1	Biogeography of cephalopods in the Southern Ocean
2	using habitat suitability prediction models
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20 Abstract

21 Our understanding of how environmental change in the Southern Ocean will affect marine 22 diversity, habitats, and distribution remain limited. The habitats and distributions of Southern 23 Ocean cephalopods are generally poorly understood, and yet such knowledge is necessary for 24 research and conservation management purposes, as well as for assessing the potential 25 impacts of environmental change. We used net-catch data to develop habitat suitability 26 models for 15 of the most common cephalopods in the Southern Ocean. Using modelled 27 habitat suitability, we assessed favourable areas for each species and examined the 28 relationships between species distribution and environmental parameters. The results 29 compared favourably with the known ecology of these species and with spatial patterns from 30 diet studies of squid predators. The individual habitat suitability models were overlaid to 31 generate a "hotspot" index of species richness, which showed higher numbers of squid 32 species associated with various fronts of the Antarctic circumpolar current. Finally, we reviewed the overall distribution of these species and their importance in the diet of Southern 33 34 Ocean predators. There is a need for further studies to explore the potential impacts of future 35 climate change on Southern Ocean squid. 36 37 38 39

Keywords: Biogeography, Southern Ocean, Cephalopods, Habitat suitability models

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42 Introduction

Habitat suitability models can contribute significantly to our understanding of species
niche requirements and can predict the potential distributions of species (Hirzel et al., 2006).
Certain regions of the Antarctic are among the most rapidly warming areas on Earth (Turner
et al., 2009). However, our understanding of how these changes affect marine diversity,
habitats, and distribution remain limited, particularly regarding pelagic taxa in the Southern
Ocean (Xavier et al., 2006; Griffiths, 2010).

49 In the Southern Ocean, defined here as the region south of the Subtropical Front, all 50 known squid are oceanic pelagic species with high levels of endemism (Collins and 51 Rodhouse, 2006). As most pelagic cephalopods have a short life span, rapid and labile 52 growth, and semelparous maturation patterns (Boyle and Rodhouse, 2005), it seems likely 53 that they will respond relatively rapidly to environmental change. Antarctic squid are also a 54 poorly studied group despite considered to be commercially exploitable in the future (Xavier 55 et al., 2007). For the Southern Ocean, it has been suggested that predicted temperature 56 increases, and/or changes in sea ice extent, are unlikely to have major effects on squid other 57 than changes in distribution near the limits of their range (Rodhouse, 2013). However, the 58 likely consequences of ecosystem change on the distribution of squid fauna in the Southern 59 Ocean are not well understood (Constable et al., 2014; Kennicutt II et al., 2014; Xavier et al., 60 2014).

The objective of this study was to estimate the spatial distribution of suitable habitats
of a number of common squid species from the Southern Ocean. We review our predicted
distributions against previously published distribution estimates (Xavier et al., 1999;
Rodhouse et al., 2014), the known distribution of the sampling effort (Griffiths, 2010), and
the presence of the studied species in the diet of key top predators in different areas of the
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68 Materials and Methods

Occurrence data were taken from the SCAR Biogeographic Atlas of the Southern
Ocean (De Broyer et al., 2014). This compilation was based upon Xavier et al. (1999), with
additional data drawn from the Ocean Biogeographic Information System (OBIS, 2013),
biodiversity.aq, the Australian Antarctic Data Centre, and the National Institute of Water and
Atmospheric Research (NIWA, 2014). Duplicate records (identified by exact matches in
species name and position) were removed. Figure 1 shows the study region and the names of
features mentioned in the text. Figure 2 shows the complete set of occurrence records used.

76 The available species occurrence records were in presence-only form, and so the 77 habitat suitability modelling was conducted using the Maxent software package (v3.3.3k) 78 (Phillips et al., 2006). Maxent does not provide a direct estimate of the probability of 79 presence of the species across its range, but rather an index of habitat suitability (effectively, 80 utilized habitat relative to the background environmental conditions). This index is 81 nonlinearly related to the probability of presence (Phillips et al., 2009). Maxent allows for 82 nonlinear model terms by formulating a series of features from the predictor variables. Due to 83 relatively limited sample sizes, we constrained the complexity of most models by considering 84 only linear, quadratic, and product features. A multiplier of 3.0 was used on automatic 85 regularization parameters to discourage overfitting (Radosavljevic and Anderson, 2014); 86 otherwise, default Maxent settings were used. A 10-fold cross-validation procedure was used 87 to assess model performance (using the area under the receiver-operating curve) and variable permutation importance, with values averaged over the 10 fitted models. The final predicted 88

89 distribution for each species was based on a single model fitted using all data. The squid 90 presence records come from a mixture of sources: some dedicated marine science surveys 91 with a designed sampling strategy, but also other sources such as fishing vessels. The 92 presence records are therefore biased, in that they were not drawn at random from across the 93 range of each species. To reduce the effects of this bias on the fitted models, the background 94 points were sampled from the locations of all squid records, rather than randomly sampled 95 from across the region of interest (Phillips et al., 2009). 1000 background points were used 96 for each model.

