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Valeria Senigaglia, Daniella Hanf, Alessandro Ponzo

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1 Original Article

# 2 Distribution and habitat partitioning of cetaceans (Mammalia: 3 Cetartiodactyla) in the Bohol Sea, Philippines.

- 4 Valeria Senigaglia<sup>a,b,c,\*</sup>, Daniella Hanf<sup>c,d,e</sup>, Alessandro Ponzo<sup>c</sup>
- 5
- 6 <sup>a</sup> Centre for Sustainable Aquatic Ecosystems, Harry Butler Institute, Murdoch University, Perth,
- 7 WA, Australia
- 8 <sup>b</sup>Environmental and Conservation Sciences, Murdoch University, Perth, WA, Australia
- 9 <sup>c</sup>Large Marine Vertebrates Project Philippines, Physalus, Roma, Italy
- 10 <sup>d</sup> Cetacean Ecology, Behaviour and Evolution Lab, Flinders University, Adelaide, SA, Australia
- 11 <sup>e</sup> O2 Marine, Busselton, WA, Australia

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- **13 \*Correspondent author.** Tel.: +61 (0) 454-837-914
- 14 *E-mail address*: valeria.senigaglia@gmail.com (Valeria Senigaglia)

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- 16 **Running title:** Cetaceans of the Bohol Sea, Philippines
- 17

#### 18 Abstract

#### 19

20 Understanding broad-scale species distribution and finer-scale ecological interactions is 21 essential for conservation. We assessed species richness, distribution, habitat use and interspecific 22 associations of cetacean in the Bohol Sea, Philippines. During 72 days of dedicated survey (2010 -23 2013), we encountered 12 species of cetacean in 291 sightings, 16.8% of which involved mixed 24 species. We used maximum entropy (MaxEnt) models to assess species' habitat suitability and 25 found slope and distance from the coast to be influential contributors to cetacean distribution. To 26 explore habitat use, through foraging ecology and niche segregation of sympatric species, we 27 compared behavioral budgets across species and found significant differences (chi-sq = 21.44; p-28 value = 0.044). We then used GLMs to determine the foraging likelihood in relation to 29 oceanographic features, group size and presence of associated species. Results from model 30 selection complimented those derived from MaxEnt. However, some inter-specific exclusion 31 behavior might also occur. Overall, our study suggests that the Bohol Sea supports a high cetacean 32 biodiversity while more complex inter-specific dynamics might further shape species' ecological 33 niches. These results highlight the importance of multi-species ecology and can be used to develop 34 management actions.

35

36 Keywords: Marine conservation, ecological niche, IMMA, habitat suitability, melon-headed whale

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#### 38 Introduction

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40 Marine biodiversity is threatened by anthropogenic activities and climate change (Hazen 41 et al. 2013; Worm and Lotze 2021). Identifying areas of high biodiversity is a key conservation 42 strategy as it allows for the implementation of effective spatial management (e.g., through the 43 identification of marine protected areas) (Jones and Cheung 2015). The conservation of marine 44 megafauna, including cetacean (i.e., whale and dolphin) species is particularly important due to the 45 top-down effect of predators on the broader ecosystem (Castro Tavares et al. 2019). Marine 46 mammal species richness is often higher in areas of human activity, increasing their conservation 47 priority (Pompa et al. 2011). Recently, a new framework has been proposed to identify Important 48 Areas for Marine Mammals (IMMA) to support local and national regulatory and management 49 actions (Important Marine Mammal Areas, www.marinemammalhabitat.org; Tetley et al. 2022).

50 Tropical areas are characterized by high marine biodiversity, and cetacean occurrence has 51 been studied in many of these places, including the Gulf of Mexico (Maze-Foley and Mullin 2006) 52 the Indian Ocean (Gross et al. 2009), the Bahamas (Macleod 2004) and the Eastern Tropical Pacific 53 Ocean (Ballance et al. 2006). Cetacean communities in these areas feature a wide range of species 54 as Stenella spp., common bottlenose (Tursiops truncatus) and common dolphins (Delphinus 55 delphis), rough-toothed dolphins (Steno bredanensis), Risso's dolphin (Grampus griseus), melon-56 headed whales (*Peponocephala electra*), short-finned pilot whales (*Globicephala machrorynchus*), 57 pygmy or dwarf sperm whale (Kogia spp.), false killer whale (Pseudorca crassidens) and sperm 58 whales (Physeter macrocephalus). Moreover, baleen species as humpback whales (Megaptera 59 novangliae; Acebes et al. 2007), Bryde's whales (Balaenoptera brydei) and blue whales 60 (Balaenoptera musculus) are seasonal occupants of the tropical waters (Ballance et al. 2006). The 61 composition of each community and the residency degree of the various species may vary 62 accordingly to the area examined.

