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from complete mitochondrial genomes

ANNA BRNICHE-OLSEN, JOHN W. BICKHAM,
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BRYKOV, R. JORGE URBAN, J. ANDREW
DEWOODY



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1 **Recent demographic history and population structure of gray whales inferred from**
2 **complete mitochondrial genomes**

3 ANNA BRÜNICHE-OLSEN¹, JOHN W. BICKHAM², CELINE A. GODARD-CODDING³,
4 VLADIMIR A. BRYKOV⁴, R. JORGE URBAN⁵, J. ANDREW DEWOODY^{1,6}

5
6 *¹Department of Forestry & Natural Resources, Purdue University, West Lafayette, IN 47905,*
7 *USA.*

8 *²Department of Ecology and Conservation Biology, Texas A&M University, College Station, TX*
9 *77843 USA.*

10 *³Institute of Environmental and Human Health, Texas Tech University (TTU) and TTU Health*
11 *Sciences Center, Lubbock, TX 79409, USA*

12 *⁴National Scientific Center for Marine Biology, Russian Academy of Sciences, Far Eastern*
13 *Branch, Vladivostok, Russia*

14 *⁵Departamento Académico de Ciencias Marinas y Costeras, Universidad Autónoma de Baja*
15 *California Sur, Km 5.5 Carretera al Sur, Mezquitito, La Paz, BCS 23080, México*

16 *⁶Department of Biological Sciences, Purdue University, West Lafayette, IN 47905, USA*

17

18 Corresponding author: Anna Brüniche-Olsen, abruenic@purdue.edu

19

20 **ORCID**

21 Anna Brüniche-Olsen <https://orcid.org/0000-0002-3364-2064>

22 John W. Bickham <https://orcid.org/0000-0001-9624-7806>

23 J. Andrew DeWoody <https://orcid.org/0000-0002-7315-5631>

24

25 **Keywords**

26 Cetacean, mitogenome, historical demography.

27

28 **Abstract**

29 We report full mitogenome sequences for 74 North Pacific gray whales including 38 western
30 gray whales sampled at their summer feeding grounds near Sakhalin Island and 36 eastern gray
31 whales sampled at their wintering breeding grounds in Mexico. The relationship of these two
32 populations is uncertain since recent studies have shown at least some western gray whales to
33 winter in Mexico. Haplotype diversity was much higher in the large (ca. 27,000) eastern gray
34 whale population compared to the small western gray whale population (200-300) but no
35 phylogeographic structure is evident in the data. This is suggestive of female mediated gene flow
36 or a recent divergence of the populations. Historical demographic analysis shows the North
37 Pacific gray whales experienced a population bottleneck that predated the Last Glacial Maximum
38 (LGM) but fails to resolve an expected recent population bottleneck caused by commercial
39 whaling. Mitochondrial diversity was likely already reduced at the time of whaling.

40

41 **Introduction**

42 Anthropogenic change is rapidly altering marine ecosystems with unknown consequences for the
43 marine biota, including marine mammals (Doney *et al.* 2012; Jackson 2008). These changes are
44 both direct (e.g., commercial whaling, ship strikes) and indirect (e.g., ocean warming, pollution,
45 industrial development). We are just beginning to understand how marine mammals responded
46 to past environmental perturbations like the Pleistocene glacial periods (Phillips *et al.* 2011),

47 which is important for conservation efforts as it enables us to make informed predictions on how
48 they may respond to the ongoing environmental changes (Kaschner *et al.* 2011; Parmesan &
49 Yohe 2003; Ramp *et al.* 2015). Many populations of great whales (Mysticeti) are especially
50 vulnerable after being decimated by unregulated commercial whaling in the 19th and 20th
51 centuries leading to very low population sizes for the majority of great whales (Baker &
52 Clapham 2004; Roman & Palumbi 2003).

53 The gray whale (*Eschrichtius robustus*) is one species that has already been impacted by
54 both anthropogenic and climate changes (Alter *et al.* 2015; Árnason *et al.* 2018; Brüniche-Olsen
55 *et al.* 2018b). Since disappearing from the Atlantic Ocean due to whaling, it is now found only in
56 the North Pacific Ocean (Alter *et al.* 2015). There are two mixed-stock populations, with some
57 degree of gene flow between them (Alter *et al.* 2015; Brüniche-Olsen *et al.* 2018a; DeWoody *et*
58 *al.* 2017; Lang *et al.* 2010; LeDuc *et al.* 2002). The eastern gray whale numbers about 27,000
59 and migrates along the Pacific coast of North America from wintering breeding grounds in
60 Mexico to summer feeding grounds primarily in the Bering Sea (Figure 1), making it among the
61 longest migrating mammalian species in the world (i.e., >20,000 km annually, Mate *et al.* 2015).
62 The western gray whale numbers only about 200 to 300 individuals and migrates along the Asian
63 coast from unknown wintering breeding grounds probably in the South China Sea to summer
64 feeding grounds in the Sea of Okhotsk. Today this small population summers primarily off the
65 northeastern coast of Sakhalin Island, Russia (Figure 1). This population was presumed extinct
66 due to whaling, but was re-discovered in the 1980s. Uncertainty regarding the affiliation of the
67 western gray whales was raised when satellite transmitters were placed on three whales that
68 migrated from Sakhalin to or towards North America and the eastern gray whale wintering
69 grounds in Mexico (Mate *et al.* 2015).

70 Whether gray whales may benefit from climate warming is a complex question.
71 Environmental niche modelling of future gray whale habitat for year 2100 indicates expanded
72 habitat with future climate warming (Brüniche-Olsen *et al.* 2018b), and decreased ice cover on
73 the feeding grounds is correlated with a longer feeding season for reproductive females, and a
74 resulting higher calf survival to the following year (Gailey *et al.* 2020). However, other factors
75 might negate such a benefit. The effects of climate warming on food resources and distribution,
76 increased ship traffic in the Arctic, hydrocarbon development, and changes in commercial
77 fishing practices could have detrimental impacts on gray whale survival (Coyle *et al.* 2007;
78 Reeves *et al.* 2014). Despite the challenges to survival of the endangered western gray whales,
79 the population has increased at an annual rate of 4 to 5% between the years 1995 to 2015
80 (Cooke, 2018; Cooke *et al.* 2019), yet it remains a small population.

81 The erosion of genetic diversity is well known as a factor that contributes to increased
82 probability of extinction. Conservation geneticists routinely use mtDNA to test for genetic
83 bottlenecks and to reconstruct the deep historical demography of populations. However,
84 detection of very recent bottlenecks for long-lived species like baleen whales (Taylor *et al.* 2007)
85 is technically very difficult unless genetic samples of the population pre-bottleneck are available
86 (Leonard 2008). In eastern gray whales pre- and post-whaling genetic samples have been used to
87 assess impacts of commercial whaling. The results illustrate the large uncertainty associated with
88 inferring recent demographics. In one study eastern gray whales showed no change in diversity
89 for mtDNA (~450bp) and microsatellites (Béland *et al.* 2019). In contrast other studies have
90 identified a recent bottleneck based on mtDNA (383bp) (Alter *et al.* 2012), and microsatellite
91 data estimated the eastern population to be at 28–56% of its pre-whaling abundance (Alter *et al.*
92 2007). No recent bottleneck estimate for the western gray whales is available, but it is clear that

93 the this population was even more greatly impacted by commercial whaling than the eastern gray
94 whale (Swartz *et al.* 2006).