97 Species distribution and habitat suitability modelling in the Southern Ocean relies on 98 predictor variables drawn from remote-sensing and model sources in order to obtain synoptic 99 coverage at suitable spatial and temporal resolution. Predictor variables (Error! Reference 100 source not found.)(Smith and Sandwell, 1997; Spreen et al., 2008; Feldman and McClain, 101 2010; Garcia et al., 2010; Rio et al., 2011; Trübenbach et al., 2013) were chosen from a 102 collection of Southern Ocean layers (Raymond, 2012). These variables were selected as 103 indicators of ecosystem structure and processes including water mass properties, sea ice 104 dynamics, and productivity (see biological relevance, Error! Reference source not found.). 105 We used a combination of predictive performance and expert opinion, including 106 interpretation of the fitted responses, to select appropriate variables for each model. The 107 selection process was also used to avoid including multiple, highly-correlated predictor 108 variables within any one model.

Records of squid as prey items were extracted from the Southern Ocean dietary
database (Raymond et al., 2011). These data were not used as part of the model fitting
process, which was based entirely on the net catch data, but rather as informal evaluation of
the predicted habitat distributions from the models. This comparison between the spatial

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113 distribution of the diet records and the spatial pattern of predicted habitat was not done in a 114 formal manner, because the geographic location of a diet record indicates where that diet 115 sample was obtained (usually a breeding colony); the prey item in question may not be local 116 to that colony. Some predators (e.g. sperm whales, wandering albatrosses) retain squid beaks 117 in their stomachs for long periods of time (Clarke, 1980; Xavier et al., 2005) and/or have long 118 foraging ranges (e.g. albatrosses) (Phillips et al., 2008), so they may have consumed that prey 119 item a considerable distance from the colony. Further, the absence of a prey item from a 120 predator's diet may be due to factors such as availability (e.g. deep prey beyond the diving 121 reach of air-breathing predators) or prey preference, rather than disjunct spatial distributions 122 (Xavier et al., 2013).

123 We identified cephalopod hotspots using an index of species richness derived from the 124 individual species habitat models. We then converted the predicted habitat suitability for each 125 species to a binary presence/absence layer by applying a threshold, such that habitat 126 suitability values above the threshold were converted to presences. The threshold used for 127 each species was the average of the thresholds (for each of the 10 training models) chosen to 128 maximize the test area under the receiver-operating curve (Phillips et al., 2006). The binary 129 layers were summed to give the number of species estimated to be present in each pixel 130 (Ballard et al., 2012). The results of this study are available from the Australian Antarctic 131 Data Centre.

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133 **Results**

134 The results of the modelling, including the predictor variables used in each135 model, are summarised in Table 2. For each species we provide two maps: one showing the

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catch data used to fit the model as well as the diet data available for that squid species asprey, and the second figure for each species showing the predicted habitat suitability map.

138

139 Family Bathyteuthidae

Bathyteuthis abyssicola (Figure 3a,b). The predicted habitat suitability suggests a circumpolar
distribution (i.e. occurring in all three sectors of the Southern Ocean). The most favourable
habitat was predicted to lie between the Southern Antarctic Circumpolar Current Front
(SACCF) and the Sub-Antarctic Front (SAF), with more moderate values of habitat suitability
extending from roughly 45°S up to the Antarctic shelf.

145

146 Family Brachioteuthidae

147 Slosarczykovia circumantarctica (Figure 4a,b). The predicted habitat suitability suggests a 148 circumpolar distribution, with meridional limits between approximately the SACCF and the 149 SAF. Zonally, the most favourable habitat was predicted in the Scotia Sea in the Atlantic 150 sector, particularly around the Antarctic Peninsula and South Georgia, in the Indian sector 151 (with higher values at Kerguelen shelf and eastern waters) and south of the Tasman Sea 152 between Tasmania and New Zealand. While net catches of this species were sparse outside of 153 the southwest Atlantic sector, diet records were present in the Indian and Pacific sectors, 154 broadly matching the predicted habitat distribution.