63 Philippine waters are inhabited by 24 species of cetacean, throughout a range of habitat 64 types. Although some areas have been studied extensively, peer-reviewed publications information 65 on current cetacean distribution in these waters are scarce (Dolar et al. 2006; Acebes et al. 2021). 66 The Visayan region, located within the central Philippines, is one of the richest marine biodiversity 67 hotspots in the world and contains Tañon Strait and Bohol Sea Important Marine Mammal Areas 68 (IMMAs), designated by the International Union for the Conservation of Nature (IUCN) 69 (Notarbartolo di Sciara and Hoyt 2020). Although a major area for primary productivity (Cabrera 70 et al. 2011), the Bohol Sea has received relatively low research attention, in contrast to the adjacent 71 Tañon Strait (e.g., Dolar et al. 2006). The Bohol Sea also hosts a profitable marine tourism industry,

72 including whale-watching (Samonte-Tan et al. 2007; Sorongon et al. 2010), has developed after the 73 ban of dolphin hunting in 1992 and further of all cetaceans in 1997 (Acebes 2009; Acebes 2014). 74 While the consumptive use of cetaceans has stopped in the Bohol Sea, wildlife tourism, fishing 75 industry, shipping, ferries, and climate change remain as prominent risks to cetacean populations 76 in the area. Marine biodiversity in South-East Asian waters is generally at risk from human 77 activities (Halpern et al. 2015) but order to protect species from the rapid expansion of marine 78 activities in the Bohol Sea and the global challenge of climate change, is important to provide 79 updated knowledge on the cetacean community. We conducted non-systematic surveys to record 80 presence and relative abundance of cetacean in the northeastern Bohol Sea. We used Maximum 81 Entropy (MaxEnt) software (Breen et al. 2016; Rogan et al. 2017) to model cetacean habitat 82 suitability across the study area and determine response to static environmental features (e.g., Sahri 83 2021; Smith et al. 2021; Hanf et al. 2022). These output scan support effective marine spatial 84 planning and improve species' protective measures (Peterson 2003; Merow et al. 2013; Cañadas et 85 al. 2002). Understanding species' ecological niches, in terms of interactions and habitat use, 86 strengthens conservation efforts (Kiszka et al. 2011; Kiszka et al. 2015) and avoid species 87 displacement to suboptimal areas (Pirotta et al. 2018). Determining the drivers of the fine-scale 88 distribution of cetacean species allows for a better understanding of their resilience in a changing 89 environment (Díaz López and Methion 2018). Foraging ecology is a likely driver of cetacean 90 presence (Hazen et al. 2009) but reproductive needs (i.e., calves' protection from predators) and 91 inter-specific competition can also influence cetacean distribution (Díaz López and Methion 2018). 92 We compared behavioral budgets across species to determine habitat use. For those species with 93 sufficient data, we further explored environmental and biological variables that could affect the 94 likelihood of foraging behavior to test the hypothesis that foraging ecology determine a species 95 spatial distribution. We also reported on group size and composition to explore whether the area 96 could serve as a nursing ground. The exclusion hypothesis states that inter-specific competition for 97 resources can explain fine-scale species distribution for species with overlapping (partially or 98 entirely) home range (Zabala et al. 2009; Pinela et al. 2011; Reisinger et al. 2020). We tested this 99 hypothesis by looking at patterns of mixed-species associations. Our study provides insights on the 100 distribution and behavioral ecology of cetacean species inhabiting the Bohol Sea and provide useful 101 information for management and conservation effort.

- 102
- 103 Material and methods
- 104
- 105 Study area

107 The 2529.3 km<sup>2</sup> study area is located in the northeast Bohol Sea, between Pamilacan Island, 108 in the municipality of Baclayon, (Bohol Province) in the west and San Ricardo, Southern Leyte in 109 the east (Figure 1). The Bohol Sea, also known as the Mindanao Sea, is a semi-enclosed marginal 110 sea extending 29,000 sq km from the Sulu Sea to the Pacific Ocean (Indab and Suarez-Aspilla 111 2004). It is bound by the Visayan Islands of Mindanao (south) and Negros, Bohol and Leyte (north). 112 The Bohol Sea features a complex hydrographic system referred as double-estuarine circulation 113 (Cabrera et al. 2011). The northeastern part of the Bohol Sea is geographically characterized by an 114 inshore deep trench where the Mindanao Current, a bifurcation of the North Equatorial Current 115 coming from the Pacific Ocean, causes an overturning circulation that promotes upwelling of cold, 116 nutrient-rich waters within the Bohol Sea (Cabrera et al. 2011). Due to the Mindanao current and 117 the inshore deep trench most of the biomass is expected to be in the northeastern part of the Bohol 118 Sea. promoting phytoplankton blooms (Cabrera et al. 2011).

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120 Data collection

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122 Non-systematic, dedicated boat surveys were conducted from March 2010 to July 2013. 123 Boat renting and water access facilities were available only in Jagna (Bohol) and Pamilacan Island 124 (Baclayon, Bohol) (herein referred as Pamilacan). Surveys were undertaken on motorized 125 'Bangkas', traditional Philippine wooden double outrigger boats. Surveys were conducted in good 126 sightings conditions in Beaufort sea state  $\leq 3$  and daylight hours (as early as 6:30 am until sunset 127 around 8 pm). Maximum effort was expended during the dry season (from January to April) and 128 limited during the wet season (from May to December) due to restrictive weather conditions. The 129 survey targeted waters off Jagna and Pamilacan (Figure 1), where boats could be rented and 130 launched from. The ability to travel between these areas was hindered by boat engine capability 131 and the amount of fuel that could be carried onboard. Surveys maximized area coverage by 132 encompassing the entire bathymetric range crossing isobaths in a perpendicular fashion. In the 133 survey area, mean depth was 1,129 m, median depth was 1,419 m and greatest depth was 1,869 m.

