total cetacean density in the Southern California portion of the California Current ecosystem was estimated to be 678 individuals/1000 km<sup>2</sup> (calculated from values given in Barlow and Forney, 2007). Both of those studies underestimated abundance by overestimating g(0). Despite the application of the lower Beaufort-specific values of g(0) in the present study, total cetacean density was estimated to be only 146 individuals/1000 km<sup>2</sup>.

Approximately 93% of the estimated cetacean density for the HICEAS in 2010 consists of dolphin species. On the basis of sighting frequencies from small-boat surveys, Baird et al. (2013) suggested that the pantropical spotted dolphin was the most abundant cetacean species around the main Hawaiian Islands. In the broader Hawaiian Islands EEZ, the pantropical spotted dolphin was the thirdmost abundant species after the roughtoothed and striped dolphins (Table 3). The density of large whales (i.e., sperm and baleen whales) during the HICEAS in 2010 was about 2% of the total estimated cetacean density. The sperm whale was estimated to be the most abundant large whale species in the Hawaiian Islands EEZ, although the estimated density of 1.86 individuals/1000 km<sup>2</sup> for this species is just over half the density of sperm whales in the northeastern

<sup>&</sup>lt;sup>6</sup> Rankin, S., J. Barlow, J. Oswald, and T. Yack. 2009. A comparison of the density of delphinids during a combined visual and acoustic shipboard line-transect survey [Abstract]. In 1st international workshop on density estimation of marine mammals using passive acoustics; Pavia, Italy, 10–13 September, p. 75. [Available at website, accessed May 2015.]

temperate Pacific (Barlow and Taylor, 2005). However, the Barlow and Taylor (2005) density estimate of 3.38 individuals/1000 km<sup>2</sup> is based on a value of g(0) that does not account for varying sighting conditions and, therefore, is likely to be an underestimate.

Density and abundance estimates of the seasonally migrating species of baleen whales (i.e., the sei, fin, and blue whales) are difficult to interpret because the HICEAS in 2010 was not conducted during the winter period of peak abundance for these species. However, the estimates do indicate the presence of individuals of these species in low numbers during the summer and fall (Table 3), as has been determined with acoustic studies of fin and blue whales (Thompson and Friedl, 1982). Bryde's whales remain year-round at tropical and subtropical latitudes and were estimated to have a density of 0.72 individuals/1000 km<sup>2</sup> during the HI-CEAS in 2010. This density is similar to the value of 0.68 individuals/1,000 km<sup>2</sup> in the eastern tropical Pacific (Wade and Gerrodette, 1993), although this value would presumably increase with the application of appropriate g(0) estimates.

Beaked whales accounted for the remaining 5% of cetacean density in the Hawaiian Islands EEZ during the HICEAS in 2010. The densities of Mesoplodon spp. and Cuvier's beaked whales during the HICEAS in 2010 were estimated to be 2.75 and 0.30 individuals/1000 km<sup>2</sup>, respectively-values that are lower than estimates of 2.96 and 4.55 individuals/1000 km<sup>2</sup> from the eastern tropical Pacific (Ferguson et al., 2006), particularly for Cuvier's beaked whales. Although only 4% of the estimated delphinid abundance in the HICEAS in 2010 could not be identified to species, more than 30% of the rorqual abundance and 40% of the beaked whale abundance could not be identified to species. In addition to the use of new acoustic information or updated g(0) values, future efforts to refine the abundance estimates for the HICEAS in 2010 could include the use of a proration approach (e.g., Wade and Gerrodette, 1993) to assign the abundance of unidentified rorquals and beaked whales to species.

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# Literature cited

- Allen, B. M., and R. P. Angliss.
  - 2014. Alaska marine mammal stock assessments, 2013. NOAA Tech. Memo. NMFS-AFSC-277, 294 p.
- Baird, R. W.
  - 2005. Sightings of dwarf (Kogia sima) and pygmy (K. breviceps) sperm whales from the main Hawaiian Islands. Pac. Sci. 59:461-466. Article
- Baird, R. W., D. L. Webster, S. D. Mahaffy, D. J. McSweeney, G. S. Schorr, and A. D. Ligon.
- 2008. Site fidelity and association patterns in a deep-water dolphin: rough-toothed dolphins (*Steno bredanensis*) in the Hawaiian Archipelago. Mar. Mamm. Sci. 24:535–553. Article
- Baird, R. W., A. M. Gorgone, D. J. McSweeney, A. D. Ligon, M. H. Deakos, D. L. Webster, G. S. Schorr, K. K. Martien, D. R. Salden, and S. D. Mahaffy.
  - 2009. Population structure of island-associated dolphins: evidence from photo-identification of common bottlenose dolphins (*Tursiops truncatus*) in the main Hawaiian Islands. Mar. Mamm. Sci. 25:251–274. Article
- Baird, R. W., D. L. Webster, J. M. Aschettino, G. S. Schorr, and D. J. McSweeney.

2013. Odontocete cetaceans around the main Hawaiian Islands: habitat use and relative abundance from small-boat sighting surveys. Aquat. Mamm. 39:253-269. Article

- Barlow, J.
  - 1995. The abundance of cetaceans in California waters. Part I: ship surveys in summer and fall of 1991. Fish. Bull. 93:1-14.
  - 1999. Trackline detection probability for long diving whales. In Marine mammal survey and assessment methods (G. W. Garner, S. C. Amstrup, J. L. Laake, B. F. J. Manly, L. L. McDonald, and D. G. Robertson, eds.), p. 209–221. A. A. Balkema, Rotterdam, Netherlands.
  - 2006. Cetacean abundance in Hawaiian waters estimated from a summer/fall survey in 2002. Mar. Mamm. Sci. 22:446-464. Article
  - 2015. Inferring trackline detection probabilities, g(0), for cetaceans from apparent densities in different survey conditions. Mar. Mamm. Sci. 31:923-943. Article
- Barlow, J., and B. L. Taylor.
- 2005. Estimates of sperm whale abundance in the northeastern temperate Pacific from a combined acoustic and visual survey. Mar. Mamm. Sci. 21:429–445. Article
- Barlow, J., and K. A. Forney.
  - 2007. Abundance and population density of cetaceans in the California Current ecosystem. Fish. Bull. 105: 509-526.
- Barlow, J., T. Gerrodette, and J. Forcada.
  - 2001. Factors affecting perpendicular sighting distances on shipboard line-transect surveys for cetaceans. J. Cetacean Res. Manage. 3:201–212. [Available from website.]
- Barlow, J., L. T. Ballance, and K. A. Forney.
- 2011a. Effective strip widths for ship-based line-transect surveys of cetaceans. NOAA Tech. Memo. NMFS-SWF-SC-484, 28 p.
- Barlow, J., J. Calambokidis, E. A. Falcone, C. Scott Baker, A. M. Burdin, P. J. Clapham, J. K. B. Ford, C. M. Gabriele, R. LeDuc, D. K. Mattila, T. J. Quinn, II, L. Rojas-Bracho, J. M. Straley, B. L. Taylor, Jorge Urbán R., P. Wade, D. Weller, B. Witteveen, and M. Yamaguchi.
  - 2011b. Humpback whale abundance in the North Pacific

estimated by photographic capture-recapture with bias correction from simulation studies. Mar. Mamm. Sci. 27:793-818.

Bradford, A. L., K. A. Forney, E. M. Oleson, and J. Barlow.