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156 Family Cranchiidae

Galiteuthis glacialis (Figure 5a,b). The predicted habitat suitability clearly indicates a
circumpolar distribution, bounded to the south by the Antarctic continent and to the north by
the SAF.

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161	Mesonychoteuthis hamiltoni (Figure 6a,b). The predicted habitat suitability suggests a
162	circumpolar distribution extending relatively close to the Antarctic continent but not into
163	shallow areas such as the continental shelf or the Kerguelen Plateau. To the north, suitable
164	habitat appears to be delimited by the SAF. The highest values of habitat suitability extended
165	from the Weddell Sea in the Atlantic sector to 60 $^{\circ}E$ (west of the Kerguelen archipelago), and
166	between 180 °E and 120 °W in the Ross/Amundsen seas region.

167

168 Family Gonatidae

169 Gonatus antarcticus (Figure 7a,b). The predicted habitat suitability suggests a circumpolar 170 distribution, with patches of highly suitable habitat over the south part of the Patagonian shelf 171 (around the Falkland Islands and Cape Horn), in the Scotia Sea and to the east in the Atlantic 172 sector, in the Indian sector (northern Kerguelen Plateau and Prydz Bay) and in the Pacific 173 sector (the Ross Sea, and eastwards along the continental shelf to the Antarctic Peninsula). 174 Similarly to S. circumantarctica, catch records were almost exclusively restricted to the 175 southwest Atlantic sector, whereas diet records were circumpolar, as was the predicted habitat 176 distribution.

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178 Family Histioteuthidae

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179	Histioteuthis atlantica (Figure 8a,b). The predicted habitat suitability indicated a circumpolar
180	distribution north of approximately 60 $^{\circ}$ S (50 $^{\circ}$ S in the Atlantic sector), away from the coldest
181	waters of the Southern Ocean. The predicted distribution of H. atlantica was restricted to
182	more northerly regions than that of the closely-related H. eltaninae.
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184	Histioteuthis eltaninae (Figure 9a,b). The model predictions indicated that suitable habitat is
185	widespread across the Southern Ocean, excluding shallow areas such as continental shelves
186	and undersea banks and ridges.
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188	Family Loliginidae
189	Doryteuthis gahi (Figure 10a,b). Predicted habitat for this species was limited to continental
190	shelves, particularly the Patagonian shelf (agreeing well with all net capture and predator diet
191	locations), and in South Chilean waters (in the Pacific). Areas of suitable habitat, albeit more
192	restricted in extent, were also predicted around South Georgia, the Kerguelen Islands, and
193	New Zealand.
194	
195	Family Neoteuthidae
196	Alluroteuthis antarcticus (Figure 11a,b). Predicted habitat was circumpolar, bounded
197	approximately by the SACCF to the north, and by the Antarctic continental shelf to the south.
198	
199	Family Ommastrephidae

Martialia hyadesi (Figure 12a,b). The model predicted spatially-patchy areas of suitable
habitat, generally downstream of land masses. The principal areas of predicted habitat were
around the South American shelf, in the north Scotia Sea close to South Georgia, in the
Indian sector (Prince Edward, Crozet and Kerguelen shelf archipelagos and to the east of the
latter islands) and south and southwest of New Zealand.

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Todarodes filippovae (Figure 13a,b). The predicted habitat suitability was clearly
circumpolar, bounded to the south by the SAF, away from the coldest waters of the Southern
Ocean. While catches were largely confined to the eastern Indian and Pacific sectors
(Tasmania through to South America), a small number of diet and catch records from the
western and central Indian sectors (approximately 30–80 °E) provided some corroboration of
the circumpolar habitat prediction.

212

213 Family Onychoteuthidae

Kondakovia longimana (Figure 14a,b). The predicted habitat suitability was circumpolar,
consistent with the catch and diet records, but spatially patchy. Areas of most suitable habitat
were found in the Scotia Sea, particularly around South Georgia and the South Sandwich
islands, in the Indian sector (Kerguelen waters and further south) and south of the Tasman
Sea around 60 °S. Patches of suitable habitat were also predicted for parts of the Antarctic
continent shelf (e.g. the western Antarctic Peninsula, Prydz Bay, and the Dumont d´Urville
Sea).