The sampling strategy was constant throughout the survey period. Effort was continuous during the surveys and sightings were recorded by a team of experienced observers ranging from 3 to 7 individuals, with multiple years of field experience in cetacean research. Species were identified by experienced marine mammal scientists using morphological characteristics. An encounter started when animals were at less than 500 meters from the research boat or whenever was possible to determine group size and predominant behavior of the group. A group was defined

140 as multiple individuals within 50 meters of each other exhibiting same activity and moving in 141 similar direction. Whenever possible, location coordinates, group size, calf presence and 142 predominant behavioral state (displayed by more than 50% of the group), were recorded for each 143 cetacean encounter. The behavioral state was assigned one of four mutually exclusive categories: 144 foraging, traveling, resting, or socializing.

145

146 Analyses

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148 A combination of MaxEnt, summary statistics and regression analysis were used to 149 understand cetacean broad-scale distribution and finer-scale habitat use, based on possible 150 ecological interactions. MaxEnt models were used to assess relative habitat suitability across the 151 study area, and the influence of static environmental variables. Drivers of habitat use were explored 152 using two different approaches to determine whether the Bohol Sea could be used as a i) nursing 153 ground and/or ii) foraging ground. We also explored whether inter-specific competition influences 154 species distribution testing the exclusion hypothesis. Summary statistics were used on presence-155 only data to quantify the relative abundance of cetacean species and group size and composition to 156 determine whether the study area could be used as a nursing ground. We then used estimated species 157 behavioral budgets and utilized generalized linear models (GLMs) to explore foraging likelihood 158 (limited to those species for whom enough data were available). Finally, the number and patterns 159 of mixed species encounters were summarized and compared across species to explore inter-160 specific competition and to test an exclusion hypothesis.

- 161
- 162 Satellite-derived environmental data
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164 Environmental data for use in MaxEnt modelling and GLMs were derived *ex-situ*, using 165 ArcGIS (v 10.4). Static variables (i.e., water depth, slope and distance from the coast) were used to 166 inform both model techniques. Depth was extracted for the survey area from global bathymetry 167 (GEBCO Compilation Group 2008), and slope was derived from this using the "slope tool". 168 Distances from the coast (GADM 2018) were calculated using the ArcGIS Euclidean Distance tool. 169 In addition to the static variables, we also obtained dynamic satellite-derived environmental data 170 (i.e., sea surface temperature (SST) and chlorophyll-a (chl-a)) using Marine Geospatial Ecology 171 Tools (MGET; Roberts et al. 2010). Daily SST were extracted for the immediate study area from 172 Multiscale Ultrahigh Resolution (MUR) blended SST data produced by the NASA Jet Propulsion 173 Laboratory Physical Oceanography Distributed Active Archive Center (PO.DAAC). SST was

174 assessed for study area coverage and explored to determine whether values varied across the spatial 175 and temporal extent of the survey. We used chl-a concentration is also used as a proxy for prey 176 abundance which, in turn, can influence habitat use (Huot et al. 2007; Druon et al. 2019), however 177 dense cloud cover over the Bohol Sea was frequent during our study periods, which resulted in 178 large areas of missing data (Arango et al. 2011). As such, we omitted this variable from further 179 analysis.

180

181 Habitat suitability

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183 We modelled broad-scale habitat suitability by amalgamating cetacean sightings across 184 years, as a presence-only dataset because of the variability in which effort was recorded. We 185 modelled these data using MaxEnt as it is a proven robust approach to modelling when absence 186 data is unavailable or not dependable (Philips et al. 2004; Elith 2011) MaxEnt models were run for 187 melon-headed whales, Fraser's dolphins and spinner dolphins, species for which substantial 188 sightings data were available. Models were not run for the remaining species observed due to the 189 low number of encounters. Depth, slope, and distance from land were modelled as continuous 190 variables. We decided to use the MaxEnt default settings for regularization, features and 191 prevalence. In machine learning, regularization runs a series of model iterations from which the 192 model gains information. MaxEnt uses an automatic regularization setting that has been fine-tuned 193 to suit the number of feature types and sample locations and avoid models from being over-fit 194 (Phillips et al. 2006). Machine learning techniques rely on base functions and transform explanatory 195 data as features. In MaxEnt, the auto features setting applies linear, product, quadratic, hinge, 196 threshold and categorical transformations to the data in order to detect patterns in species response 197 to environmental stimuli, which are often of a complex nature (Elith et al. 2010). We decided not 198 to constrain this setting as we deemed the sample sizes for each species to be large enough to allow 199 MaxEnt to determine which features algorithms were based on, which incorporates a rule regarding 200 the sample size of the species data. We selected the default prevalence of 0.5, which represents a 201 50% change of species occurrence in any cell (Phillips et al. 2004; Elith et al. 2006). Cross-202 validation was used to test the models. Samples were divided into 25 replicate folds, with each fold 203 in turn used for test data. Cross-validation is preferable to using a single training/test split in the 204 dataset as it uses all the data for validation, thus making better use of available data. Model 205 performance was expressed with the Area Under the Curve (AUC) metric and interpreted following 206 Hosmer and Lemeshow (1989): <0.5 = none; 0.5 to 0.7 = poor; 0.7 to 0.8 = acceptable; 0.8 to 0.9 207 = excellent; >0.9 = outstanding. Mean relative habitat suitability, as a probability distribution from

208 zero to one based on favourable environmental conditions across the study area, was generated in 209 logistic output and generated as maps. We assessed the relationship of species occurrence to each 210 environmental parameter using marginal response curves. Marginal response curve output 211 represents the influence of the variable on species occurrence, without interactions with other 212 variables. The importance of each variable, relative to the other variables, was interpreted from 213 permutations expressed as a percentage contribution to the model algorithm.

