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8	Familial social structure and socially-driven genetic differentiation in
9	Hawaiian short-finned pilot whales
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Running title: Socio-genetic structure in a social cetacean

28 29

#### Abstract

30 Social structure can have a significant impact on divergence and evolution within species, especially in the marine environment, which has few environmental boundaries to dispersal. On 31 the other hand, genetic structure can affect social structure in many species, through an 32 33 individual preference toward associating with relatives. One social species, the short-finned pilot whale (Globicephala macrorhynchus), has been shown to live in stable social groups for periods 34 of at least a decade. Using mitochondrial control sequences from 242 individuals and SNPs from 35 106 individuals, we examine population structure among geographic and social groups of short-36 finned pilot whales in the Hawaiian Islands, and test for links between social and genetic 37 structure. Our results show that there are at least two geographic populations in the Hawaiian 38 Islands: a Main Hawaiian Islands (MHI) population and a Northwestern Hawaiian 39 Islands/Pelagic population ( $F_{ST}$  and  $\Phi_{ST} P < 0.001$ ), as well as an eastern MHI community and a 40 western MHI community ( $F_{ST} P = 0.009$ ). We find genetically-driven social structure, or high 41 relatedness among social units and clusters (P < 0.001), and a positive relationship between 42 relatedness and association between individuals (P < 0.0001). Further, socially-organized 43 clusters are genetically distinct, indicating that social structure drives genetic divergence within 44 the population, likely through restricted mate selection ( $F_{ST} P = 0.05$ ). This genetic divergence 45 among social groups can make the species less resilient to anthropogenic or ecological 46 disturbance. Conservation of this species therefore depends on understanding links among social 47 48 structure, genetic structure, and ecological variability within the species.

49

## 50 Introduction

While the concept of culture has traditionally been reserved for human societies, more
recently biologists have identified and described aspects of culture in non-human species, such as
elephants, birds, primates, pinnipeds, and cetaceans (e.g., Mundinger, 1980; Lachlan & Slater,
1999; Rendell & Whitehead, 2001, 2003; McComb & Semple, 2005; Laland & Janik, 2006;
Wittemyer et al., 2009; de la Torre & Snowdon, 2009; Kershenbaum et al., 2012; Riesch et al.,
2012; Kessler et al., 2014). Theoretical studies have long suggested the existence of gene-culture
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coevolution outside humans, and integrative studies of genomic and cultural traits are beginning 57 to provide evidence of gene-culture coevolution in social mammals, both in a narrow sense (i.e., 58 direct links between genes and cultural phenotypic traits), and a broad sense (i.e., population-59 60 level genetic differences among groups with different cultures or societies). Sociality has been shown to increase inclusive fitness in cooperative species (e.g., Connor et al., 1992; Rendell and 61 Whitehead, 2001), and therefore be an evolutionarily advantageous trait. Socially-driven, fine-62 scale genetic structure has been documented in primates and some other social mammals, such as 63 elephants, rock wallabies (Petrogale penicillata), prairie dogs (Cynomys ludovicianus), killer 64 whales (Orcinus orca) and sperm whales (Physeter macrocephalus) (e.g., Pope, 1992; Dobson et 65 al., 1998; Hazlitt et al., 2006; Wittemyer et al., 2009; Cantor et al., 2015; Foote et al., 2016). 66 These species all form socially-defined groups that are genetically distinct due to nonrandom 67 mating and dispersal patterns, and are often characterized by matrilineal societies with male-68 biased dispersal. These types of societies, if stable over many generations, could lead to the co-69 70 evolution of genes and culture.

Because cetaceans live in an environment with few boundaries to dispersal, social 71 structure may play an important role in driving population structure and evolution. Stable social 72 structures (i.e., hierarchical group associations that remain stable for decades to generations) 73 74 have been identified in four species of cetacean - sperm whales, killer whales, long-finned pilot whales (Globicephala melas) and short-finned pilot whales (G. macrorhynchus) (e.g., Amos et 75 al., 1993; Baird & Whitehead 2000; Cantor et al., 2015; Mahaffy et al., 2015). Whitehead (1998) 76 suggests that the dearth of mitochondrial diversity in these four highly social cetaceans may be 77 78 driven by selection for maternally-inherited cultural traits. In killer whales and sperm whales, the 79 effects of social structure and cultural learning (e.g., foraging techniques, migration patterns, predator avoidance, and vocal traditions) as drivers of genetic structure have been well 80 documented (e.g., Ford & Fisher 1982; Janik & Slater 1997; Weilgart & Whitehead 1997; Foote 81 et al., 2009, 2016; Filatova et al., 2012; Rendell et al., 2012; Riesch et al., 2012; Cantor et al., 82 83 2015). However, little is understood of the social and genetic structure of pilot whales, or the links between the two. 84

Just as social structure can affect genetic structure, genetic structure can have a driving effect on social structure, if individuals choose to associate with close relatives rather than disperse throughout their range, even though it may or may not provide an evolutionary This article is protected by copyright. All rights reserved advantage (Beck et al., 2011). The positive feedback loop created by these two complementary
processes may stabilize social units or clusters, allowing co-evolutionary genetic and social
divergence to occur. While many aspects of this theory have been discussed (e.g., Findlay, 1991;
Laland, 1992; Lachlan and Slater, 1999), empirical evidence of stable gene-culture coevolution
outside of humans is limited (Rendell & Whitehead, 2001). Although research in this area is
increasing (e.g., Foote et al., 2016), the relationship between ecology, culture, and genetics is
poorly understood in all species (Laland et al., 2010).

Short-finned pilot whales, due to their social nature, may be affected by this reciprocal 95 link between social structure and genetic structure. Stable social units (Mahaffy et al., 2015) and 96 a long period of post-reproductive senescence in females (Marsh and Kasuya, 1986) may 97 contribute to gene-culture divergence in this species, both at the population and sub-population 98 level, as is true of killer whales (Brent et al., 2015). In the Pacific Ocean, two types of short-99 100 finned pilot whale have been identified, distinct in their morphology, genetics, distribution and vocal repertoire (Kasuya et al., 1988; Oremus et al., 2009; Van Cise et al., 2016, 2017). Little is 101 known of the mechanism of divergence between these two types, but due to their similarity to 102 killer whales in several life history characteristics (e.g., stable social units, reproductive 103 senescence in females, and distinct vocal repertoires), we hypothesize that cultural adaption to 104 105 distinct ecological environments (e.g., diet preference or foraging techniques) promoted the divergence of the two types (Riesch et al., 2006), which may be distinct sub-species or species. 106

107 The Hawaiian archipelago is home to one of these types, the Naisa-type short-finned pilot 108 whale (Van Cise *et al.*, 2016). Their density is highest around the Main Hawaiian Islands (MHI), 109 but they are also found in the Northwestern Hawaiian Islands (NWHI) and pelagic waters 110 surrounding the archipelago. Photo ID and observations suggest little overlap between these 111 three regions (Baird, 2016).

Longitudinal observations and photo identification (photo ID) data collected since 2000 have been used to calculate the rate of association between pairs of individuals (called the association index, and ranging from 0-1), using a half-weight index to control for effort (Whitehead, 2008; Mahaffy et al., 2015). This revealed that short-finned pilot whales in Hawai'i form stable social units of approximately 12 individuals for periods of at least a decade, and that these social units will often associate with a number of other social units in affiliations called clusters, with an average of 23 individuals (Mahaffy et al., 2015). Social units, the smallest group

in the social hierarchy, have a mean association index of 0.76. Clusters, the next hierarchicallevel, comprise one or more social units with mean association index of 0.48.

Additionally, satellite tag and photo ID data indicate that, within the MHI, three island-121 122 associated communities may exist: an eastern MHI community, around Hawai'i Island, a western MHI community around O'ahu and Kaua'i Islands, and central MHI community around O'ahu 123 and Lāna'i Islands (Baird, 2016). The presence of these communities suggests that, in regions 124 with highly heterogeneous habitat such as island archipelagos, habitat preference may be an 125 important driver of local structure. Individuals are philopatric to their island communities, 126 127 although some social units have been observed on rare occasions visiting other communities, and there is some overlap in geographic range among communities (Baird, 2016). Communities 128 represent the highest level of social organization, comprised of multiple clusters (Mahaffy et al., 129 2015, Baird, 2016), therefore habitat preference may be a socially-learned behavior. 130

Based on studies from short-finned pilot whale populations in the Atlantic Ocean, social units are thought to be matrilineal (Heimlich-Boran, 1993; Alves et al., 2013). These two studies suggest that males remain in their natal social unit but mate outside of that group. However, in at least some cases, all-male groups have been observed (Baird, 2016), suggesting that males do not always exhibit natal philopatry. It is unknown whether males' extra-unit mate choices are random or socially-driven, or whether genetic relatedness affects association or social structure at any level higher than that of social units.

In this study, we aim to improve our understanding of local population structure and divergence in Hawaiian short-finned pilot whales. We analyze genetic differentiation between three geographic strata: the MHI, Northwestern Hawaiian Islands and pelagic waters surrounding the Hawaiian Islands; we then examine genetic differentiation between observed island communities within the MHI, test for sex-biased dispersal between those communities, and look for evidence that individual island preference is a driver of the amount of time that individuals spend together.

We further hypothesize that relatedness drives social structure, and that, in turn, social structure affects genetic divergence among groups, for example by affecting mate selection. If genetic structure affects social structure, insomuch as close relatives form lifelong associations and travel in close-knit groups, we would expect to see higher relatedness within social units than expected at random. Similarly, if social structure affects genetic structure we might expect

to see genetic divergence in the allele frequency among clusters. These patterns, along with a
statistical relationship between genetic and social structure, could indicate a reciprocal
relationship between genetic and social structure in Hawaiian pilot whales.

153

#### 154 Methods

### 155 *Genetic data collection*

Skin samples (n=254) were collected from wild short-finned pilot whales throughout the 156 MHI and NWHI using biopsy darts, in collaboration with Cascadia Research Collective (CRC) 157 and NOAA's Southwest Fisheries Science Center (SWFSC). Biopsy darts are deployed using a 158 159 crossbow, and collect a tissue sample approximately 8 mm in diameter and up to 20 mm in length, from the area below the dorsal fin. Samples were collected opportunistically, as social 160 161 groups were encountered in the field, with priority given to sampling as many adults in each social group as possible. Samples were archived in the SWFSC Marine Mammal and Sea Turtle 162 Research Collection, and were either stored at -80°C, or preserved in either a salt-saturated 20% 163 DMSO solution or 100% ethanol and stored in a -20°C freezer. In the MHI, known social units 164 were heavily sampled in order to test for relatedness; additional samples were chosen randomly, 165 with consideration given to ensuring that samples represented unrelated individuals from 166 multiple social groups per stratum. 167

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## 169 Photo ID/social network data collection

Photographs, used to generate social stratification data as well as pairwise association 170 indices between individuals, were collected according to Mahaffy et al. (2015). Photo 171 identification data from that publication and from subsequent field observations, between 2003 172 and 2015 (Baird et al., 2013), are included in this study. Association indices were calculated 173 using SOCPROG 2.4, with a sampling period of one day and a half-weight index (HWI) of 174 association to control for effort (Whitehead, 2008, 2009). We used the photo identification, 175 association indices, and terms (social units, clusters, and communities) used by Mahaffy et al. 176 (2015) to characterize the hierarchical nature of short-finned pilot whale social organization in 177 the MHI. 178

179

#### 180 *Genetic sequencing and assembly*

DNA was extracted from skin and muscle samples as previously described (Martien et al., 2014). The hypervariable mtDNA control region was amplified and sequenced in two parts of approximately 420 bp and 560 bp, with approximately 20 bp of overlap between the two sequences. Primers, PCR, and sequencing methods have been previously described by Martien et al., (2014). The resulting combined sequence was 962 bp, and was assembled using SEQED, version 1.0.3 (ABI), Sequencher software (versions 4.1 and 4.8; Gene Codes, Ann Arbor, MI, USA) or Geneious (Kearse et al., 2012).

Mitochondrial sequences were aligned using a MAFFT alignment with default 188 parameters (Scoring Matrix: 200PAM/k=2, Gap open penalty: 1.53, Offset value: 0.123) in the 189 Geneious software package (Katoh & Kuma, 2002). Once the alignment was completed, 190 sequences were re-examined. Any haplotypes represented by only a single sequence or 191 haplotypes with a single base-pair difference from the most similar haplotype were reviewed for 192 193 accuracy. Unique haplotypes were repeat sequenced in order to ensure the accuracy of the 194 sequence. Sequences were combined with previously published sequences from Van Cise et al. (2016) to generate the final mtDNA data set. 195

Sequencing of 78 targeted nuclear loci for SNP analysis was completed using a custom 196 capture enrichment array designed at SWFSC based on common bottlenose dolphin (Tursiops 197 truncatus) genome sequences (Supplemental File S1), followed by highly-parallel sequencing 198 (Hancock-Hanser et al., 2013; Morin et al., 2015). Four libraries of genomic DNA were prepared 199 using protocols described in Meyer and Kircher (2010) and Hodges et al. (2009), with 200 modifications described in Hancock-Hanser et al. (2013). Up to 400 ng of extracted DNA in 80 201 202 µL total volume was sonicated using a Bioruptor UCD-200 (Diagenode). Blunt-ends of the DNA 203 were repaired using 20 µL of the sonicated product, adaptors were ligated to the DNA, and indexes were added to each sample library via PCR with indexed primers (Meyer & Kircher, 204 205 2010). Once indexed, each sample was quantified using qPCR to estimate the number of nuclear DNA copies in each sample, and approximately 100,000 copies per sample were pooled and 206 207 hybridized to a capture array. The capture-enriched product was amplified, then sequenced on Illumina HiSeq (1 x 100 bp) or NextSeq (1 x 75 bp) instruments by The DNA Array Core 208 209 Facility (The Scripps Research Institute, La Jolla, CA).

Nuclear sequences were assembled as in Morin et al. (2015), using common bottlenose
 dolphin reference sequences (used for capture enrichment) for sequence assembly and SNP
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genotyping. The cutoff for calling a genotype at any position was set to 10 reads for both 212 homozygous and heterozygous positions, to minimize genotype error (Fountain et al., 2016). 213 Potential SNPs were identified using scripts developed at SWFSC (Dryad data repository 214 215 doi:10.5061/dryad.cv35b) in the R computing environment (R Core Team 2016). From the pool of sequenced loci, candidate SNPs were selected if at least five individuals were heterozygous at 216 that locus. Those SNPs with coverage at fewer than 55% of samples were removed, and samples 217 with coverage at fewer than 70% of the SNP loci were also removed. Next, sequenced regions 218 219 with multiple SNP loci were examined for signs of paralogous reads within the assembly (e.g., excess heterozygosity across multiple SNPs in a region, discrete regions of high coverage), and 220 SNPs were removed if assembly of paralogous loci was determined to have occurred. Finally, 221 quality control analyses were performed on this set of SNPs and samples using the strataG 222 package for R (Archer et al., 2017). SNPs were removed if the quality control analysis indicated 223 that the locus was an outlier for homozygosity (>80% homozygous, based on the distribution of 224 homozygous genotypes across all loci), and we additionally tested for outliers from HWE, using 225 a Bonferonni adjustment for multiple tests. Loci that deviated significantly from HWE 226 equilibrium were closely re-examined for evidence of assembly of paralogous loci. Additionally, 227 samples that had highly similar SNP genotypes and could be duplicates were checked against 228 229 photo ID records to confirm that they were distinct individuals; if this could not be determined, one from each pair of duplicate samples was removed. Loci with multiple SNPs (see 230 Supplemental Table S1) were phased based on allele frequencies in the three regional strata, with 231 a phase cutoff probability of 0.5, to generate a single multi-SNP genotype per sample at each 232 233 locus for analyses of genetic differentiation (Morin et al., 2012). For analysis of relatedness 234 within Hawaiian social units, the highest heterozygosity SNP at each locus (N = 51 after removal of one locus that was invariant in these populations) was chosen for the analysis. 235

236

### 237 Data analysis: Population structure and diversity

We tested for both geographic and socially-driven genetic structure using both mitochondrial control regions and nuclear SNPs. Supplemental Table S2 lists sample stratifications used for data analysis in this study. For mitochondrial DNA analysis, samples were divided into three strata: Main Hawaiian Islands (MHI), Northwestern Hawaiian Islands (NWHI), and pelagic samples (Fig 1). Samples were placed in one of these three strata primarily

based on their sampling location, with the exception that samples collected near the MHI were placed in the pelagic stratum if photo ID data verified that the individuals did not associate with MHI communities. MHI mtDNA samples were not further stratified because all samples except one have the same haplotype. We placed samples from the NWHI in a separate stratum because several studies have shown strong differentiation between the MHI and NWHI for other marine mammals (Andrews et al., 2010; Courbis et al., 2014; Martien et al., 2014).

SNP data were only available for the MHI and pelagic strata. Using previous knowledge 249 of the social structure, habitat use, and movements (Baird 2016; Mahaffy et al., 2015), SNP 250 samples were divided into two strata within the MHI (eastern and western MHI communities) 251 based on photo ID data, visual observations of social units, and satellite tag data (Figure 1). 252 Several social units were heavily sampled in order to test for relatedness within social units. 253 Therefore, in order to remove any potential bias due to sampling regime, we randomly 254 subsampled the dataset using a random number generator to include no more than two 255 individuals from each social unit before conducting tests of genetic differentiation among 256 geographic strata. 257

Molecular diversity indices for all samples and for each region were calculated for both 258 mtDNA (Theta ( $\theta_{\rm H}$ ), haplotypic diversity (h), and mean nucleotide diversity ( $\pi$ )) and SNP 259 genotypes (average number of alleles per locus, expected and observed heterozygosity (H<sub>e</sub>, H<sub>o</sub>)). 260 Pairwise genetic differentiation was calculated among geographic strata using  $F_{ST}$  and  $\Phi_{ST}$  for 261 mtDNA. For SNP genotypes, geographic differentiation ( $F_{ST}$  only) was calculated only between 262 island communities within the MHI. All estimates of divergence and genetic diversity were 263 conducted using the strataG package for R except haplotypic diversity, which was calculated in 264 Arlequin (Excoffier & Lischer 2010). 265

We tested for sex-biased dispersal among island communities using the Hierfstat package in R (Goudet 2005), which looks for first-generation immigrants within the sample set. To do this, we tested for differences among males and females in  $F_{ST}$ ,  $F_{IS}$ , or the mean or variance of assignment probability (Goudet et al., 2002).

270 Data analysis: genetic structure, social structure, and island preference

In order to test the hypothesis that there are links between genetic structure, social structure, and island preference in Hawaiian short-finned pilot whales, we first calculated

pairwise genetic relatedness among individuals, as well as pairwise genetic differentiation amongclusters, which represent one or more social units.

To calculate genetic relatedness within and among social units in the MHI, samples were 275 276 stratified according to previously inferred social structure (Mahaffy et al., 2015), and social unit relatedness was calculated if at least five individuals from a social unit had been sampled. 277 Pairwise relatedness was estimated using a dyadic maximum likelihood estimator (Milligan, 278 2003) in the R package Related (Pew et al., 2014), which implements the software program 279 COANCESTRY (Wang & Summers, 2010). Within-unit relatedness was compared to the 280 expected relatedness by permuting a random sample 1,000 times and calculating relatedness. 281 From one cluster, we were able to sample two social units, and we used this cluster to test the 282 hypothesis that genetic relatedness is a driver of association among social units by comparing 283 within-cluster relatedness with the distribution of relatedness between 1,000 randomly selected 284 pairs of social units. 285

286 Pairwise genetic differentiation  $(F_{ST})$  was estimated among clusters using SNP genotypes only due to the lack of mtDNA haplotypic diversity. Clusters were only included if there were at 287 least five samples collected from that cluster. To characterize the overall degree of differentiation 288 among social clusters, we performed this test using all available samples from clusters. Next, to 289 290 characterize the extent to which gene differentiation has been affected by social structure, we removed highly related (r > 0.6) samples to reduce bias due to genetic relatedness and 291 recalculated  $F_{ST}$  among social clusters, now considering differences in the allele frequency 292 within each cluster. 293

To determine whether genetically similar social units and clusters were more likely to associate, we compared pairwise cluster genetic differentiation ( $F_{ST}$ ) with mean pairwise association between clusters, using a fixed effect linear model with cluster ID controlled as a fixed effect. Association between pairs of clusters was calculated by taking the mean of association between individuals in the first cluster and individuals in the second cluster.

We used Mantel tests and linear models to examine the relationship between geographic distance, genetic relatedness, and associations between individuals. To do this, we first calculated geographic distance (d) as the straight-line distance between sampling locations for each sample. Three Mantel tests were calculated between all pairs of individuals, comparing

genetic distance (defined as 1 – genetic relatedness, r), geographic distance (d), and the amount
of time a pair spends together (association index, AI).

We compared linear, exponential, and logarithmic models to test the importance of 305 306 geographic distance (d), genetic relatedness (r), and an interaction term (r\*d) as potential drivers of association (AI) between individuals, and also between clusters. For these models, we 307 converted geographic distance to a categorical variable with two categories (inter-island, d < 300 308 mi and intra-island, d > 50 mi), due to the fact that, within each island community, sampling 309 location is not representative of an individual's habitat use or distance to other individuals in the 310 community. Further, in order to account for multiple observations of each individual, we 311 included fixed effects for each pairwise individual (I). We iteratively built models by adding one 312 313 predictor variable with each iteration, for a final model that included all possible predictor terms:

314

$$E(f[AI_{ij}]) = \alpha + \beta_1 r_{ij} + \beta_2 d_{ij} + \beta_3 r_{ij} d_{ij}, + G(I_i) + G(I_j)$$

Significant parameters of the model that minimized Akaike's Information Criterion (AIC)
 were considered to be potential drivers of association among pairs of individuals.

317

#### 318 **Results**

The mtDNA dataset consisted of 242 samples from throughout the Hawaiian Islands (125 319 previously reported in Van Cise et al., 2016). A total of 163 SNPs at 50 nuclear loci from 112 320 individuals were successfully genotyped from four capture-enriched library pools. The SNP and 321 mtDNA datasets overlapped by 100 samples. Six samples were determined to be duplicates and 322 removed from the dataset, so that the final SNP dataset included 106 individuals (Dryad Digital 323 324 Repository http://dx.doi.org/10.5061/dryad.xxxx). Forty-four SNPs were removed during the quality analysis phase due to possible assembly of paralogous loci, resulting in 119 SNPs at 49 325 nuclear loci (Supplemental Table S1). 326

Sample stratifications can be found in Figure 1 and Supplemental Table S2. Only eight samples with SNP data were available from the pelagic stratum, and no samples were successfully genotyped from the Northwestern Hawaiian Islands. Cluster assignments were made for 93 of the samples; analyses of differentiation among social clusters were performed using a dataset that included related individuals (n=93) and a dataset with individuals removed from pairs with relatedness estimates > 0.6 (n=85). Finally, pairwise relatedness based on the 51

unlinked SNPs was calculated for the full 106 sample SNP dataset, and group relatedness was

calculated for three social units, five clusters and two communities.

335 *Population structure and diversity* 

We found very low mtDNA haplotype diversity in the Hawaiian Islands (Table 1). Six 336 haplotypes were identified among the 242 samples (Table 2); 232 of the 242 samples had 337 haplotype J. With the exception of one sample collected off Kaua'i, all samples from the MHI 338 stratum had haplotype J. SNP genotypes were subsampled within each island community to 339 control for non-random sampling of social groups, so that the dataset used for molecular 340 diversity and geographic differentiation included 63 samples from the MHI. Observed and 341 expected heterozygosity for the phased multi-SNP genotypes in the MHI were both 0.46, with 342 slightly higher heterozygosity in the western MHI community than in the eastern MHI 343 community (Table 1). 344

Mitochondrial differentiation was significant between the MHI (N = 204) and NWHI (N = 17) strata, as well as between the MHI and pelagic (N = 20) strata ( $F_{ST}$  and  $\Phi_{ST}$  P < 0.001, Table 3). Within the MHI, SNP differentiation was small but significant between the eastern (N = 42) and western (N = 21) MHI communities ( $F_{ST}$  P = 0.009). SNP differentiation was not tested between other strata (pelagic, NWHI) due to low sample size. We did not find any evidence of sex-biased dispersal between communities in the MHI (P-values for all indices ranged from 0.2 to 0.9).

## 352 *Genetic structure, social structure, and island preference*

Average pairwise relatedness (r) among individuals was 0.11, with a range from 0 to 0.76. Within-unit relatedness estimates for each of three social units with five or more samples were all significantly higher than expected if groups were randomly organized (Figure 2). Within-cluster relatedness for cluster H20, comprised of three social units, was also significantly higher than relatedness between randomly selected pairs of social units (r = 0.33, P < 0.03), as well as being higher than mean relatedness at the community level (r = 0.11).

When pairs with r > 0.6 were removed, clusters with more than five individuals sampled were found to be significantly differentiated from each other in eight out of ten pairwise comparisons (Table 4). Global  $F_{ST}$  was also significant when tested using all samples with cluster assignments (n = 84,  $F_{ST} = 0.02$ , P = 0.05). When the same analysis is performed using all samples regardless of relatedness, the number of significant pairwise differences between

social clusters increases from eight to nine, likely due an increase in both sample size andrelatedness within groups (Supplemental Table S3).

Pairs of clusters that exhibited higher genetic differentiation associated less often (Figure 367 3), according to the results of a fixed effect linear regression, which indicated a negative causal 368 relationship between pairwise  $F_{ST}$  differentiation and association between clusters (P = 0.01). In 369 this model, genetic differentiation explained 68% of the variance in association between clusters 370 ( $\mathbb{R}^2 = 0.68$ ).

While there was no correlation between relatedness and geographic distance (Mantel test P = 0.13), association index was significantly correlated with both relatedness and distance (Mantel test P < 0.001 for both tests).

Regression model fits indicated that association between individuals increases with genetic relatedness. Genetic relatedness was found to be a significant driver of association time (P < 0.0001), while distance category (near or far), and the product of genetic relatedness and distance category, were not found to be significant (P = 0.9 and 0.2, respectively). AIC was minimized using a model in which association index increased with an exponential increase in relatedness (AIC = -4169), but a linear relationship was similar (AIC = -4164). Relatedness explained 21% of the variance in association time between pairs of individuals ( $R^2 = 0.21$ ).

381

# 382 Discussion

## 383 *Genetics, sociality and island preference*

Our results show that short-finned pilot whales in Hawai'i exhibit links between their 384 385 genetic structure, social structure and island preference, which is likely a socially-learned behavior. Similar links have been shown in other social animals, such as killer whales, sperm 386 whales, and elephants (Yurk et al., 2002; Archie et al., 2006; Wittemyer et al., 2009; Rendell et 387 al., 2012; Foote et al., 2016), and may have a stabilizing effect that promotes rapid genetic 388 divergence among groups. In Hawaiian pilot whales, it seems that island preference and social 389 390 structure influence genetic structure in the absence of any physical barriers to gene flow, based on genetic differentiation of island communities and clusters. Genetic relatedness in turn affects 391 392 social organization, based on high genetic relatedness within social units and clusters.

The importance of genetic relatedness to social organization is evident when we examine the high level of relatedness within social units as compared to random (Fig. 2), a pattern that has

been demonstrated in pilot whales from other regions of the world (Alves et al., 2013), and may result from matrilineal fidelity. We additionally found that relatedness was higher within clusters than throughout the Hawaiian population, suggesting that relatedness plays a role in determining how groups are organized at hierarchical levels above the immediate family unit. We saw the same pattern in the regression comparing relatedness with association in pairs of individuals, which showed that animals that were more closely related were also more likely to associate.

If relatedness does not affect social structure at any level higher than that of the social 401 unit, we would expect relatedness at the cluster level to fall to the level of relatedness within the 402 entire population. Our results indicate that relatedness continues to drive social structure and 403 association at higher levels in the hierarchical organization than just the matrilineal social unit. 404 405 This may indicate that clusters are groups of related social units that underwent fission, similar to elephants (Archie et al., 2006) and killer whales (Williams & Lusseau, 2006). Genetic 406 407 relatedness between groups can decay quickly in time due to the death of kin, and would be 408 consistent with the lower relatedness within clusters than social units that we observed in this study. 409

In elephants, social units that associate more often were shown to have recently split from each other due to the death of a matriarch (Archie et al., 2006). A larger, more comprehensive sample that includes all or most clusters, and a greater number of SNPs, would increase the resolution of the genetic structure among socially-divided units, clusters and communities, and may allow us to determine which clusters are more genetically similar, and whether specific clusters are facilitating gene flow between island communities.

On the other hand, we were able to show significant genetic differentiation among 416 417 sympatric clusters even when highly related individuals were removed from our analyses, indicating restricted gene flow among sympatric clusters. Clusters that were more genetically 418 419 differentiated also spent less time together (Fig. 3). This would suggest that social structure inhibits gene flow among clusters, which could accelerate genetic divergence among clusters 420 421 compared to a group of randomly mating individuals. It is important to note, however, that the observed genetic differentiation among clusters may also be caused by low effective population 422 423 size, sampling stochasticity, or a combination of these factors.

This bi-directional influence between social structure and genetic structure creates a positive feedback between the two that may be self-stabilizing, thus encouraging continued

genetic and social divergence. Similar patterns have been seen in other social animals; for example, in some bird species, social song learning has been argued to restrain genetic divergence soon after a dispersal event, but promote divergence at later stages in the process (Slabbekoorn & Smith, 2002). In killer whales, social structure and social learning are thought to have promoted rapid sub-species divergence into novel ecological niches (Foote et al., 2016). In a similar way, social structure in pilot whales may promote genetic divergence, and in turn genetic relatedness helps maintain a familial social structure.

Geographic distance is significantly correlated with association between individuals, or 433 social structure, although it was not found to be a significant driver of association between 434 individuals. Since geographic distance (d) cannot be interpreted as a continuous variable, due to 435 the geographic overlap of social units within island communities, it instead represents 436 individuals that were encountered in the same island community (d < 50 mi) or different island 437 communities (d > 300 mi). The correlation between geographic distance and association among 438 individuals likely indicates that individual preference for one island community and association 439 with other individuals are both driven by similar mechanisms. 440

While the present study did not examine genetic or social structure as drivers of 441 ecological behaviors such as island preference, there is evidence for social and parental (i.e., 442 genetic) learning of ecological and other behaviors in other highly social cetaceans, such as killer 443 whales and sperm whales (Cantor et al., 2015; Foote et al., 2016). Indeed, social learning of 444 ecological behaviors may be important to the long-term resilience of oceanic predators 445 (Whitehead, 2007b). Further studies of ecological and social behaviors in pilot whales, such as 446 447 diet preference, foraging strategies, mating strategies, group movements, and vocal repertoire 448 would help elucidate whether social and genetic structure also contribute to the learning and practice of these behaviors. 449

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#### 451 *Population structure and diversity*

Mitochondrial diversity is very low in Hawaiian short-finned pilot whales: of the six haplotypes reported in this study, haplotype J made up the majority of individuals, and although sampling was increased in the MHI from previous Pacific-wide studies (Van Cise et al., 2016), no new haplotypes were found in this study. The MHI stratum was distinct from the pelagic and NWHI strata, indicating the presence of an insular population around the MHI, as well as a

457 pelagic/NWHI population. Insular or coastal populations have been observed in other odontocetes, such as false killer whales (Martien et al., 2014), bottlenose dolphins (Allen et al., 458 2016) and spinner dolphins (Andrews et al., 2010). Pilot whales exhibit strong site fidelity 459 460 (Mahaffy et al., 2015), and it is possible that the MHI population has become adapted to the slope habitat it prefers (Baird, 2016; Abecassis et al., 2015), and may have different dietary 461 preferences from the pelagic population. However, tagging data indicate that pelagic social 462 groups will sometimes travel through the slope region of the MHI (Baird, 2016). The lack of 463 mtDNA gene flow between these two populations suggests that social structure prevents 464 dispersal of females between these two populations when they come in contact with each other. 465

Although mtDNA differentiation between the pelagic and NWHI strata was non-466 significant, we expect that a larger sample size will differentiate the two populations. Samples 467 from the pelagic stratum had haplotypes also found in SE Asia, the South Pacific, the Indian 468 Ocean, and southern Japan, while NWHI haplotypes were either J (MHI) or an endemic 469 470 haplotype with 4 bp difference from J, suggesting that the NWHI group may have diverged from the MHI insular population, possibly due to geographic isolation. This is similar to the pattern 471 observed in Hawaiian false killer whales (Pseudorca crassidens), where photo-identification, 472 tagging, and mtDNA suggest three populations, with shared maternal ancestry between the MHI 473 and NWHI, but nuclear data showing contemporary gene flow is highest between the NWHI and 474 pelagic populations (Martien et al., 2014). However, our nuclear SNP sample size was not large 475 enough to test for geographic differentiation between these strata, therefore the possibility still 476 remains for male-mediated gene flow between the NWHI and Pelagic strata. A large dataset of 477 both mtDNA haplotypes and SNP genotypes from the NWHI and pelagic strata may provide 478 479 greater insight into the historical and contemporary rates of gene flow among these geographic 480 areas.

Within the insular MHI population, there are at least two genetically distinct island communities, with some continued gene flow between them. This may be driven by cluster philopatry to island communities, with some clusters key to gene flow between communities. Satellite tag data indicate a third possible community, around O'ahu/Lāna'i, known as the central MHI community (Baird, 2016). Additional samples from that community are needed to test whether it is genetically distinct from the eastern and western MHI communities. Individuals rarely leave their island community, instead spending the majority of their time around one

488 island; however, on rare occasions clusters have been observed outside their island community
489 ranges (Baird 2016), and mating may occur during these rare excursions.

Within small groups, such as social units or clusters, inbreeding depression can be 490 491 avoided through mechanisms such as sex-biased dispersal (Prout, 1981). We found no detectable 492 difference in genetic diversity indices at the regional, MHI population, or community level, indicating a lack of inbreeding, though there was no nuclear evidence for sex-biased dispersal 493 among communities. Sugg et al., (1996) use a socially-structured population of prairie dogs to 494 show that an increase in coancestry within a breeding group is countered by divergence among 495 groups, which works to maintain genetic diversity at the population level. This can happen 496 through kin recognition and behavioral avoidance of mating within a group, or if one sex remains 497 philopatric to the group while the other sex is more likely to disperse. The advantages of social 498 living, such as cooperative behaviors and increased genetic fitness, are thought to outweigh the 499 costs if inbreeding can be avoided (Sugg et al., 1996). In Main Hawaiian Island pilot whales, 500 high levels of coancestry, or relatedness, within social units and clusters may be countered by 501 genetic divergence among these groups, thus maintaining genetic diversity at the community and 502 population level. However, Parreira & Chikhi (2015) found that randomly permuting social unit 503 504 membership within a population always produces an excess of heterozygotes, and concluded that 505 it is not necessary to use inbreeding-avoidance mechanisms to explain outbreeding signatures in 506 small groups, but rather that social structure itself generates outbreeding signatures that can have 507 advantageous fitness traits.

Short-finned pilot whales in Hawaiian waters are subjected to a variety of anthropogenic 508 509 impacts, including interactions with fisheries, vessel strikes, and exposure to high-intensity Navy 510 sonars (Baird, 2016). Social species such as this can be more vulnerable to the removal of a single individual, as it may precipitate the loss of an entire group (Wade et al., 2012). If some 511 512 clusters contribute more to gene flow between communities, the loss of those clusters could act to fragment communities within the MHI, which would decrease genetic diversity and increase 513 514 demographic isolation in each region, thus making those communities more vulnerable to environmental or anthropogenic perturbations. 515

516 In order to avoid this vulnerability, conservation management of this species in the 517 Hawaiian Islands could focus on maintaining gene flow between communities within the MHI 518 populations, similar to migration corridors between fragmented terrestrial habitats. This would

require the use of photo-identification and satellite tag data to identify individuals or social groups that regularly move among communities, and movement patterns associated with these events. Once these corridors are established, fisheries interactions within them could be monitored in order to minimize fatal injuries or inhibition of movement.

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# 736 Data availability

We have deposited the sequences used in these analyses in GenBank. Accession numbers for mtDNA haplotypes are: KM624043, KM624044, KM624054, KM624055, KM624058, and KM624059. Accession numbers for nuclear sequences generated for SNP discovery are MG023261-MG023309. The *Tursiops truncatus* reference sequence and SNP genotype data are available from the Dryad Digital Repository: http://dx.doi.org/10.5061/dryad.78521.

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Figure 1. Sampling locations for samples used in this study. *Above:* samples used in mtDNA
analyses. Symbols represent their stratification for geographic structure analyses. Inset shows
additional samples from the NWHI and Pelagic strata. *Below:* samples used in SNP analyses.
Symbols represent their stratification for genetic structure analyses. Samples labeled "No Link"
are presumed to belong to the pelagic stratum, because they cannot currently be linked to any
social stratum within the Main Hawaiian Islands. Inset shows social units and clusters in the
Eastern Community that were used for relatedness analyses.

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Figure 2. Relatedness analysis for three social units with at least five individuals sampled, and
overall relatedness within groups (bottom right). Arrows indicate average within-group
relatedness; histograms show the expected distribution of within-group relatedness values if
groups were randomly organized but retained their original sample size.

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Figure 3. Fixed effect linear regression comparing pairwise genetic differentiation ( $F_{ST}$ ) among clusters with average association index, or rate of association, among clusters. Association index is calculated using a half-weight index and a sampling period of one day, to control for effort.



- 1 Supplemental Table S1. Summary metrics for 119 SNP loci included in this study.
- 2 Supplemental Table S2. Sample stratification levels used for statistical analyses in this study.
- 3 Bold values in the Cluster column indicate samples that were removed before cluster  $F_{ST}$
- 4 analysis due to high relatedness to other samples in the study.
- 5 Supplemental Table S3. Genetic differentiation  $(F_{ST})$  between five clusters with more than five
- 6 sampled individuals (related individuals included). Significant differentiation between clusters
- 7 (p-value, final column) is shown in bold.

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Table 1. Molecular diversity indices for SNP and mtDNA datasets. MHI SNP data were tested using sub-sampled datasets so that diversity indices within strata were not biased by sampling technique. "All samples" includes all samples included in the study. Nuclear samples were subsampled within the eastern and western communities. N = sample size,  $H_o =$  observed heterozygosity,  $H_e =$  expected heterozygosity.

	mtDNA	Theta	Haplotype	Nucleotide	SNP	Ave. num	тт	тт
	Ν	$( heta_{ m H})$	diversity (h)	diversity (π)	Ν	alleles	H <sub>0</sub>	H <sub>e</sub>
All samples	242	0.06	$0.08\pm0.02$	0.004	106	4	0.45	0.45
Regions								
MHI <b>V</b>	205	0.007	$0.01\pm0.01$	0.004	63	3.9	0.46	0.46
Western MHI	5				21	35	0 49	0 47
Community					21	5.0	0.19	0.17
Eastern MHI					42	37	0.45	0.45
Community					42	5.7	0.45	0.45
NWHI	17	0.33	$0.44\pm0.1$	0.004				
Pelagic	20	0.27	$0.36\pm0.1$	0.004				

**Author** N

Stratum	MHI	NWHI	Pelagic
Haplotype			
	204	12	16
C	1	0	0
K	0	0	2
12	0	5	0
11	0	0	1
2	0	0	1
S			
T			
0			

Table 2. Mitochondrial haplotype distribution by stratum in the Hawaiian Islands.

Table 3. Geographic population differentiation in Hawaiian Island short-finned pilot whales. For SNP data, only  $F_{ST}$  was calculated; for mtDNA data, both  $F_{ST}$  and  $\Phi_{ST}$  were calculated. Sample sizes for each stratum are shown in parentheses. Significant values are shown in bold.

Stratum	<b>F</b> <sub>ST</sub>	<b>F</b> <sub>ST</sub> <b>P-value</b>	${oldsymbol{\varPhi}_{ ext{ST}}}$	$\boldsymbol{\Phi}_{\mathrm{ST}}$ P-value
mtDNA				
MHI (204) v. NWHI (17)	0.67	<0.001	0.58	<0.001
MHI (204) v. Pelagic (20)	0.39	<0.001	0.30	<0.001
NWHI (17) v. Pelagic (20)	0.08	0.07	0.01	0.28
SNP				
Eastern MHI Community (42) v.	0.01	0.009	NA	NA
Western MHI Community (21)				

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Table 4. Genetic differentiation ( $F_{ST}$ ) between five clusters with more than five sampled individuals (related individuals not included); sample sizes for each cluster are shown in parentheses.  $F_{ST}$  P-values (in parentheses) are shown below  $F_{ST}$  values; significant differentiation between clusters is shown in bold.

Community Cluster 2 (8)	Community Cluster 20 (10)	Community	Community
Cluster 2 (8)	Cluster 20 (10)		
		Cluster 22 (10)	Cluster 13 (9)
0.05			
(~0.001)			
(<0.001)			
0.06	0.04		
(<0.001)	(0.002)		
0.02	0.02	0.01	
(0.05)	(0.04)	(0.12)	
		× ,	
0.05	0.03	0.02	0.002
0.03	0.03	0.02	0.002
(0.02)	(0.03)	(0.04)	(0.39)
	(<0.001) 0.06 (<0.001) 0.02 (0.05) 0.05 (0.02)	$\begin{array}{c c} (<0.001) \\ \hline 0.06 & 0.04 \\ (<0.001) & (0.002) \\ \hline 0.02 & 0.02 \\ (0.05) & (0.04) \\ \hline 0.05 & 0.03 \\ (0.02) & (0.03) \end{array}$	(<0.001) 0.06 0.04 (<0.001) (0.002) 0.02 0.02 0.01 (0.05) (0.04) (0.12) 0.05 0.03 0.02 (0.02) (0.03) (0.04)

AU









![](_page_35_Figure_0.jpeg)