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222	Moroteuthis ingens (Figure 15a,b). Predicted areas of suitable habitat were patchy, generally
223	restricted to regions around 50 °S or further north. Oceanic waters were generally predicted to
224	be unsuitable habitat, compared to areas above and around continental or island shelves,
225	particularly around the Falkland Islands, Crozet, the Kerguelen Plateau in the Indian sector,
226	south of Tasmania, and on the New Zealand shelf in the Pacific sector. North of about 60 $^\circ$ S,
227	the shelf distribution of <i>M. ingens</i> is complementary to that of <i>H. atlantica</i> .
228	
229	Moroteuthis robsoni (Figure 16a,b). The predicted habitat suitability was broadly circumpolar
230	with a southern boundary at approximately the SAF, away from the coldest waters of the
231	Southern Ocean, and with an affinity for mid-depth regions (e.g. shelf slopes).
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234	Family Psychroteuthidae
235	Psychroteuthis glacialis (Figure 17a,b). Suitable habitat was predicted to be circumpolar,
236	extending northwards from the Antarctic continent to approximately the APF. Areas of
237	highest habitat suitability were found in patches in the southern Scotia Sea, Weddell, and
238	Ross seas, and in coastal waters around the Antarctic continent.
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240	"Hotspot" regions in the distribution of cephalopods from the Southern Ocean
241	The individual species habitat suitability predictions were combined to
242	produce an index of species richness (Figure 18). The highest predicted values (8 or more
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species) occurred in a largely-circumpolar band, approximately from the Polar Front south to
the northernmost extent of sea ice. Areas of nine or more species were found in the southwest
Atlantic sector. The lowest values occurred over the shelf around the Antarctic continent, and
to the north of the sub-Antarctic front (but note that these latter waters are home to other
species of squid not considered in this study).

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249 **Discussion**

250 **Biases and uncertainties**

251 To our knowledge, this is the first study to develop habitat suitability predictions for 252 these common cephalopod species of the Southern Ocean. The modelling component of this 253 study presented a number of challenges. Data systems such as OBIS currently provide the 254 most comprehensive occurrence data for biogeography but are aggregated from a variety of 255 diverse sources with differences in aspects such as survey design and sampling techniques. 256 One possible approach is to use the aggregated dataset merely as an index of the available 257 data and follow each component dataset back to its original, detailed source. However, this is 258 rarely practical for large-scale studies. Although we have attempted to account for the spatial 259 distribution of survey efforts in the modelling procedure, these results should still be treated 260 with caution, particularly for species with small sample sizes or where one particular area 261 dominates the occurrence record.

The predictor variables used were drawn from satellite and similar sources. The information from such variables rarely provides direct characterization of the primary processes affecting the species distribution. For example, there are no direct estimates of squid prey distributions. Instead, these variables typically provide proxy information such as

266 water mass properties or primary productivity. The spatial and temporal scales of this 267 information often do not match the scales experienced by the animals. Furthermore, predictor 268 variables in the Southern Ocean are typically highly correlated because of the strong 269 latitudinal and seasonal gradient that affects oceanic and atmospheric conditions. Because of 270 these factors, it is rarely obvious which particular predictor variable is the most appropriate 271 proxy to use in a given model. Predictive performance offers some guidance, but should not 272 be relied upon exclusively (Raymond et al., 2014). Squid are also notorious for their net 273 avoidance ability, and scientific nets typically catch only juvenile individuals (Collins and 274 Rodhouse, 2006).

275 In order to help assess the influence of these issues on the results, we used *Doryteuthis* 276 gahi as a validation species, because it is well known to be coastally distributed (up to 350 m 277 depth) in areas of the Patagonian shelf and eastern Pacific Ocean from southern Peru to 278 Southern Chile (Arkhipkin et al., 2013). The predicted habitat suitability for this species 279 broadly matched the expected pattern. Small areas of suitable habitat were predicted in a few 280 locations where this species is unlikely to be present (e.g. around New Zealand). This 281 highlights the fact that the outputs from these models are predictions of suitable habitat and 282 do not take into account other processes that govern species distributions such as dispersion, 283 competition, and trophic dependencies. Indeed, combining food web models with species 284 distribution models to predict spatial variation in community composition remains an active 285 area of research in biodiversity modelling (Pellissier et al., 2013; Constable et al., 2014).

Generally, each predicted habitat distribution matched the picture provided by the combination of occurrence and predator diet records. For *Kondakovia longimana*, the predicted habitat was much more circumpolar in nature than the observed catch records, but that circumpolar pattern was consistent with predator diet observations. Similarly, suitable

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290 habitat for Gonatus antarcticus was predicted to include areas close to the Antarctic 291 continent, well away from observed net catches. However, emperor penguins have been 292 recorded to feed on this species there (Cherel and Kooyman, 1998). Some minor 293 discrepancies were also noted. The sea ice zone was not predicted to be suitable habitat for 294 *Moroteuthis ingens*, apparently contradicting an emperor penguin diet record from Auster 295 colony, near Mawson station (Robertson et al., 1994). However, this species has never been 296 recorded in any other emperor diet studies (Xavier and Cherel, 2009) and so this record may 297 have been a misidentified *M. knipovitchi*, an Antarctic species of the same family with 298 broadly similar beak characteristics (Xavier and Cherel, 2009). Finally, S. circumantarctica 299 has occasionally been caught by nets in warm waters near New Zealand (around 45 °S) but 300 this was not predicted to be a suitable habitat (Figure 4b).

The models showed that ocean areas with generally higher levels of habitat suitability exist around 50 °S in the Atlantic and Indian sectors and 60 °S in the Pacific sector, where the majority of the fronts are distributed (i.e. Polar Front, sub-Antarctic Front and subtropical Fronts; see Xavier et al. 1999), reinforcing that these areas regions are broadly ecologically relevant, including for cephalopods.

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307 Physical and biogeochemical ocean mechanisms influencing the distribution of squid in 308 the Southern Ocean

The Southern Ocean is characterized by high surface macro-nutrient concentrations and relatively low iron concentrations, and so iron input typically leads to increased productivity. Several low-latitude species (e.g. *Doryteuthis gahi, Martialia hyadesi*) were associated with regions where atmospheric iron deposition is strongly correlated with

313 increased productivity (as measured by satellite-based chlorophyll, e.g. east of Patagonia, on 314 the Falkland plateau) (Erickson et al., 2003). Away from land in the open Southern Ocean, 315 areas of elevated productivity tend to be driven by upwelling of nutrients, often caused by the 316 interaction of the Antarctic circumpolar current flow with large-scale bathymetric features, 317 such as mid-ocean ridges (Sokolov and Rintoul, 2007). Some such areas are known to be 318 foraging grounds for predators such as seabirds (Raymond et al., 2010). Thus water depth can 319 potentially influence cephalopod distribution, even in deep, mid-ocean areas well away from 320 shelves.

321 Broadly speaking, cold, nutrient-rich waters upwell south of the Polar Front and 322 subduction (i.e. downwelling) occurs north of the Polar Front (Sarmiento et al., 2004). 323 Several species in this study (e.g. Todarodes filippovae, Galiteuthis glacialis) featured a 324 strong contrast across the Subantarctic Front. Upwelling in the Weddell and Ross gyres may 325 also play a role in forming suitable habitat for some species, such as *Psychroteuthis glacialis* 326 (Figure 17a,b). Three species (Mesonychoteuthis hamiltoni, Bathyteuthis abyssicola and 327 *Slosarczykovia circumantarctica*) were found to have a potential affinity for areas with low 328 oxygen minima, suggesting that these species may use this ecological niche close to or within 329 the oxygen minimum zone. Although low oxygen levels are known to greatly limit the 330 abundance, vertical distribution, and ecology (e.g. predation, food competition) of numerous 331 marine animals, some species of squid (e.g. jumbo squid *Dosidicus gigas*) are known to thrive 332 in such harsh environments (Trübenbach et al., 2013).

This study indicates that large-scale physical and biogeochemical properties can influence the suitability of a given region, often in remarkably different ways for different cephalopod species. The 15 species modelled here can be discussed in terms of three broad spatial groupings: those distributed in cold waters close to the Antarctic continent, those in

relatively warm waters to the north, and those with less constrained distribution (i.e.

extending into both warm and cold waters).

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340 Habitat suitability of "cold" water cephalopod species