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215 Habitat use

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217 We estimated group size and composition to record the prevalence of groups containing 218 calves as determined by size relative to adults. We compared behavioral budgets across species 219 using Chi-squared parametric test. The observed behavioral frequencies were compared to the 220 expected frequencies and p-values were computed by Monte Carlo simulations based on 10,000 221 replicates. To test the hypothesis that habitat use is driven by foraging ecology, we used GLM to 222 estimate influential parameters on cetacean foraging likelihood. Behavioural data were only 223 available for 2012 and 2013 and for only three species (melon-headed whale, spinner dolphins, and 224 Fraser's dolphin, Lagenodelphis hosei) there were sufficient sightings (N > 30) to allow a 225 meaningful estimate of foraging likelihood. We used a binomial response variable (foraging vs 226 non-foraging) and SST, slope, distance from the coast, water depth, presence of associated species 227 and group size as explanatory variables. We chose this set of environmental variables as they have 228 been reported to influence the distribution of cetacean (Gross et al. 2009). In Hawaii, spinner 229 dolphins have predictable daily behavior, resting in shallow waters during the daytime and foraging 230 at night further from the coast (Heennehan et al. 2017). To account for the possibility that spinner 231 dolphins displayed similar behavioral patterns in the Bohol Sea, we also included time as an 232 explanatory variable of foraging likelihood. AIC values were utilized to conduct model selection. 233 Collinearity between explanatory variables and spatial auto-correlation are commonly encountered 234 when modelling species' distributions (Carl and Kühn 2007; Zuur et al. 2009). thus, we first log-235 transformed the variables slope, distance from the coast and SST, then we tested for collinearity 236 between all pairs of response variables by calculating Spearman's rho. Any two covariates with  $r_2$ 237 > 0.5 were considered significantly correlated and hence just one was included in the model. 238 Variance due to spatial correlation in the data is addressed by the explanatory variables used in the 239 models. Residual spatial variation was determined by visual evaluation of the variogram of the 240 models' residuals. Latitude and longitude were initially added to the models as explanatory 241 variables to account for potential spatial autocorrelation (Viddi et al. 2016) but didn't improve the

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242	model's fit.
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244	Exclusion hypothesis
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246	The percentage of mixed-species associations were calculated and predominant behavior
247	during such encounters were reported.
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249	Results
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251	From March 2010 to June 2013, we surveyed an area of 2529.3 km <sup>2</sup> in the Bohol Sea
252	(Figure 1). A total of 12 cetacean species were encountered (n= 291 sightings, Table 1, Figure 2).
253	Melon-headed whales were the most regularly encountered species, accounting for 41.6% of the
254	sightings (n= 121). Fraser's dolphin (n= $63$ ), were the second mot sighted species, followed by
255	spinner dolphins (Stenella longirostris, n= 41). In fewer numbers, other species recorded were
256	short-finned pilot whales (Globicephala macrorynchus, n= 9), Risso's dolphin (Grampus griseus,
257	n= 8), dwarf sperm whale (Kogia sima, n= 5), Bryde's whale (Balaenoptera edeni <sup>a</sup> , n= 4),
258	Blainville beaked whales (Mesoplodon densirostris, n= 3), pantropical spotted dolphins (Stenella
259	attenuata, n= 2), Indo-pacific bottlenose dolphins (Tursiops aduncus, n= 1), rough-toothed dolphin
260	(Steno bredanensis, $n=1$ ), and blue whale (Balaenoptera musculus <sup>b</sup> , $n=2$ ). Melon-headed whales
261	group size ranged between 1 and 300 (median= 15; $\mu$ = 22.1). In one occasion, several groups
262	converged forming a mega pod of over a thousand individuals. Spinner dolphins are also known to
263	form pod of hundreds of individuals, and we report a group size range between 2 and 500 (median=
264	20; $\mu$ = 40) while Fraser's dolphin group's size ranged between 1 and 100 (median= 20; $\mu$ = 25).
265	
266	Distribution and habitat suitability
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Melon-headed whales were most commonly found along the steep slopes of the deep trench (max depth= 2011m) that characterize the northeast side of the Bohol Sea, along the municipality of Garcia Hernandez, Jagna and Anda and extending until Sogod Bay in Southern Leyte (Figure 3A). Fraser's dolphin distribution resembles the one of melon-headed whales while spinner

<sup>&</sup>lt;sup>a</sup> It should be noted that we have limited confidence in the identification of *B. edeni* due to its similarity to *B. Omura*.

<sup>&</sup>lt;sup>b</sup> According to Acebes et al. (2021), pigmy blue whales (*Balaenoptera musculus brevicauda*) inhabit the Bohol Sea as opposed to *B. musculus*. With limited sightings and no genetic samples, we have no ability to distinguish between the two species.

dolphins were more frequently encountered in the western part of the study area near Pamilacan
Island (Figure 3B and C, respectively). MaxEnt models also predict melon-headed whales and
Fraser's although the former prefer a steeper gradient than the latter. Pilot whales occurred at
greatest slope while spinner dolphins seem to distribute mainly according to distance from the
coast.