- 2014. Accounting for subgroup structure in line-transect abundance estimates of false killer whales (*Pseudorca crassidens*) in Hawaiian waters. PLoS ONE 9:e90464. Article
- Bradford, A. L., E. M. Oleson, R. W. Baird, C. H. Boggs, K. A. Forney, and N. C. Young.
  - 2015. Revised stock boundaries for false killer whales (*Pseudorca crassidens*) in Hawaiian waters. NOAA Tech. Memo. NMFS-PIFSC-47, 29 p. Article
- Buckland, S. T., D. R. Anderson, K. P. Burnham, J. L. Laake, D. L. Borchers, and L. Thomas.
  - 2001. Introduction to distance sampling: estimating abundance of biological populations, 448 p. Oxford Univ. Press, Oxford, UK.
- Carretta, J. V., K. A. Forney, M. M. Muto, J. Barlow, J. Baker, B. Hanson, and M. S. Lowry.
  - 2005. U.S. Pacific marine mammal stock assessments: 2004. NOAA Tech. Memo. NMFS-SWFSC-375, 323 p.
- Carretta, J. V., K. A. Forney, E. Oleson, K. Martien, M. M. Muto, M. S. Lowry, J. Barlow, J. Baker, B. Hanson, D. Lynch, L. Carswell, R. L. Brownell Jr., J. Robbins, D. K. Mattila, K. Ralls, and M. C. Hill.
  - 2011. U.S. Pacific marine mammal stock assessments: 2010. NOAA Tech. Memo. NMFS-SWFSC-488, 360 p.
- Carretta, J. V., E. Oleson, D. W. Weller, A. R. Lang, K. A. Forney, J. Baker, B. Hanson, K. Martien, M. M. Muto, A. J. Orr, H. Huber, M. S. Lowry, J. Barlow, D. Lynch, L. Carswell, R. L. Brownell Jr., and D. K. Mattila.
  - U.S. Pacific marine mammal stock assessments,
    NOAA Tech. Memo. NMFS-SWFSC-532, 406 p.
- Ferguson, M. C., J. Barlow, S. B. Reilly, and T. Gerrodette. 2006. Predicting Cuvier's (*Ziphius cavirostris*) and *Mesoplodon* beaked whale population density from habitat characteristics in the eastern tropical Pacific Ocean. J. Cetacean Res. Manage. 7:287-299.
- Forney, K. A., E. A. Becker, D. G. Foley, J. Barlow, and E. M. Oleson.
  - 2015. Habitat-based models of cetacean density and distribution in the central North Pacific. Endang. Spec. Res. 27:1-20. Article

Gerrodette, T., and J. Forcada.

2005. Non-recovery of two spotted and spinner dolphin populations in the eastern tropical Pacific Ocean. Mar. Ecol. Prog. Ser. 291:1-21. Article Herman, L. M., and R. C. Antinoja.

- 1977. Humpback whales in the Hawaiian breeding waters: population and pod characteristics. Sci. Rep. Whales Res. Inst. 29:59-85.
- Hurvich, C. M., and C.-L. Tsai.
- 1989. Regression and time series model selection in small samples. Biometrika 76:297–307. Article

Marques, F. F. C., and S. T. Buckland.

- 2004. Covariate models for the detection function. In Advanced distance sampling: estimating abundance of biological populations (S. T. Buckland, D. R. Anderson, K. P. Burnham, J. L. Laake, D. L. Borchers, and L. Thomas, eds.), p 31-47. Oxford Univ. Press, Oxford, UK.
- McSweeney, D. J., R. W. Baird, and S. D. Mahaffy.
  - 2007. Site fidelity, associations, and movements of Cuvier's (Ziphius cavirostris) and Blainville's (Mesoplodon densirostris) beaked whales off the island of Hawai'i. Mar. Mamm. Sci. 23:666-687. Article
- Mobley, J. R., Jr., G. B. Bauer, and L. M. Herman.
- 1999. Changes over a ten-year interval in the distribution and relative abundance of humpback whales (*Megaptera novaeangliae*) wintering in Hawaiian waters. Aquat. Mamm. 25:63-72.
- Mullin, K. D., and G. L. Fulling.
- 2004. Abundance of cetaceans in the oceanic northern Gulf of Mexico, 1996–2001. Mar. Mamm. Sci. 20:787–807. Article
- Norris, K. S., and T. P. Dohl.
- 1980. Behavior of the Hawaiian spinner dolphin, *Stenella longirostris*. Fish. Bull. 77:821–849.
- Norris, K. S., B. Würsig, R. S. Wells, and M. Würsig.
- 1994. The Hawaiian spinner dolphin, 436 p. Univ. California Press, Berkeley, CA.

Pryor, T., K. Pryor, and K. S. Norris.

- 1965. Observations on a pygmy killer whale (Feresa attenuata Gray) from Hawaii. J. Mammal. 46:450-461. Article
- Shane, S. H., and D. McSweeney.
  - 1990. Using photo-identification to study pilot whale social organization. Spec. Issue Rep. Int. Whaling Comm. 12:259-263.
- Thompson, P. O., and W. A. Friedl.
  - 1982. A long-term study of low frequency sounds from several species of whales off Oahu, Hawaii. Cetology 45:1-19.
- Wade, P. R., and T. Gerrodette.
  - 1993. Estimates of cetacean abundance and distribution in the eastern tropical Pacific. Rep. Int. Whaling Comm. 43:477-493.