95 In this study, we use complete mitochondrial genomes from 70+ eastern and western gray
96 whales to: i) assess population structure and gene flow between the populations, and ii)
97 reconstruct the female demographic history to determine past population dynamics. This
98 information will be useful for other studies of recent population dynamics for long lived species
99 like great whales and inform gray whales conservation efforts.

100

101 **Methods**

102 *Tissue collection and mitogenome sequencing*

103 We extracted DNA from tissue biopsy samples from 69 gray whales from the eastern and
104 western Pacific (Figure 1). The individuals used herein were previously genotyped at 91
105 autosomal loci (Brüniche-Olsen *et al.* 2018a). The samples were collected off Baja, Mexico and
106 off Sakhalin Island, Russia between 2011 and 2016 using a 150 lb draw weight compound
107 crossbow with 40mm by 7mm internal diameter tip arrows. DNA sequences were generated
108 using a NovaSeq with paired end (PE) reads, which we used to reconstruct the entire
109 mitochondrial genomes. We added PE reads from two Sakhalin gray whales (DeWoody *et al.*
110 2017) and three eastern gray whales (Árnason *et al.* 2018; DeWoody *et al.* 2017) giving a total of
111 74 complete mitogenomes.

112 For mitogenome *de novo* assembly we used NOVOPLASTY v3.1 (Dierckxsens *et al.*
113 2016). To facilitate circular sequence alignment we used MARS (Ayad & Pissis 2017), and
114 realigned the sequences using MAFFT (Katoh & Standley 2013). We masked ambiguous
115 nucleotides in the mitogenome sequences “N”. The sequence alignment were inspected visually

116 in UGENE v1.32.0 (Okonechnikov *et al.* 2012). To quality check our data we inspected known
117 mother-offspring pairs to confirm that they had the same haplotype, and identified outlier
118 haplotypes using delta-likelihood using PEGAS (Paradis 2010). We used ORFFINDER
119 (Wheeler *et al.* 2003) to estimate the number of open reading frames (ORF) in the main
120 mitochondrial clades.

121

122 ***Genetic diversity and population structure***

123 We used DNAsp v5 (Librado & Rozas 2009) to calculate genetic diversity quantified as the
124 number of haplotypes (h), haplotype diversity (h_d), the number of segregating sites (S), average
125 number of nucleotide differences (k), and nucleotide diversity (π). Demographic changes were
126 quantified with Fu's and Li's D^* and F^* (Fu 1997). POPART (Leigh & Bryant 2015) was used
127 to construct a median-joining haplotype network. To assess how much of the total haplotype
128 diversity in each population we had sampled we plotted rarefaction curves using VEGAN
129 (Oksanen *et al.* 2010).

130

131 ***Phylogenetic relationships***

132 A time-scaled phylogeny for the gray whale haplotypes was constructed using Bayesian
133 methods. We identified The Most Recent Common Ancestor (TMRCA) lineages for the gray
134 whale clade by constructing a phylogeny of the unique gray whale haplotypes and mitogenomes
135 from fin whale (*Balaenoptera physalus* KC572811.1) and humpback whale (*Megaptera*
136 *novaeangliae* AP006467.1) using PHYML (Guindon *et al.* 2010). Based on the phylogeny we
137 identified two gray whale haplotypes from the two main clades of the phylogeny (individual ER-
138 17-0248 and ER-17-0253), and these were then used for the TMRCA prior. A log-normal prior

139 for TMRCA (mean = 80, standard deviation = 0.15) was used based on TMRCA inferences from
140 whole genome sequences from eastern and western pacific gray whales 80ky (60 – 100ky 95%
141 highest posterior density (HPD)) (Árnason *et al.* 2018), and from mitochondrial data from the
142 extinct Atlantic gray whale and the extant Pacific gray whale 79ky (63 – 102ky 95% HPD)
143 (Alter *et al.* 2015). PARTITIONFINDER v2.1.1 (Lanfear *et al.* 2017) was used to identify the
144 most likely partitioning scheme and model of nucleotide substitution for each region, and the
145 result was used to inform BEAST2 (Bouckaert *et al.* 2014), accounting for codon position rate
146 variation in the coding regions (Ho & Lanfear 2010).

147 To assess the level of rate heterogeneity we used an uncorrelated log-normal clock using
148 the ‘constant population’ tree prior. Because the mtDNA is inherited as a single locus, we used
149 unlinked site models, linked clock model and linked tree model. We ran the MCMC for 5×10^7
150 iterations sampling for every 5×10^3 iteration and removing the first 10% as burn-in. Multiple
151 runs were done and checked for convergence and equivalent sample size (ESS) values >200 in
152 TRACER v1.7.1 (Rambaut *et al.* 2016). The clock model was assessed in TRACER based on the
153 ‘uclDStdev’ parameter. A value <0.1 indicates negligible variation in substitution rate among the
154 lineages and thus a better fit of the strict clock (Drummond & Bouckaert 2015). The haplotype
155 phylogeny was visualized in FIGTREE v1.4.2 (Rambaut 2012).

156

157 ***Demographic inference***

158 Demographic trajectories for the female effective population size (N_{ef}) was inferred using
159 Bayesian coalescent samplers in BEAST2 (Drummond 2008). Unequal sampling effort can
160 confound demographic reconstruction (Heller *et al.* 2013), but as we had an equal number of
161 samples from each part of the Pacific, and no indication of population structure (see haplotype

162 network in Figure 2), we included all 74 individuals in the demographic analysis. The setup was
163 the same as for the phylogeny reconstruction except here we used a log normal clock and the
164 estimated clock rate $4.0 \times 10^{-8} \text{ bp}^{-1} \text{ year}^{-1}$ ($2.3 \times 10^{-8} - 6.0 \times 10^{-8}$ 95% HPD)). To identify if the gray
165 whales had experienced changes in N_{ef} we used the ‘Extended Bayesian Skyline plot’ (EBSP).
166 The rationale for using EBSP was that we were interested in the ‘sum(indicators.alltrees)’
167 parameter, which describes the number of likely population size changes in the data. Multiple
168 runs were done for each model and checked for convergence in TRACER. To convert to
169 effective population size (N_e) we used a generation time (g) of 18.9 years as the midpoint
170 between 15.5 and 22.3 years (Heppell *et al.* 2000; Rice *et al.* 1971).