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278 Habitat use

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280 Melon-headed whales were frequently seen accompanied by small calves (µ per sighting= 281 1.3) and in some case newborns. Spinner and Fraser's dolphins were also seen with calves but we 282 weren't able to confidently quantify their numbers due to the large group sizes and the brief duration 283 of the encounters. The most common behavior recorded for every species pooled together was 284 resting but behavioral budgets varied significantly across species (Chi-square = 21.44, p-value = 285 0.0337). The two mysticetes species, blue whale and Bryde's whale, were only sighted travelling 286 and foraging, respectively (Figure 5). Melon-headed whales, Fraser's dolphins, spinner dolphins, 287 Risso's dolphins and pilot whales were mainly encountered while resting with foraging being the 288 second most common activity (Figure 5). Results from GLMs show that melon-headed whales tend 289 to forage in bigger groups and further from the coast, the interaction term between these two 290 variables is negatively correlated with foraging likelihood as groups of melon-headed whales were 291 observed congregate further offshore to rest (Figures 3 and 6; Tables 2 and 4). On the contrary, 292 Fraser's dolphins' foraging likelihood decrease with group size and increase during mixed-species 293 encounters (Figure 7), albeit not significantly (group size: z-val= -0.06, pval= 0.09; mixed-species: 294 z-val=1.80, pval=0.14). Spinner dolphins were found more likely to forage at colder sea surface 295 temperatures and smaller slope gradients (Tables 3 and 4). However, the interaction term between 296 slope and sea surface temperature was also found significant and positively influenced foraging 297 likelihood in spinner dolphins (Tables 3 and 4). Our results do not show any significant influence 298 of time of day on spinner dolphins foraging likelihood.

299

300 Exclusion hypothesis

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Mixed species associations represented the 16.8% of the sightings (n= 49) and the most common associated species were melon-headed whales and Fraser's dolphins (Table 5). Pilot whales and melon-headed whales, both belonging to the globicephalinae family, were never encountered together (Table 5). The most common activity recorded during mixed-species 306 encountered for all species was socializing (n=9) although resting was also commonly displayed 307 (n=8). Mixed species associations have been rarely seen while travelling (n=4).

308

### 309 Discussion

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311 In an ecosystem, the assemblage of species at each site is a result of the diversity of habitats 312 and the competition among the various species, the bigger and more diverse the habitat, the highest 313 number of species it can sustain. Tropical habitats are heterogeneous environments that present 314 multiple habitats features corresponding to many potential ecological niches (Sanciangco et al. 315 2013). Presence of cetacean within a limited range can suggest fine-scale mechanism of habitat and 316 resources partitioning allowing for niche segregation (Kiszka et al. 2007). Niche segregation can 317 occur by differences in spatial distribution, behavioral budgets (indicating how and when the area 318 is utilized by each species) and diet specialization.

319 Cetacean populations in Southeast Asia are subject to several threats including habitat 320 degradation, bycatch, direct killing and whale watching pressure (Perrin et al. 2005) but their 321 distribution and habitat preference is still poorly described. Determining cetacean biodiversity and 322 distribution patterns is of fundamental importance to inform species' protection from anthropogenic 323 impact in the area. Our study provides a comprehensive, albeit preliminary, description of cetacean 324 distribution and niche partitioning in the northern Bohol Sea, Philippines. With further targeted 325 surveys for a consistent dataset with reliable presence-absence and behavioral data, our models can 326 be built upon to gain a deeper and more accurate understanding. Moreover, the limited seasonal 327 coverage of our study needs to be acknowledged. Data were only collected during the dry season 328 with most of the surveys conducted between January and March. Thus, the spatial 329 occurrence, species richness and habitat use recorded in this study, only reflect a seasonal 330 distribution and the yearly home range of the observed species remains unverified. Finally, cetacean 331 species differ in their detectability, affected by their behavior, group size and sea state (Barlow 332 2015). During 291 surveys conducted in the Bohol Sea, we recorded 12 of the 19 cetacean species 333 anecdotally reported in the Bohol Sea (Dolar et al. 2006) confirming this region as a hotspot for 334 cetacean biodiversity. The species assemblage found in this study, resembles the one previously 335 reported for the adjacent waters of the Sulu Sea and the Tañon Strait by Dolar et al. (Dolar et al. 336 2006). Similar high cetacean biodiversity is also found in other tropical archipelagos with complex 337 waters inflows, like Bahamas, Hawaii, Mayotte and French Polynesia. Cetacean survey studies 338 conducted in Hawaii report 14 species of odontocetes (Baird et al. 2013) and 9 species in the 339 Bahamas (Macleod 2004). However, the most encountered species reported by Dolar et al. (2006)

340 was the spinner dolphins while melon-headed whales made up for the vast majority of the sightings 341 in the Bohol Sea. Encounter rate of melon-headed whales in the Bohol Sea (mean= 1.5 sighting/day 342 with a minimum of 0.6 in 2011 and a maximum of 2.28 in 2013, likely due to a larger area covered 343 in each survey day in the latter) is higher than in any other site where the species is commonly 344 sighted, including Hawaii (Aschettino et al. 2012); Mayotte Islands (Kiszka et al. 2007); the 345 northern Gulf of Mexico (Maze-Foley and Mullin 2006); South Carolina (Powell and Wells 2011); 346 and around several Pacific oceanic islands (Brownell et al. 2009). The recorded group sizes are in 347 line with findings of the same species in other areas.