341 The species that clearly have suitable habitat close to the Antarctic continent were 342 Alluroteuthis antarcticus, Galiteuthis glacialis, Mesonychoteuthis hamiltoni, Psychroteuthis 343 glacialis. These species have been recognized as typical Antarctic water species with a 344 suggested circumpolar distribution (Xavier et al., 1999; Rodhouse et al., 2014), consistent 345 with our results. A. antarcticus is occasionally caught in nets in the Atlantic and Indian 346 sectors of the Southern Ocean (Rodhouse, 1989; Lu and Williams, 1994) but also in the diet 347 of albatrosses in the Pacific sector (Xavier et al., 2014). G. glacialis is one of the most 348 abundant (i.e. most commonly caught in midwater research nets) and widely distributed squid 349 species in the colder waters of the Southern Ocean. M. hamiltoni is arguably the largest squid 350 species in the world, growing to ten metres or more in length (Collins and Rodhouse, 2006). 351 Its habitat is typically in circumpolar colder waters (see results; Xavier et al. 1999). It is 352 occasionally caught by longline fisheries (as a by-catch), and is found in top predator diets 353 (Xavier and Cherel, 2009). Finally, P. glacialis is considered to be abundant with a 354 circumpolar distribution in high Antarctic areas (Filippova and Pakhomov, 1994; Xavier et 355 al., 1999). This is supported by our habitat suitability predictions, suggesting that this species 356 may be abundant close to the continent as previously thought, but also in oceanic waters (see 357 results). Evidence of *P. glacialis* living near the bottom at the shelf break area (300–1000 m) 358 (Lu and Williams, 1994; Collins et al., 2004), applies particularly for the Scotia Sea region in 359 our habitat suitability predictions. P. glacialis, like A. antarcticus, G. glacialis and M.

hamiltoni, is also found in the diets of a wide range of top predators, including albatrosses,
penguins, seals, whales and toothfish species (Xavier and Cherel, 2009).

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363 Habitat suitability of "mixed" (i.e. cold and warm) water cephalopod species

A group of species were predicted to be broadly distributed, from close to the
Antarctic continent to warmer waters north of 60 °S: *Bathyteuthis abyssicola, Slosarczykovia circumantarctica, Histioteuthis eltaninae, Kondakovia longimana* and *Gonatus antarcticus*.

367 B. abyssicola occurs in all three sectors of the Southern Ocean (Roper, 1969), but 368 occurs very rarely in the diet of top predators (Xavier and Cherel, 2009), probably because it 369 lives at great depths (Roper, 1969). S. circumantarctica is considered to be the most abundant 370 squid in the upper layers of pelagic waters in the Southern Ocean, generally deeper than 400 371 m by day and migrating towards the surface by night (Collins and Rodhouse, 2006). The 372 suitable habitat of S. circumantarctica in this study predicted to be circumpolar but not close 373 to the Antarctic continent (only at the Antarctic Peninsula islands; see results) occuring 374 regularly in research nets in the Scotia Sea (Rodhouse and Piatkowski, 1995; Rodhouse et al., 375 1996; Collins et al., 2004). S. circumantactica is the most important squid species (by 376 frequency of occurrence and by number) in the diet of Antarctic fur seals breeding at South 377 Georgia in most years (British Antarctic Survey, unpubl. data). H. eltaninae is distributed the 378 furthest south of the species of the family Histioteuthidae, with a circumpolar distribution 379 (Rodhouse and Piatkowski, 1995; Rodhouse et al., 1996; Xavier et al., 1999; Collins and 380 Rodhouse, 2006), occurring in small numbers in research nets (Rodhouse and Piatkowski, 381 1995; Xavier and Cherel, 2009), but never close to the Antarctic continent (matching model 382 predictions here; see results). Although it has been suggested that H. eltaninae is more

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383 abundant in proximity to land and oceanic ridges (Roper et al., 1984), this is not expressed in 384 our predictions (but note that the habitat suitability model for this species used only a single 385 predictor variable (depth), and so should be treated with caution). H. eltaninae occurs in a 386 wide range of predator diets (Cherel and Klages, 1998; Xavier and Cherel, 2009). K. 387 longimana has a circumpolar distribution (Xavier, 1997; Xavier et al., 1999), matched by our 388 study results, ranging from close to the Antarctic continent coasts to north of 60 $^{\circ}$ S (Cherel 389 and Weimerskirch, 1999). This species also reaches large sizes (Rodhouse et al., 2014), but 390 not as large as *M. hamiltoni*. Although rare in research nets (Collins et al., 2004), *K*. 391 longimana is one of the most important species (by number and by mass) in numerous 392 predators in the Southern Ocean, including wandering and grey-headed albatrosses (Clarke, 393 1980; Croxall and Prince, 1996; Xavier et al., 2003b; Cherel et al., 2004; Xavier and Cherel, 394 2009). G. antarcticus has a circumpolar distribution reaching as far south as the Antarctic 395 continent (Xavier et al., 1999), a finding mirrored by our results. This species occurs 396 occasionally in nets (Rodhouse et al., 1996; Collins and Rodhouse, 2006) but is more 397 commonly found in the diet of seabirds and seals (Croxall and Prince, 1996; Cherel and 398 Klages, 1998; Xavier et al., 2002; Cherel et al., 2004; Xavier and Cherel, 2009).