171

172 **Results**

173 *Genetic diversity and population structure*

174 We obtained mitogenomes from 74 gray whales representing 36 eastern gray whales and 38
175 western gray whales (Figure 1). The mean depth of coverage for the mitogenomes was 250x,
176 providing a high degree of certainty for haplotype identification. Neither eastern or western gray
177 whales showed signs of demographic changes based on D^* and F^* (Table 1). The eastern gray
178 whales had higher number of haplotypes and higher haplotype diversity ($h = 25$ and $h_d = 0.975$)
179 compared to the western gray whales ($h = 9$ and $h_d = 0.723$) (Table 1). We identified similar
180 levels of control region diversity found by earlier authors (Alter *et al.* 2015; Supplementary
181 material Table S2). Despite their reduced number of haplotypes (only about 1/3 as many as the
182 eastern gray whales), the western gray whales had higher π and k , reflecting that the smaller
183 number of haplotypes had a high degree of divergence.

184 Our haplotype network identified two main groups, both with 57 ORFs, separated by 79
185 mutations, a structure similar to all previous analyses of mtDNA (Figure 2; Alter *et al.* 2015).
186 There was no pronounced mtDNA structure between the eastern and western gray whales.
187 Eastern gray whales were found throughout the haplotype network mainly represented by single
188 haplotypes, whereas the majority of western gray whales consisted of only two haplotypes.
189 Rarefaction curves of sampling effort (Figure 3) suggested that future sampling of more
190 individuals from the eastern Pacific could continue to increase the number of haplotypes
191 ultimately identified, but increased sampling effort in the western Pacific is unlikely to reveal
192 many more undiscovered haplotypes (Figure 3).

193

194 ***Phylogenetic relationships***

195 Our phylogenetic analysis showed that an uncorrelated log-normal clock fitted our dataset better
196 than a strict clock model ('uclStdev' = 0.17). Bayesian analyses estimated a divergence time
197 between the two main mtDNA clades of ~76.5ky (55.0 – 99.5% HPD) (Figure 3). The phylogeny
198 is based on estimates of TMRCA inferred from whole genome sequences (Árnason *et al.* 2018)
199 and from the control region of the mtDNA (Alter *et al.* 2015), and TMRCA was marginally more
200 recent than our estimates. The majority of the branches coalesced 20-23ky ago during the Last
201 Glacial Maximum (LGM) potentially reflecting the LGM bottleneck (Brüniche-Olsen *et al.*
202 2018b). Private haplotypes were observed in both eastern and western Pacific sampling sites
203 (Table 1; Figure 3), but private clades were found only in the eastern population. These were
204 recent (<15ky) suggesting limited maternal population structure between eastern and western
205 gray whales.

206

207 **Demographic inference**

208 The E BSP analysis found ‘sum(indicators.alltrees)’ parameter to have a mean =1.07 (0 – 3 95%
209 HPD) with zero changes being the most frequent number of changes identified (0 changes
210 ~19,000 times, one change ~11,500 times, two change ~8,000 times and three changes ~5,000
211 times) as the most likely demographic model. The demographic trajectory showed that the long-
212 term population size was ~80,000 ($N_e \times g$) corresponding to a median N_e ~4,200 and N ~25,200
213 assuming a generation time of 18.9 years (Figure 4). A slight recent decline in population size
214 was observed ~70,000 ($N_e \times g$) corresponding to a median N_e ~3,700 and N ~22,200, although this
215 might be an artefact as a constant population size could not be rejected. The majority of the
216 demographic events occur very recently (<500 years ago), depicted by the bars, suggesting that
217 with the mitogenome dataset we quickly lose resolution as we go back in time.

218

219

220 **Discussion**

221 During interglacial periods many great whales experienced drastic decline in population size
222 (Árnason *et al.* 2018), and more recently commercial whaling further reduced populations (Baker
223 & Clapham 2004; Roman & Palumbi 2003). These sequential population reductions are a
224 concern as genetic diversity is lost during periods of small population size. Gray whales
225 experienced substantial Pleistocene (Brüniche-Olsen *et al.* 2018b) and Holocene (Alter *et al.*
226 2015; Alter *et al.* 2012; Alter *et al.* 2007) declines compromising their population sizes. Herein
227 we examine mtDNA population dynamics of eastern and western gray whales, searching for
228 evidence of phylogeographic structure and tracing recent demographic trajectories. We were

229 particularly interested in whether full mitogenomes would increase the resolution compared to
230 shorter (400 - 500bp) mitochondrial fragments.

231

232 ***Population structure among maternal gray whale lineages***

233 Studies of mtDNA control region sequences, nuclear microsatellites, and SNPs have consistently
234 revealed a low but statistically significant F_{ST} in comparisons of eastern and western gray whales
235 samples of various origins (Brüniche-Olsen *et al.* 2018a; Brykov *et al.* 2019; Lang *et al.* 2010;
236 LeDuc *et al.* 2002). Genic and inter-genic SNP markers established that both the eastern and
237 western gray whales each consist of mixed stock assemblages, with one genotype predominating
238 in whales sampled of the Mexican wintering grounds and another genotype predominating in
239 whales sampled of the coast of Sakhalin Island (Brüniche-Olsen *et al.* 2018a). We know from
240 photo identification (photo ID) that whales, including males and females, of both genotypes
241 migrate from Sakhalin to Mexico (Brykov *et al.* 2019) and we know from telemetry data that
242 whales migrate between Sakhalin and Mexico (Mate *et al.* 2015). Our data using complete
243 mitogenomes confirm previous studies (Brykov *et al.* 2019; Lang *et al.* 2010; LeDuc *et al.*
244 2002), that show mtDNA haplotype lineages with no evidence of unique lineages within the
245 western gray whale population (Figure 2 and Figure 4) as might be expected if females were
246 strongly philopatric due to natal homing or social facilitation (FitzSimmons *et al.* 1997). If
247 eastern and western gray whale were two separate breeding entities we would expect that they
248 should have evolved unique haplotype lineages, given that other marine mammals with similar
249 geographic distributions have such distinct mtDNA lineages (Phillips *et al.*, 2011).

250

251 ***Population dynamics***

252 Studies of Atlantic and Pacific gray whale populations show that there was not only gene flow
253 within each ocean basin, but also between ocean basins (Alter *et al.* 2015). Our analyses of
254 whole mitogenomes from Pacific gray whales support this scenario of female-mediated gene
255 flow through time. The majority of mitochondrial diversity is found in the eastern gray whales
256 (Table 1), and had we increased our sampling efforts we would have been more likely to recover
257 novel haplotypes by sampling off the coast of Mexico (Figure 3). This mimics the IUCN status
258 with the eastern gray whale being least concern whereas the western gray whale is endangered
259 (IUCN 2018).

260 The deep divergence between major clades ~75kya (Figure 4) predates the LGM and the
261 majority of the branches coalesced 20-23ky ago potentially reflecting the LGM bottleneck
262 (Brüniche-Olsen *et al.* 2018b), suggesting that the mitochondrial diversity was already depleted
263 prior to commercial whaling. Our estimate of the current population size fits with the estimated
264 census size $N \sim 22,200 - 25,200$. We fail to recover the presumed commercial whaling bottleneck
265 (Figure 5). Many studies have used mtDNA to reconstruct demographic history (Brüniche-Olsen
266 *et al.* 2014; Heller *et al.* 2012; Phillips *et al.*, 2011; Shapiro *et al.* 2004), but for long-lived
267 species the resolution for such analyses are not optimal if the bottleneck was subtle or if it was
268 followed by fast recovery (Mourier *et al.* 2012). Furthermore the partitioning of the dataset can
269 greatly impact the demographic inference if population structure is present (Heller *et al.* 2013),
270 leading to questionable results (Pérez-Alvarez *et al.* 2016). Incorporating nuclear markers along
271 with the mitochondria in analysis can help resolve some of the signals related to for example
272 gene flow (Carroll *et al.* 2019).

273

274 **Conclusion**

275 Phylogenetic analyses of full mitogenomes of eastern and western gray whales showed no
276 evidence of population structure, consistent with previous studies of shorter segments of
277 mtDNA. Previous studies have found significant differences between the populations in
278 haplotype frequencies (LeDuc *et al.*, 2002; Lange *et al.*, 2011) but this was not tested in our
279 study. Our data indicate that there has been female mediated gene flow between the two
280 populations, or a recent divergence. Deep divergence of two major mtDNA clades predating the
281 LGM was observed. Most of the haplotype branches coalesce 20-23 ky ago which is consistent
282 with a previously observed LGM bottleneck based on whole genome sequences (Brüniche-Olsen
283 *et al.* 2018b). No evidence of a recent bottleneck caused by commercial whaling was observed,
284 likely due to insufficient resolution at recent time scales. Our estimate of current population size
285 based on mtDNA diversity is close to the current estimated census size of the North Pacific gray
286 whale population as a whole, and the strong difference in observed haplotype diversity between
287 eastern and western gray whales is consistent with populations of drastically different size
288 (27,000 vs. 200-300, respectively).

289

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296

297 **Ethical statement**

298 Russian and Mexican field research was approved by the Ethics Committee of the National
299 Scientific Center of Marine Biology of the Far East Branch of the Russian Academy of Science
300 and by the Subsecretaria de Gestion Para La Protection Ambiental of the Mexican Direccion
301 General de Vida Silvestre, respectively. U.S. research on marine mammal samples collected
302 abroad by foreign colleagues falls under the authority of NOAA and requires a U.S. MMPA
303 permit as well as the proper CITES permits for import and export of the samples. Russian and
304 Mexican collaborators obtained proper research permits, which covered ethical considerations
305 for the collection of samples. Thus, all relevant U.S. and international permits were secured for
306 this research. National Marine Fisheries Service Office of Protected Resources' Marine Mammal
307 Health and Stranding Response Program permit 93-1905-MA-009526. CITES permit
308 13US082589/9, 13RU00580, MX89451, and MX71396.

309

310 **Data accessibility**

311 Genbank accession codes: XXXX - XXXX.

312 **References**

- 313 Alter SE, Meyer M, Post K, *et al.* (2015) Climate impacts on transocean dispersal and habitat in
314 gray whales from the Pleistocene to 2100. *Molecular Ecology* **24**, 1510-1522.
- 315 Alter SE, Newsome SD, Palumbi SR (2012) Pre-whaling genetic diversity and population
316 ecology in eastern Pacific gray whales: Insights from ancient DNA and stable isotopes.
317 *Plos One* **7**, e35039.
- 318 Alter SE, Rynes E, Palumbi SR (2007) DNA evidence for historic population size and past
319 ecosystem impacts of gray whales. *Proceedings of the National Academy of Sciences of*
320 *the United States of America* **104**, 15162-15167.
- 321 Árnason Ú, Lammers F, Kumar V, Nilsson MA, Janke A (2018) Whole-genome sequencing of
322 the blue whale and other rorquals finds signatures for introgressive gene flow. *Science*
323 *Advances* **4**, eaap9873.
- 324 Ayad LAK, Pissis SP (2017) MARS: improving multiple circular sequence alignment using
325 refined sequences. *Bmc Genomics* **18**, 86.
- 326 Baker CS, Clapham PJ (2004) Modelling the past and future of whales and whaling. *Trends in*
327 *Ecology & Evolution* **19**, 365-371.
- 328 Béland SL, Frasier BA, Darling JD, Frasier TR (2019) Using pre- and postexploitation samples
329 to assess the impact of commercial whaling on the genetic characteristics of eastern
330 North Pacific gray and humpback whales and to compare methods used to infer historic
331 demography. *Marine Mammal Science*.
- 332 Bouckaert RR, Drummond AJ (2017) bModelTest: Bayesian phylogenetic site model averaging
333 and model comparison. *Bmc Evolutionary Biology* **17**, 42.

334 Bouckaert RR, Heled J, Kühnert D, *et al.* (2014) BEAST 2: a software platform for bayesian
335 evolutionary analysis. *PLoS Comput Biol* **10**.

336 Brüniche-Olsen A, Jones ME, Austin JJ, Burridge CP, Holland BR (2014) Extensive population
337 decline in the Tasmanian devil predates European settlement and devil facial tumour
338 disease. *Biology Letters* **10**.

339 Brüniche-Olsen A, Urban JR, Vertyankin VV, *et al.* (2018a) Genetic data reveal mixed-stock
340 aggregations of gray whales in the North Pacific Ocean. *Biology Letters* **14**.

341 Brüniche-Olsen A, Westerman R, Kazmierczyk Z, *et al.* (2018b) The inference of gray whale
342 (*Eschrichtius robustus*) historical population attributes from whole-genome sequences.
343 *Bmc Evolutionary Biology* **18**, 87.

344 Brykov VA, Efimov KV, Brüniche-Olsen A, DeWoody J, Bickham JW (2019) Population
345 structure of Sakhalin gray whales (*Eschrichtius robustus*) revealed by DNA sequences of
346 four mtDNA genes. *Special Publications Museum of Texas Tech University* **71**.

347 Carroll EL, Alderman R, Bannister JL, *et al.* (2019) Incorporating non-equilibrium dynamics
348 into demographic history inferences of a migratory marine species. *Heredity* **122**, 53-68.

349 Cooke, J.G. 2018. Abundance estimates for western North Pacific gray whales for use with
350 stock structure hypotheses of the Range-wide Review of the Population Structure and
351 Status of North Pacific gray whales. Paper SC/67b/ASI presented to the IWC Scientific
352 Committee (unpublished). 14 pp. [Available at <http://www.iwcoffice.org>]

353 Cooke, J.G., Sychenko, O., Burdin, A.M., Weller, D.W., Bradford, A.L., Lang, A.R., and
354 Brownell, R.L. Jr. 2019. Population Assessment Update for Sakhalin Gray Whales. Paper
355 SC/68A/CMP/21 presented to the IWC Scientific Committee (unpublished). 9 pp.
356 [Available at <http://www.iwcoffice.org>]

357 Coyle KO, Bluhm B, Konar B, Blanchard A, Highsmith RC (2007) Amphipod prey of gray
358 whales in the northern Bering Sea: comparison of biomass and distribution between the
359 1980s and 2002–2003. *Deep Sea Research Part II: Topical Studies in Oceanography* **54**,
360 2906-2918.

361 DeWoody JA, Fernandez NB, Brüniche-Olsen A, *et al.* (2017) Characterization of the gray
362 whale *Eschrichtius robustus* genome and a genotyping array based on single-
363 nucleotide polymorphisms in candidate genes. *Biol Bull* **232**, 186-197.

364 Dierckxsens N, Mardulyn P, Smits G (2016) NOVOPlasty: de novo assembly of organelle
365 genomes from whole genome data. *Nucleic Acids Research* **45**, e18-e18.

366 Doney SC, Ruckelshaus M, Duffy JE, *et al.* (2012) Climate Change Impacts on Marine
367 Ecosystems. *Annual Review of Marine Science* **4**, 11-37.

368 Drummond A (2008) Reconstructing evolutionary bottlecks using the coalescent.

369 Drummond AJ, Bouckaert RR (2015) *Bayesian evolutionary analysis with BEAST* Cambridge
370 University Press, Cambridge.

371 Durban JW, Weller DW, Perryman WL (2017) Gray whale abundance estimates from shore-
372 based counts off California in 2014/2015 and 2015/2016. . 4.pp.

373 Excoffier L, Foll M (2011) fastsimcoal: a continuous-time coalescent simulator of genomic
374 diversity under arbitrarily complex evolutionary scenarios. *Bioinformatics* **27**, 1332-
375 1334.

376 FitzSimmons NN, Limpus CJ, Norman JA, *et al.* (1997) Philopatry of male marine turtles
377 inferred from mitochondrial DNA markers. *Proceedings of the National Academy of*
378 *Sciences* **94**, 8912-8917.

379 Fu Y-X (1997) Statistical tests of neutrality of mutations against population growth, hitchhiking
380 and background selection. *Genetics* **147**, 915-925.

381 Gailey G, Sychenko O, Tyurneva O, *et al.* (2020) Effects of sea ice on growth rates of an
382 endangered population of gray whales. *Scientific Reports* **10**, 1-8.

383 Guindon S, Dufayard J-F, Lefort V, *et al.* (2010) New algorithms and methods to estimate
384 maximum-likelihood phylogenies: assessing the performance of PhyML 3.0. *Systematic*
385 *Biology* **59**, 307-321.

386 Heller R, Brüniche-Olsen A, Siegismund HR (2012) Cape buffalo mitogenomics reveals a
387 Holocene shift in the African human-megafauna dynamics. *Molecular Ecology* **21**, 3947-
388 3959.

389 Heller R, Chikhi L, Siegismund HR (2013) The confounding effect of population structure on
390 Bayesian skyline plot inferences of demographic history. *Plos One* **8**, e62992.

391 Heppell SS, Caswell H, Crowder LB (2000) Life histories and elasticity patterns: perturbation
392 analysis for species with minimal demographic data. *Ecology* **81**, 654-665.

393 Ho SY, Lanfear R (2010) Improved characterisation of among-lineage rate variation in cetacean
394 mitogenomes using codon-partitioned relaxed clocks. *Mitochondrial DNA* **21**, 138-146.

395 IUCN (2018) *The IUCN Red List of Threatened Species*. <http://www.iucnredlist.org>

396 Jackson JBC (2008) Ecological extinction and evolution in the brave new ocean. *Proceedings of*
397 *the National Academy of Sciences* **105**, 11458-11465.

398 Kaschner K, Tittensor DP, Ready J, Gerrodette T, Worm B (2011) Current and Future Patterns
399 of Global Marine Mammal Biodiversity. *Plos One* **6**, e19653.

400 Katoh K, Standley DM (2013) MAFFT multiple sequence alignment software version 7:
401 Improvements in performance and usability. *Molecular Biology and Evolution* **30**, 772-
402 780.

403 Lanfear R, Frandsen PB, Wright AM, Senfeld T, Calcott B (2017) PartitionFinder 2: New
404 methods for selecting partitioned models of evolution for molecular and morphological
405 phylogenetic analyses. *Molecular Biology and Evolution* **34**, 772-773.

406 Lang AR, Weller DW, Leduc RG, Burdin AM, Brownell Jr RL (2010) Genetic differentiation
407 between western and eastern (*Eschrichtius robustus*) gray whale populations using
408 microsatellite markers. **139**, 1-18.

409 LeDuc RG, Weller DW, Hyde J, *et al.* (2002) Genetic differences between western and eastern
410 gray whales (*Eschrichtius robustus*). *Journal of Cetacean Research and Management* **4**,
411 1-5.

412 Leigh JW, Bryant D (2015) popart: full-feature software for haplotype network construction.
413 *Methods in Ecology and Evolution* **6**, 1110-1116.

414 Leonard JA (2008) Ancient DNA applications for wildlife conservation. *Molecular Ecology* **17**,
415 4186-4196.

416 Librado P, Rozas J (2009) DnaSP v5: a software for comprehensive analysis of DNA
417 polymorphism data. *Bioinformatics* **25**, 1451-1452.

418 Mate BR, Ilyashenko VY, Bradford AL, *et al.* (2015) Critically endangered western gray whales
419 migrate to the eastern North Pacific. *Biology Letters* **11**.

420 Mourier T, Ho SYW, Gilbert MTP, Willerslev E, Orlando L (2012) Statistical guidelines for
421 detecting past population shifts using ancient DNA. *Molecular Biology and Evolution* **29**,
422 2241-2251.

423 Okonechnikov K, Golosova O, Fursov M, Team U (2012) Unipro UGENE: a unified
424 bioinformatics toolkit. *Bioinformatics* **28**, 1166-1167.

425 Oksanen J, Blanchet FG, Kindt R, *et al.* (2010) Vegan: community ecology package. R package
426 version 1.17-4. <http://cran.r-project.org>>. Acesso em **23**, 2010.

427 Paradis E (2010) pegas: an R package for population genetics with an integrated–modular
428 approach. *Bioinformatics* **26**, 419-420.

429 Parmesan C, Yohe G (2003) A globally coherent fingerprint of climate change impacts across
430 natural systems. *Nature* **421**, 37.

431 Pérez-Alvarez MJ, Olavarría C, Moraga R, *et al.* (2016) Historical dimensions of population
432 structure in a continuously distributed marine species: The case of the endemic Chilean
433 dolphin. *Scientific Reports* **6**, 35507.

434 Phillips CD, Gelatt TS, Patton JC, Bickham JW (2011) Phylogeography of Steller sea lions:
435 relationships among climate change, effective population size, and genetic diversity.
436 *Journal of Mammalogy* **92**, 1091-1104.

437 Rambaut A (2012) FigTree v1. 4. *Molecular evolution, phylogenetics and epidemiology*.
438 *Edinburgh, UK: University of Edinburgh, Institute of Evolutionary Biology*.

439 Rambaut A, Suchard M, Xie D, Drummond A (2016) Tracer v1.6.0,
440 <http://tree.bio.ed.ac.uk/software/tracer/>.

441 Ramp C, Delarue J, Palsbøll PJ, Sears R, Hammond PS (2015) Adapting to a Warmer Ocean—
442 Seasonal Shift of Baleen Whale Movements over Three Decades. *Plos One* **10**,
443 e0121374.

444 Reeves RR, Ewins PJ, Agbayani S, *et al.* (2014) Distribution of endemic cetaceans in relation to
445 hydrocarbon development and commercial shipping in a warming Arctic. *Marine Policy*
446 **44**, 375-389.

447 Rice DWW, Rice AADW, Wolman AA (1971) *The life history and ecology of the gray whale*
448 (*Eschrichtius robustus*) Stillwater, Okla. American Society of Mammalogists.

449 Roman J, Palumbi SR (2003) Whales Before Whaling in the North Atlantic. *Science* **301**, 508-
450 510.

451 Shapiro B, Drummond AJ, Rambaut A, *et al.* (2004) Rise and fall of the Beringian steppe bison.
452 *Science* **306**, 1561-1565.

453 Swartz SL, Taylor BL, Rugh DJ (2006) Gray whale *Eschrichtius robustus* population and stock
454 identity. *Mammal Review* **36**, 66-84.

455 Taylor BL, Chivers SJ, Larese J, Perrin WF (2007) Generation length and percent mature
456 estimates for IUCN assessments of cetaceans. *NOAA, NMFS, Southwest Fisheries*
457 *Science Center Administrative Report LJ-07-01* **21**.

458 Wheeler DL, Church DM, Federhen S, *et al.* (2003) Database resources of the National Center
459 for Biotechnology. *Nucleic Acids Research* **31**, 28-33.

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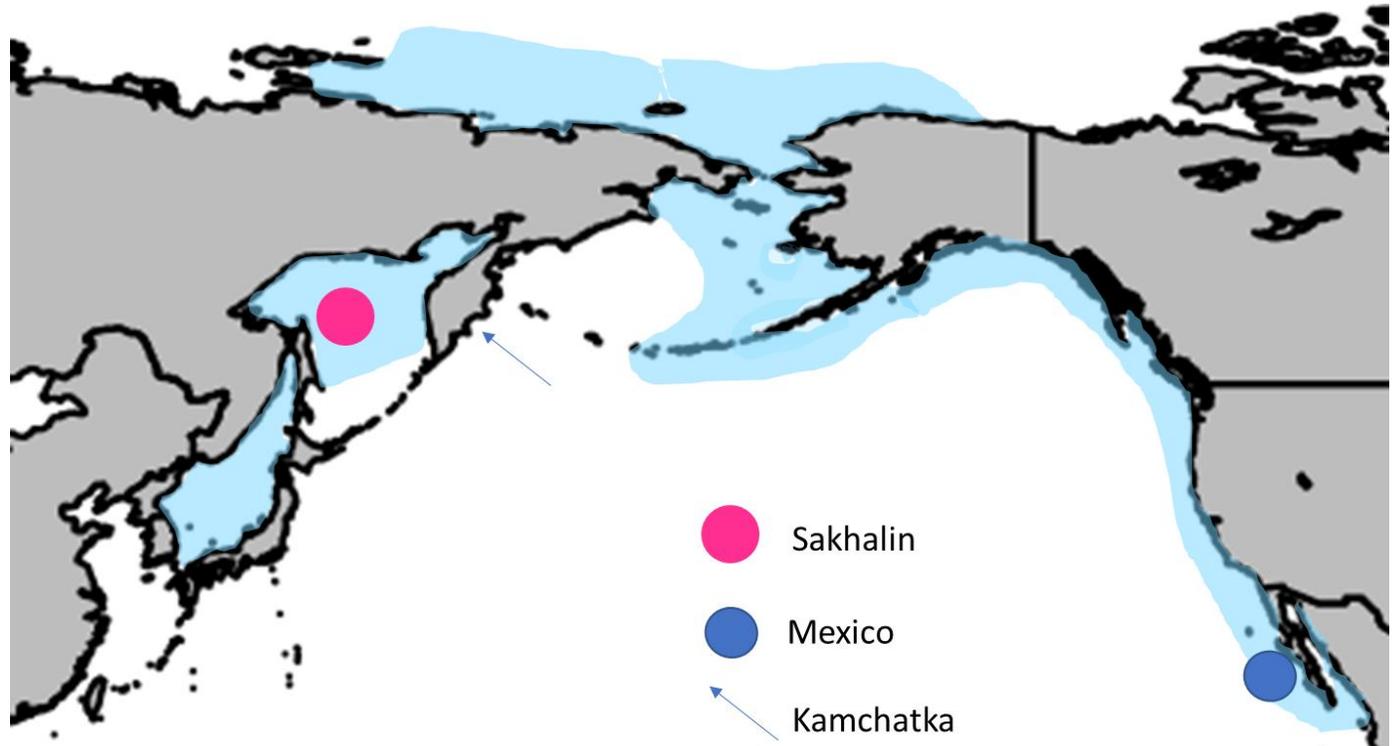
462 **Table 1.** Genetic diversity statistics for eastern and western gray whales. Number of samples (n),
 463 observed number of haplotypes (h), haplotype diversity (h_d), number of segregating sites (S),
 464 nucleotide diversity (π), and average number of nucleotide differences between two sequences
 465 (k). Demographic change measured Fu and Li's coalescent-based estimators D^* and F^*
 466

Population	n	S	h	h_d	π	k	D^*	F^*
Eastern	36	176	25	0.975	0.0018	30.1	0.00	-0.47
Western	38	120	9	0.723	0.0025	40.3	0.71	1.19
Combined	74	188	31	0.896	0.0023	37.4	-0.89	-0.69

467 None of the demographic tests were significant at $p = 0.05$.

$T_{\text{bottleneck}}$	300 years	16 generations
μ	$4.0 \times 10^{-8} \text{ bp}^{-1} \text{ year}^{-1}$	$7.6 \times 10^{-7} \text{ bp}^{-1} \text{ gen}^{-1}$

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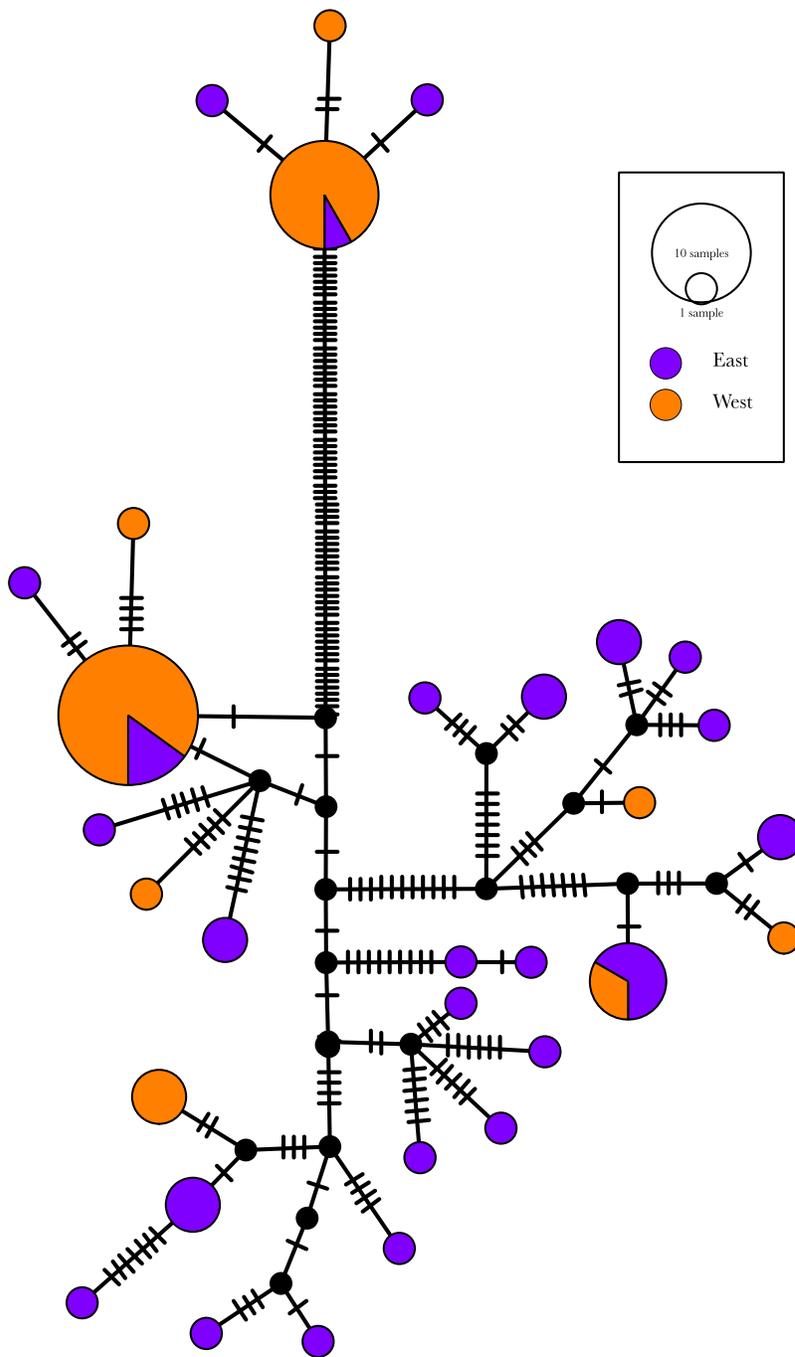


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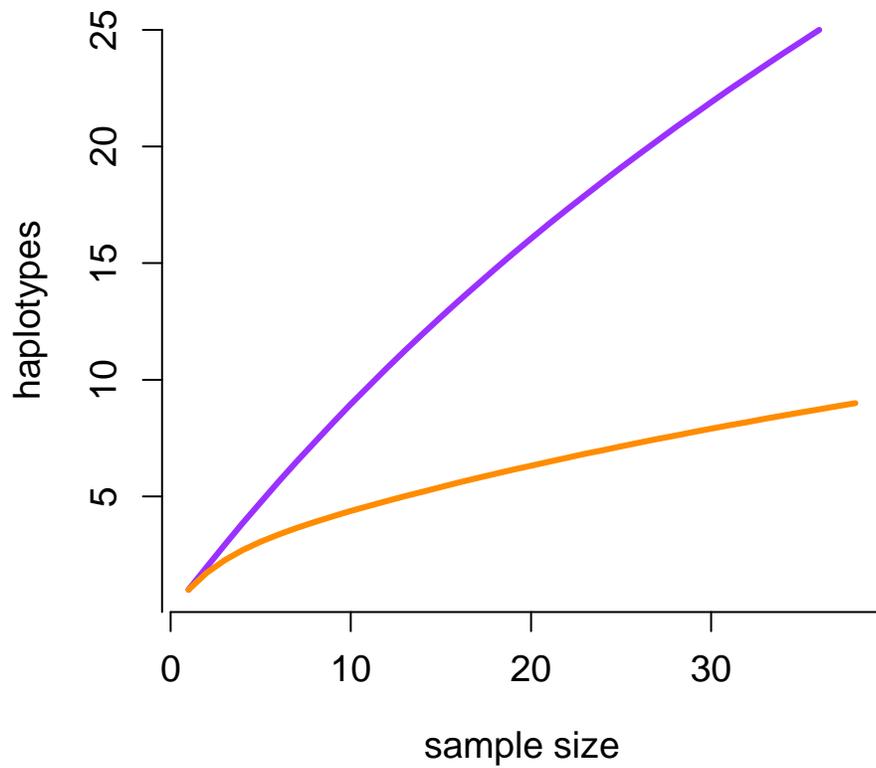
471 **Figure 1.** Figure 1.—Map of the North Pacific Ocean showing the range of gray whales (light
 472 blue) and the location of the Sakhalin (red) and Mexico (dark blue) sampling localities. The
 473 location of the Kamchatka population is denoted with an arrow.

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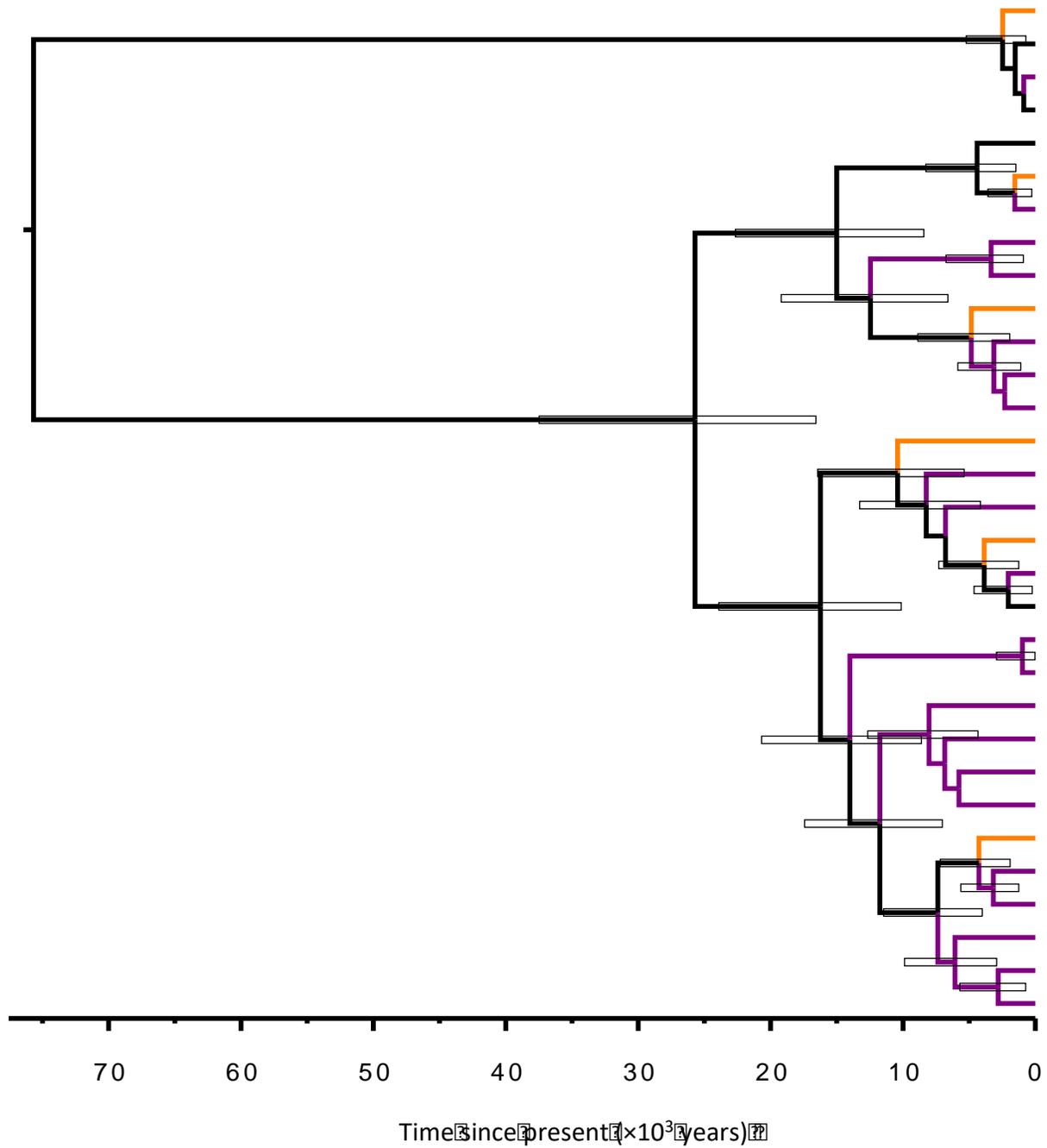
476 **Figure 2.** Haplotype network among the complete and the 16,414bp mitogenome. Breaks on the
 477 branches represent substitutions and the individual haplotype pie charts are scaled by the number
 478 of individuals with a given haplotypes. The top haplotype branch is separated by 79
 479 substitutions.



480

481 **Figure 3.** Rarefaction curves showing the number of haplotypes as a function of the number of

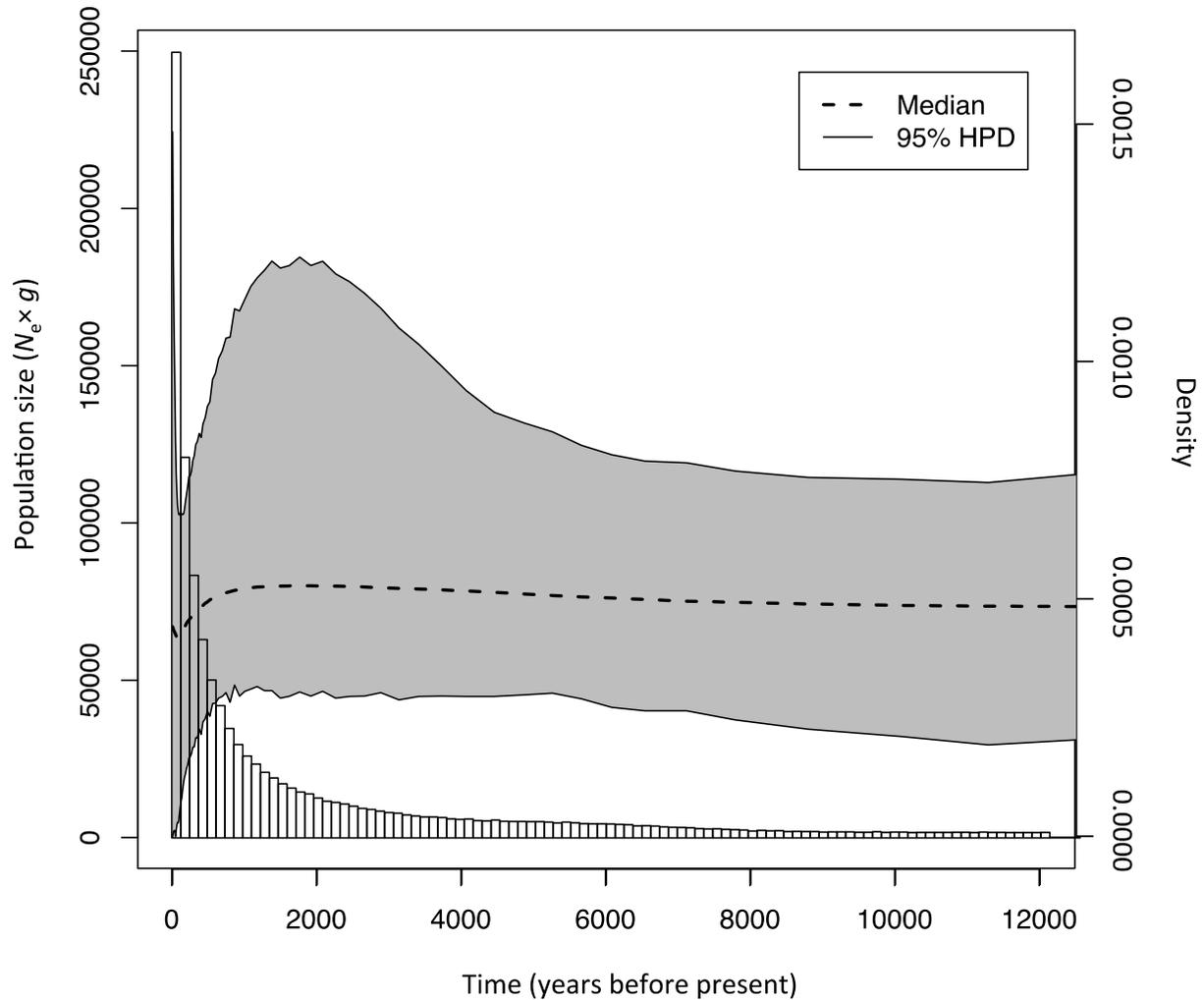
482 sampled individuals for the eastern (purple) and western (orange) gray whale samples.



483

484

485 **Figure 4.** Time-calibrated phylogeny of the 31 unique mitogenome haplotypes. Lineage colors
 486 indicate whether a given haplotype is unique to the eastern (purple), western (orange) or shared
 487 between the two sampling locale (black). Scale bar represent 95% highest posterior density
 488 (HPD) for divergence estimates.



489

490 **Figure 5.** Extended Bayesian skyline plot for the gray whales. Plotted is the time scale in years
 491 before present. The dashed line represent the median population size and the gray area the 95%
 492 highest posterior density (HPD). Population size is given as the product of the female effective
 493 population size (N_e) and the generation time (g), the latter which for gray whales is 18.9 years.
 494 The histogram shows the density of tree events per time slice.