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#### 349 Distribution and habitat suitability

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351 The different oceanographic characteristic of the Bohol Sea and the presence of the 352 Mindanao current, create a unique and highly productive environment in which steep depth decline 353 and deep isobaths supply an aptly habitat for many deep diving odontocetes. Cetacean species in 354 the Bohol Sea seems to spatially overlap with most species distributing along steep slope gradients. 355 Depth seems to be influential only for spinner dolphins that prefer shallower habitats (median = 356 393m), closer to the coast (median = 3.6km). Interestingly, Dolar et al. (2006) found that 357 bathymetry and sea surface temperature, and not slope, were the most important variables 358 determining the distribution of Fraser's, bottlenose and Risso's dolphins and the short-finned pilot 359 whale in the adjacent Sulu Sea. Melon-headed preferences for offshore waters (median = 6.8 km) 360 is in line with findings from Hawaii where this species is encountered between 3 and 41.2 km 361 (median = 9.8 km) from coastline (Aschettino et al. 2012). However, in Hawaii, melon-headed 362 whales are encountered at greater depth, ranging between 148 and 4779 m (median = 1,610 m). 363 Deep diving species as melon-headed whales, pilot whales and Risso's dolphins feed primarily on 364 cephalopods and thus their distribution along steep slope gradients likely resembles the one of their 365 preys (Aschettino et al. 2012). Beaked whales also share similar habitat preferences and diet 366 characteristics (Moors-Murphy 2014). Data on blue and Bryde's whales, spotted dolphins and 367 bottlenose dolphins were too sparse to comment on their habitat preferences.

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The presence of calves suggests that the Bohol Sea might be an important breeding area, especially for melon-headed whales. Significant differences in activity budgets among species suggest that the different species might use the area in different ways or that the temporal

<sup>369</sup> Habitat use

374 component of niche segregation is more important than the spatial one. Despite behavioral data 375 were scarce for many of the species encountered in the study area preventing us from drawing 376 absolute conclusions, some trends are apparent. For instance, it is not surprising that melon-headed 377 whales, Fraser's dolphins, spinner dolphins, Risso's dolphins and pilot whales were mainly 378 encountered while resting since all these species are known to be deep divers and/or night foragers. 379 However, there is little information on the diet of these species in the study area. Pilot whales, 380 Risso's dolphins, beaked whales and dwarf sperm whales are known to be mainly squid eaters and 381 deep divers (De Stephanis et al. 2008; Moors-Murphy 2014), thus, the distribution of these species 382 is likely to be indicative of the distribution of larger squid species encountered in the Bohol Sea. 383 Melon-headed whales are also known to feed on cephalopods, but their diet might consist of pelagic 384 fish as well making them share a similar ecological niche to spinner dolphins (Brownell et al. 2009). 385 Niche segregation may occur determined by cephalopods sizes, with bigger and deeper diving 386 dolphins as pilot whales and Risso's dolphins targeting bigger preys. A study from Kiszka et al. 387 (2011) found strong diet difference between melon-headed and short finned pilot whales. The larger 388 size of pilot whales and their ability to dive deeper compared to melon headed whales may partially 389 explain their different diet. The same study also reports that spinner dolphins and melon-headed 390 whales both inhabit tropical offshore waters and share similar diets and habitats. GLM results on 391 foraging likelihood confirms that melon-headed whales and spinner dolphins tend to forage in 392 relation to slope gradients, although the former prefers steeper gradients than the latter. This result 393 is in contrast with what reported by Gross et al. (2009) that found melon-headed whales feed at 394 similar slope and distance from the coast of spinner dolphins. Our results, also show that spinner 395 dolphins feed in cooler waters but time of the day doesn't affect spinner dolphins foraging 396 likelihood in contrast to other areas where this species show a clear cycle of resting during the day 397 and feeding at night. In our study, no surveys were conducted after 16:00, possibly too early to 398 detect a change in behavior of spinner dolphins that tend to congregate in the evening to forage 399 offshore (Dolar et al. 2004). Instead, we most likely recorded opportunistic feeding events close to 400 the coast where spinner dolphins tend to rest. However, it is clear that in the Bohol Sea, spinner 401 dolphins exhibit a less clear temporal segregation of behavior. Fraser's dolphins were mainly 402 encountered in mixed species groups which might explain their tendency to forage mainly in 403 association with other cetacean species. The preference for small groups, while foraging, while still 404 associated with bigger groups of a different species, could reflect a trade-off between minimizing 405 intra-specific competition while ensuring protection for predators, assuming that the two cetacean 406 species feed on different preys. Results from our study should be considered preliminary as they 407 would benefit from a larger due to the paucity of behavioral and environmental dataset which would

- increase the statistical power of our MaxEnt and GLM models. Moreover, we reported on the daily
  foraging ecology of spinner dolphins and melon-headed whales, species known to predominantly
  feed at night, thus our results provide only a partial picture of their foraging habits.
- 411