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400 Habitat suitability of "warm" water cephalopod species

401 Five species were predicted to be distributed in the warmer waters of the Southern

402 Ocean: Histioteuthis atlantica, Martialia hyadesi, Todarodes filippovae, Moroteuthis ingens

403 and *Moroteuthis robsoni*. *H. atlantica* has a circumpolar distribution (Xavier et al., 1999;

404 Rodhouse et al., 2014), and is more northerly distributed than *H. eltaninae*, as reflected by

405 our predicted habitat suitability for both histioteuthid species. *H. atlantica* is known to occur

406 in oceanic waters (Roper et al., 1984), as suggested by our predictions (see results) but it has
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407 also been caught in shallow waters (Voss et al., 1998). H. atlantica is important in the diet of 408 albatrosses, sharks and many other predators that forage in the warmer waters of the Southern Ocean (Xavier and Cherel, 2009). M. hyadesi is found further south than H. atlantica, but 409 410 never close to the Antarctic continent (Rodhouse, 1998a; Xavier et al., 1999). Our results are 411 consistent with this, indicating that the sea ice zone comprises unsuitable habitat for this 412 species. M. hyadesi is the squid species that has attracted most attention with regard to future 413 commercial exploitation (Rodhouse, 1997), and is present in the diet of a wide range of top 414 predators (Xavier and Cherel, 2009), being particularly important in the diet of grey-headed 415 albatrosses in some years (Xavier et al., 2003a). T. filippovae has a similar circumpolar 416 distribution to *H. atlantica*, and extending further north than the region modelled here (to 35 417 $^{\circ}$ S) (Pethybridge et al., 2013). It is common around seamounts and slope waters, up to a 1000 m depth (Roeleveld, 1998; Xavier et al., 1999). While generally found in relatively warm 418 419 waters, T. filippovae is periodically caught further south (Rodhouse, 1998b). Todarodes spp. 420 are present in the diet of toothed whales, wandering albatrosses, seals, sharks and fish (Smale, 421 1996; Xavier and Cherel, 2009). M. ingens is mostly associated with shelves (Cherel and 422 Duhamel, 2003) but is also found in bathyal waters (Rodhouse et al., 2014). Given these 423 depth differences, more sampling and genetics work must be carried out to verify if it is truly 424 a single species and not a group of similar species. *M. ingens* is common in the diet of 425 penguins, albatrosses, petrels, whales, seals and the southern opah (Clarke, 1980; Green and 426 Burton, 1993; Cherel et al., 1996; Croxall and Prince, 1996; Cherel and Klages, 1998; Xavier 427 and Cherel, 2009). M. robsoni may exhibit a circumpolar distribution (Rodhouse, 1990; 428 Rodhouse et al., 2014), extending as far south as the Scotia Sea but nevertheless still a warm 429 water cephalopod species. Like *M. ingens*, most specimens of *M. robsoni* have been caught in 430 shelf/near shelf waters with a small number specimens being caught in oceanic waters, and so 431 more sampling and genetics work must be carried out to verify the nature of this species. M. 19 19

robsoni is an oceanic species (Roper et al., 1984) that occurs occasionally in the diets of
Southern Ocean predators that forage sufficiently far north (Imber, 1992; Cherel et al., 2004;
Xavier and Cherel, 2009).

435 The "hotspots" in the distribution of cephalopods in the Southern Ocean are related to 436 oceanic waters, across various fronts. This is consistent with the tendency of top predators to 437 target oceanic fronts, potentially to catch squid (Rodhouse et al., 1996; Xavier et al., 2004). 438 Further research should concentrate on these areas to improve our understanding of the 439 abundance and population dynamics of Southern Ocean cephalopods (Xavier et al., 2015). 440 Several species (e.g. K. longimana, G. antarcticus, M. hyadesi, M. knipovitchi) have 441 commercial potential in the future (Xavier et al., 2007), although the biology and ecology of 442 some species (particularly *M. knipovitchi*) remain poorly known (Collins et al., 2004; Collins 443 and Rodhouse, 2006). There is also a need for studies to explore the potential impacts of 444 future climate change on Southern Ocean squid.

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Variable	Description	Source and references	Biological relevance
Sea surface temperature (SST)	Sea surface temperature summer climatology, calculated over the 2002/03 to 2012/13 austral summer seasons	MODIS Aqua (Feldman and McClain 2010)	General water mass properties including positions of fronts, which can represent areas of different prey and of prey- aggregation
Sea ice cover	The average proportion of the year for which sea ice is present. Concentration data from 1-Jan-2003 to 31- Dec-2010 was used. The fraction of time each pixel was covered by sea ice of at least 85% concentration was calculated	AMSR-E satellite estimates of daily sea ice concentration (Spreen et al. 2008)	Indicator of sea ice cover, including polynyas, which affects ecosystem structure and prey availability
Depth	Measured and estimated seafloor topography from satellite altimetry and ship depth soundings	Smith and Sandwell (1997) V15.1	Water mass properties
Sea surface height (SSH)	Mean dynamic topography (sea surface height relative to geoid)	CNES-CLS09 Mean Dynamic Topography v1.1 (Rio et al. 2011)	Water mass properties
Chlorophyll-a (Chl-a)	Near-surface chlorophyll- <i>a</i> summer climatology, calculated over the 2002/03 to 2012/13 austral summer seasons	MODIS Aqua (Feldman and McClain 2010)	Productivity, ecosystem structure
Oxygen minimum	Minimum dissolved oxygen value in the top 1000m of the water column	World Ocean Atlas 2009 annual climatology (Garcia et al. 2010)	Water mass properties, potential habitat niche for cephalopods (Trübenbach et al. 2013)

Table 1. Predictor variables used in the species distribution habitat suitability modeling.

Table 2. Habitat suitability modeling results summary (N occ.: Number of occurrences, AUC: area under the receiver-operating characteristic, OW: open water, PF: polar front, SAF: Sub-Antarctic Front, SIZ: sea ice zone. For variable names see Table 1). The thumbnail maps are reproductions of figures 3b-17b, and are included here to allow a convenient comparison of the broad spatial patterns in the modelling results.

Species	N occ.	Train /test AUC	Variables used in model (permutation importance, %)		Typical habitat from model predictions					
					SST (°C)	Depth (m)	lce	O₂ min. (ml/l)	Chl- <i>a</i> (mg m ⁻³)	Water mass
Doryteuthis gahi	149	0.99/ 0.99	Chl (60.5) Depth (34.3) Ice (5.1)		≥9	<400	ow		>0.75	
Martialia hyadesi	260	0.94/ 0.94	Chl (47.2) SST (43.8) Ice (5.8) Depth (3.2)		3– 15		ow		>0.3	PF to SAF
<i>Moroteuthis</i> <i>ingens</i>	3808	0.61/ 0.61	Depth (65.5) SST (27.4) SSH (4.8) Ice (2.3)		3– 16	300– 1500	ow		>0.2	
Moroteuthis robsoni	342	0.75/ 0.75	SSH (41.5) Chl (32.5) O₂min (16.4) Depth (9.7)	0	7– 18	>1000	ow		0.15– 0.55	SAF and north
Todarodes filippovae	1173	0.62/ 0.61	SSH (84.9) Depth (15.1)		≥10		ow			SAF and north
Histioteuthis atlantica	106	0.89/ 0.89	Depth (85.4) SST (14.6)		≥5	>3000	ow		<0.6	
Histioteuthis eltaninae	110	0.90/ 0.90	Depth (100)			>3000	OW– 70% cover		<0.65	
Bathyteuthis abyssicola	548	0.91/ 0.91	Depth (53.8) SST (37.2) O₂min (9.0)		≤12	>2500	OW– 70% cover	<4.8	<0.7	
Slosarczykovia circumantarctica	1304	0.96/ 0.96	SSH (74.4) Ice (19.6) Chl (4.2) SST (1.8)		0–7	>1500	OW– 20% cover	4–4.5	0.15– 0.65	SAF to parts of SIZ
Gonatus antarcticus	120	0.83/ 0.82	SST (66.2) Chl (33.8)		< 12				>0.4	
Kondakovia longimana	100	0.95/ 0.94	SSH (82.8) Chl (12.1) Ice (5.2)		<6	>500	OW– 70% cover		>0.15	PF and south

Mesonychoteuthis hamiltoni	234	0.93/ 0.92	SSH (57.5) Depth (37) O ₂ min (5.4)	≤11	>2200		<4.75	SAF and south
Galiteuthis glacialis	1449	0.88/ 0.88	SST (79.5) SSH (20.5)	≤6	>500	SIZ– OW		PF and south
Alluroteuthis antarcticus	124	0.93/ 0.93	SST (98.6) Depth (1.4)	≤3	>500	SIZ and OW		South of PF
Psychroteuthis glacialis	316	0.94/ 0.93	SST (66.6) SSH (24.0) Chl (7.4) Ice (2.0)	≤3	>500	SIZ and OW		South of SAF