412 *Exclusion hypothesis* 

413

414 Mixed species associations were recorded but not frequently and their ecological advantage 415 still remains unclear. Anti-predator advantages and information sharing between species of the 416 same trophic level are frequently mentioned in literature as possible explanations for mixed-species 417 associations (Goodale et al. 2020; Syme et al. 2021). However, the overlap of home range also 418 underpins some sort of niche segregation, which is a likely scenario in the Bohol Sea. Our results 419 suggest that species associate mostly by size, tolerating the presence of alien species with similar 420 sizes and group dimensions thus possibly posing less of a threat, and by avoiding animals whose 421 diets overlap too much. The lack of observed mixed group encounters of melon-headed and pilot 422 whales might support the competitive exclusion hypothesis among the globicephalinae family 423 whose species, based on literature, have a diet consisting mostly of cephalopods (Lambert et al. 424 2014). However, further research on their feeding ecology, for example through stable isotopes or 425 stomach content analysis, is necessary to confirm the dietary preferences of globicephalinae in the 426 Bohol Sea. In our study, melon-headed whales and Fraser's dolphins were the species most 427 frequently encountered within mixed-species associations. These two species have similar 428 individual and group sizes but forage on different preys (Kiszka et al. 2011). We hypothesize that 429 the two species associate taking advantage of safety in number while not competing for resources. 430 Moreover, while melon-headed whales were found almost exclusively with Fraser's dolphins and 431 rarely with spinner dolphins, Fraser's dolphin were encountered also with pilot whales and Risso's 432 dolphins suggesting that different dietary requirements and diving abilities may play a more 433 important role than similar size in determining mixed-species association in the Bohol Sea. The 434 tendency of melon-headed whales to form mixed-species associations close to shore and single 435 species superpod offshore, could also be an antipredatory strategy.

436

## 437 Conclusions

438

439 Our study confirmed the Bohol Sea as a high biodiversity area, likely due to its bathymetric
440 features that promote upwelling and offer wide foraging opportunities for a range of cetacean and
441 other marine megafauna species. Our results don't show a clear spatial segregation among species

442 but suggest different behavioral budgets. While the amount of data available greatly differed across 443 species, most of the species inhabiting the Bohol Sea appears to have similar foraging ecology and 444 habitat requirements. Niche partitioning might occur at finer temporal or behavioral scale than the 445 one explored in this study, or the abundance of preys might be sufficient to allow these species to 446 coexist with limited niche partitioning. The Bohol Sea appears to be a hotspot for biodiversity that 447 sustains a large and diversified cetacean community. The unique oceanographic features of the area 448 make it suitable for deep diving species and the upwelling processes ensure its nutrient richness, 449 highlighting the importance of these waters as a foraging site for tropical cetacean communities. 450 The presence of calves in the area also suggests that the Bohol Sea could be a breeding ground at 451 least for melon-headed whales. More information is needed to better describe environmental and 452 ecological factors that may influence cetacean presence and distribution and stable isotopes 453 analyses between others, would help to shed some light on fine-scale niche partitioning. Despite 454 the necessary caveats, our results provide a baseline to initiate species-specific and taxa-specific 455 management intervention, supporting the designation and implementation of the Bohol Sea as an 456 IMMA.

457 Further research is urgently needed to identify and quantify threats, in particular bycatch 458 and noise pollution, and the current status of the remaining populations of cetaceans in the area, to 459 guide spatial planning and other management interventions to ensure the conservation of these 460 species.

461

462 **Declaration of competing interest** 

463

464 The authors declare that they have no known competing financial interests or personal 465 relationships that could have appeared to influence the work reported in this paper.

466

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468

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# **Figure legends**



**Figure 1.** Study area (red dashed lines) location within the Bohol Sea. Modified from Cabrera et al. (2011), the white arrows represent the westward flow of the Bohol Jet and circular flow of the Illigan Bay Eddy, responsible for promoting upwelling and phytoplankton entrainment. Insert: Location within the Philippines.



Figure 2. Total number of sightings per species from 2010-2013.

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**Figure 3.** Point distribution of: A, melon-headed whales (*Peponocephala electra*; 'Pe'; upper left corner); B, Fraser's dolphins (*Lagenodelphis hosei*; 'Lh'; upper right corner); C, spinner dolphins (*Stenella longirostris*, 'Sl'; lower left corner); D, less commonly encountered species (lower right corner), namely Blainville's beaked whale (*Mesoplodon densirostris*, 'Md'); blue whales (*Balaenoptera musculus*, 'Bm'), pantropical spotted dolphins (*Stenella attenuata*, 'Sa'); common bottlenose dolphins (*Tursiops truncatus*, 'Tt'); Bryde's whales (*Balaenoptera edeni*, 'Be'); dwarf sperm whales (*Kogia sima*, 'Ks') and Risso's dolphins (*Grampus griseus*, 'Gg').



**Figure 4.** Left panel: Relative habitat suitability for A, melon-headed whales (*Peponocephala electra*; 'Pe'); B, Fraser's dolphins (*Lagenodelphis hosei*; 'Lh'); C, spinner dolphins (*Stenella longirostris*, 'Sl'), at 500 x 500 m grid cell resolution. Right panel: Probability of D, melon-headed whale; E, Fraser's dolphin; F, spinner dolphin presence as a response to Depth; Slope; Distance from land. m=metres.



**Figure 5.** Behavioural budgets per species. Fo = foraging, Re = resting, So = socializing; Tr= travelling. Pe = melon-headed whales (*Peponocephala electra*); Lh = Fraser's dolphins (*Lagenodelphis hosei*); Sl = spinner dolphins (*Stenella longirostris*); Sa = Pantropical spotted dolphins (*Stenella attenuata*); Tt = common bottlenose dolphins (*Tursiops truncatus*); Gm = short-finned pilot whales (*Globicephala macrorynchus*); Gg = Risso's dolphins (*Grampus griseus*); Be = Brydes whales (*Balaenoptera edeni*); Bm = blue whales (*Balaenoptera musculus*); Ks = dwarf sperm whales (*Kogia sima*); Md = Blainville's beaked whales (*Mesoplodon densirostris*); Sb = rough-toothed dolphins (*Steno bredanensis*).



**Figure 6.** Predicted foraging likelihood (between 0 and 1) of melon-headed whales in relation to the interactive effect of group size and distance from land. Given the big range of group size encountered, we divided group size into bins, each with 20 individuals increment, starting from a minimum of 20 to a maximum of 80 plus.



**Figure 7.** Predicted foraging likelihood of Fraser's dolphins in relation to group size. The two curves refer to encounters when an associated species was present (romboids) and absent (circles) respectively.

## **Table captions**

**Table 1.** Summary of cetacean encountered during the study period in the Bohol Sea. N represent the total number of sightings per each species; S is the group size for which mean, median and maximum values are provided; E is the percentage of encounter per species.

Species	Ν	S			E (%)
		mean	median	max	
Melon headed whales	121	22.1	15	300	41.6
Fraser's dolphins	63	25	20	100	21.6
Spinner dolphins	41	40	20	500	14.1
Pantropical spotted dolphins	2	15	15	15	0.7
Bottlenose dolphins	1	20	20	20	0.3
Short-finned pilot whales	9	19.7	18	60	3.1
Risso's dolphins	8	6.3	5.5	12	2.7
Dwarf sperm whale	5	3	3	3	1.7
Blainville beaked whales	3	NA	NA	NA	1
Rough-toothed dolphins	1	1	1	1	0.3
Bryde's whale	4	1	1	1	1.3
Blue whale	2	1	1	1	0.6

Model	AIC	
	Pe	Lh
Foraging ~ 1	75.2	34.8
Foraging ~ distance from coast	74.4	36.4
Foraging ~ time	77.0	36.5
Foraging ~ slope	76.3	34.2
Foraging ~ SST	77.1	36.0
Foraging ~ presence of associated species	75.6	34.3
Foraging ~ group size	75.8	33.6
Foraging ~ distance from coast + SST	76.2	37.8
Foraging ~ group size+ presence of associate	76.7	32.9
Foraging ~ slope+ SST	78.3	35.4
Foraging ~ slope+ SST+ time	80.2	36.7
Foraging ~ distance from coast + behaviour+ presence of associate	75.7	34.0
Foraging ~ distance from coast + behaviour+ presence of associate + SST	77.7	34.9
Foraging ~ group size* distance from coast	72.6	36.9

 Table 2. Models of foraging likelihood developed for Peponocephala electra and Lagenodelphis hosei.

Table 3. Models of foraging likelihood developed for Stenella longirostris.

Model	AIC
Foraging ~ 1	29.5
Foraging ~ distance from coast	31.2
Foraging ~ time	30.3
Foraging ~ slope	29.0
Foraging ~ SST	31.4
Foraging ~ group size	31.1
Foraging ~ distance from coast + SST	33.2
Foraging ~ slope+ SST+ time	32.6
Foraging ~ slope+ time	30.7

**Table 4.** Matrix of species associations. N represent the percentage of sightings in which the two species were found associated, the sum can exceed 100% since several species can occur in one sightings. N in the diagonal represents the %of time that the species was seen in pure schools. The matrix results asymmetrical because the number of sighting varies by species.

	Pe	Lh	SI	Sa	Tt	IJ	G 30	Ks	рМ	Be	Bm	Sb
Pe (121)	62	37	2.5				X					
Lh (63)	71.4	12.7	3.2			6.4	6.4					
Sl (41)	7.3	4.9	83	2.4			2.4				2.4	
Sa (2)			50	50								
Tt (1)					100							
Gm (9)		44.4				55.5						
Gg (8)		50	12				37.5					
Ks (5)								100				
Md (3)									100			
Be (4)										100		
Bm (2)			50								50	
Sb (1)												100

**Table 5.** Summary of MaxEnt performance and environmental variable contribution for each model. AUC = Area Under the Curve; SD = Standard Deviation. The AUC metric ranges from 0.5 to 1, with a score of 0.5 suggesting that a model has 50% chance of being correct (Fielding and Bell 1997). Hosmer and Lemeshow (1989) recommend model performance by interpreted as <0.5 = none; 0.5 to 0.7 = poor; 0.7 to 0.8 = acceptable; 0.8 to 0.9 = excellent; >0.9 = outstanding. Environmental variable contribution is relative to one another within each model, and is expressed as a percentage.

Model	Training			C (SD)	Variable contribution (%)			
	Sample	AUC (SD)	Sample	AUC (SD)	Depth	Slope	Dist.	
	no.		no.				land	
Melon headed	53	0.814	$\mathbf{r}$	0.784	32.2	47.7	20.1	
whale		(±0.862)	2	(±0.096)				
Fraser's dolphin	95	0.817	4	0784.	18.6	53.6	27.8	
		(±0.784)	4	(±0.153)				
Spinner dolphin	48	0.819	2	0.780	69.1	16.4	14.5	
		(±0.781)	2	(±0.162)				





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#### **Declaration of interests**

 $\boxtimes$  The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

□The authors declare the following financial interests/personal relationships which may be considered as potential competing interests: