

1	Co-evolution of cerebral and cerebellar expansion in cetaceans
2	
3	Authors: Amandine Sophie Muller ¹ and Stephen Montgomery ^{1,2,*}
4	
5	Affiliations:
6	¹ Dept of Zoology, University of Cambridge, Downing Street, Cambridge CB2 3EJ
7	² School of Biological Sciences, University of Bristol, Bristol BS8 1TQ
8	
9	*Corresponding author:
10	Email: <u>s.montgomery@bristol.ac.uk</u>
11	Telephone: +44 (0)1223 336678
12	Fax: +44 (0)1223 336676
13	
14	Running title: Cetacean brain evolution
15	Keywords: brain evolution, cerebrum, cerebellum, mysticetes, odontocetes
16	
17	
17	
18	
19	
20	
21	
22	
22	
23	
24	
27	
25	
26	
07	
27	

28 Abstract

Cetaceans possess brains that rank among the largest to have ever evolved, either in terms of absolute mass or relative to body size. Cetaceans have evolved these huge brains under relatively unique environmental conditions, making them a fascinating case study to investigate the constraints and selection pressures that shape how brains evolve. Indeed, cetaceans have some unusual neuroanatomical features, including a thin but highly folded cerebrum with low cortical neuron density, as well as many structural adaptations associated with acoustic communication. Previous reports also suggest that at least some cetaceans have an expanded cerebellum, a brain structure with wide-ranging functions in adaptive filtering of sensory information, the control of motor actions, and cognition. Here, we report that, relative to the size of the rest of the brain, both the cerebrum and cerebellum are dramatically enlarged in cetaceans and show evidence of co-evolution, a pattern of brain evolution that is convergent with primates. However, we also highlight several branches where cortico-cerebellar co-evolution may be partially decoupled, suggesting these structures can respond to independent selection pressures. Across cetaceans, we find no evidence of a simple linear relationship between either cerebrum and cerebellum size and the complexity of social ecology or acoustic communication, but do find evidence that their expansion may be associated with dietary breadth. In addition, our results suggest that major increases in both cerebrum and cerebellum size occurred early in cetacean evolution, prior to the origin of the major extant clades, and predate the evolution of echolocation.

- **Keywords:** brain evolution, cerebrum, cerebellum, mysticetes, odontocetes

59 Introduction

60

61 Cetaceans are a remarkably diverse order, varying in size from less than 40kg to 140t (Nowak, 1999; 62 (Montgomery, 2017), but sharing a suite of derived adaptations that enable these ancestrally 63 terrestrial mammals to occupy complex social and ecological niches in an obligatory aquatic 64 environment. One such trait that has attracted particular attention, but remains relatively poorly 65 understood, is a massively expanded brain. Cetaceans include species with the largest brain masses 66 to have ever evolved (Ridgway & Hanson, 2014), and, until the emergence of the genus Homo, the 67 most encephalised lineages on earth (Montgomery et al., 2013). The convergent trajectories of brain 68 expansion in cetaceans and primates, and their possible behavioural and cognitive significance, have 69 therefore garnered substantial interest (e.g., Marino, 1998; Marino et al., 2007).

70 However, differences in mammalian brain size can mask meaningful variation in brain 71 structure and cellular composition (e.g. Barton & Harvey, 2000; Mota & Herculano-Houzel, 2014). Cetacean brains are thought to have numerous features that deviate from general mammalian trends, 72 73 including a thin and highly laminated cortex, extreme gyrification, low neuron density but high 74 synaptic density, unique neuronal cell types, and small hippocampi that lack adult neurogenesis 75 (Breathnach, 2008; Butti et al., 2015; Eriksen & Pakkenberg, 2007; Haug, 1987; Huggenberger, 76 2008; Marino, 2002, 2007; Morgane et al. 1990; Oelschläger & Oelschläger, 2009; Patzke et al., 77 2013; Poth et al., 2005). Cetaceans also show a high degree of variation in several neural traits, 78 including cerebellar size and cerebral cytoarchitecture (Marino, 2000; Hof & Van Der Gucht, 2007; 79 Ridgway & Hanson, 2014; Ridgway et al., 2017, 2018).

80 These derived and variable neural traits make cetacean brains an informative case study in 81 understanding the constraints acting on brain structure. Brains are structured as networks of 82 functionally specialized, but highly integrated and interdependent, components. Their functional 83 properties depend on both the specialised tasks of specific brain regions and their integration. Hence, 84 the degree to which brains are able to evolve in a modular, or 'mosaic', manner has been a major, 85 long running debate in evolutionary neurobiology. One prominent model of brain evolution argues 86 that developmental coupling between brain structures limits the degree to which brain composition 87 can vary, but that these constraints ensure the functional integrity of the system is maintained as 88 brains vary in size (Finlay & Darlington, 1995; Finlay et al., 2001). This 'concerted' model is 89 supported by apparent consistency in scaling relationships between the size of individual brain 90 structures and total brain size across large phylogenetic distances (Finlay & Darlington, 1995; Finlay 91 et al., 2001; Yopak et al., 2010). However, it is challenged my a more adaptationalist model in which

92 the development and evolution of different brain regions are at least partly independent, allowing 93 selection to bring about adaptive changes in brain structure (Harvey & Krebs, 1990; Barton & 94 Harvey, 2000). These adaptations are reflected by grade-shifts in the scaling relationships of specific 95 brain regions, which indicate selective expansion that is independent of total brain size (e.g. Krebs et 96 al., 1989; Sherry et al., 1989; Barton & Harvey, 2000; Hall et al., 2013; Barton & Venditti, 2014; 97 Sukhum et al., 2018), and in evidence of co-evolution between functionally related structures that 98 persist after removing the confounding effects of total brain size (Barton & Harvey, 2000; Iwaniuk et 99 al., 2004).

100 While these models are not mutually exclusive, understanding the degree to which brain 101 structure – and presumably therefore function – is limited by development is key to several 102 evolutionary questions. In general terms, these questions are centered around how to interpret 103 allometric scaling relationships (Huxley, 1932; Gould, 1966), and the historically important debate 104 about the importance of developmental integration in channeling patterns of evolution (Gould & 105 Lewontin, 1979; Arnold, 1992; Finlay et al., 1995). In the specific case of brain evolution, it is 106 essential for understanding how behavioural specialisations are manifest in the brain, whether 107 behavioural or cognitive adaptations are a product of whole-network properties or changes in the 108 activity of specific operations in restricted brain regions (Logan et al., 2018), and for identifying the 109 extent to which the genetic architecture of brain structure is the product of selection to maintain 110 scaling relationships (Montgomery et al., 2016). Finally, given the propensity for comparisons of 111 whole brain size when testing hypotheses about the evolution of cognition (e.g. Deaner et al., 2006; 112 MacLean et al., 2014; Benson-Amram et al., 2016), it is critical to know whether or not these 113 comparisons can assume relative homogeneity in brain structure across taxonomic scales, or if they 114 are confounded by structural variance.

115 If mosaic changes in brain structure are common, direct comparisons of brain size can be 116 misleading. As such, the unique morphology of cetacean brains may complicate direct comparisons 117 with terrestrial mammals, in particular primates, where there is interest in the convergent evolution 118 of brain expansion and cognition (Marino, 2002; Marino et al., 2007). Understanding how the 119 differential expansion of individual brain components contributed to overall increases in brain size in 120 each lineage is therefore crucial for accurately interpreting the significance of the convergent 121 evolution of large brain size. One key feature of brain expansion in primates is the co-evolution and 122 coordinated expansion of the cortico-cerebellar network (Barton & Venditti, 2014; Montgomery, 123 2017; Smaers et al., 2018; Smaers & Vanier, 2019; Whiting & Barton, 2003). While these structures 124 tend to co-vary across mammals as part of a three-way relationship with the diencephalon, there 125 appears to be a stronger co-evolutionary relationship between the cerebellum and neocortex in primates (Barton & Harvey, 2000). Evidence from a range of taxa that the evolutionary trajectories
of components of this system can be decoupled (e.g. Hall et al., 2013; Barton & Venditti, 2014;
Sukhum et al., 2018), strongly suggests that the persistent correlated evolution between them reflects
an adaptive functional relationship.

In primates the expansion of cortico-cerebellar system is partly characterised by grade-shifts 130 131 in size, relative to the rest of the brain, that may be decoupled in time (Weaver et al., 2005; Barton & 132 Venditti, 2014; Miller et al., 2019). This implies some independent specialisation, in support of the 133 mosaic model of brain evolution, but also suggests that some form of constraint, imposed by the 134 functional integration of these structures, couples their evolution over phylogenetic timescales 135 (Barton & Harvey, 2000; Whiting & Barton 2003; Montgomery et al., 2016). Volumetrically, the 136 neocortex is the biggest component of this system, and has attracted by far the most attention from 137 cognitive and evolutionary neuroscientists (for critiques of this bias see Barton, 2012; Parvizi, 2009). 138 In contrast, the cerebellum has received much less attention, despite housing the majority of neurons 139 in the brain (Herculano-Houzel, 2009; Barton 2012). Mounting evidence suggests that the 140 cerebellum plays an important role in the development of typical and pathological variation in 141 human behaviour and cognition (e.g. reviewed in Sokolov et al., 2017), potentially through the 142 propagation of shared patterns of activity during learnt behaviour (Wagner et al., 2019), as well as in 143 the evolution of primate brain expansion and cognition (Barton, 2012; Barton & Venditti, 2014).

144 Given the accumulated evidence of cortico-cerebellar co-evolution and specialisation in 145 primates, a major question is whether or not the same pattern is observed during independent 146 episodes of brain expansion, such as cetaceans. Published comparative data on cetacean brain 147 structure has been limited but paint a complex picture of cerebellar evolution in particular. Several 148 early studies suggested that cetaceans have dramatically enlarged cerebella, with mysticetes having 149 larger cerebella compared to odontocetes as a percentage of total brain size (Breathnach, 2008; 150 Pilleri & Gihr, 1970). Marino (2000) also noted that relative cerebellum volume in two dolphins was 151 significantly larger than any primate. Several further studies have, however, noted extreme levels of 152 variation in cerebellum size across cetaceans, with some species having relatively small cerebella (Maseko et al., 2012; Ridgway & Hanson, 2014). Ridgway and Hanson (2014) have also mooted an 153 154 apparent cetacean-specific dissociation between the normally tight correlation between the 155 cerebellum and cerebrum. Extracting general trends from this literature is therefore difficult, 156 particularly given the relatively small number of species for which data were available.

Recently, Ridgway et al. (2017) provided a new data set of cetacean brain structure, with separate data on cerebrum and cerebellar volumes. This dataset, the result of collections made over the course of 50 years, provides brain size data for 770 individuals, of which 67 have data on both

cerebrum and cerebellum volumes. These individuals unevenly represent 18 species, which makes it by far the largest dataset available to date. Using these data, Ridgway et al. (2017, 2018) presented a wide-ranging analysis of variation in brain size, structure and growth across cetaceans. Key findings include observations of highly variable brain sizes and structure between major taxonomic groups, substantial variation in cerebellar size, as a percentage of brain volume and relative to body mass, and a derived ontogeny in which prenatal brain growth is both rapid and extended (2017, 2018). Together, these results suggest that the origin and radiation of cetaceans involved substantial shifts in the selection regimes that shape brain development and structure.

However, Ridgway et al. did not compare their dataset to other mammals or examine patterns of cerebrum and cerebellum variation relative to the rest of the brain, which may be a more appropriate allometric control. They also chose to weigh individual data points equally, regardless of the number of samples per species, and to analyse their data without phylogenetic correction. Here, we revisit their data and add complementary analyses that aim to address the following questions: i) Compared to other mammals, are cetacean cerebrum and cerebellar sizes both generally expanded relative to the rest of the brain? ii) If so, do they show coordinated patterns of variation, providing evidence of cortico-cerebellar co-evolution in cetaceans? iii) Does coordinated expansion preclude independent evolution? And iv) When did these increases in size occur, and do they explain key shifts in brain size and behaviour?

191 Methods

192

193 Phenotypic and phylogenetic data

We obtained data on cerebral cortex (CX), cerebellar (CB), and whole brain mass from Ridgway et 194 195 al. (2017) for 18 cetacean species, calculating mean masses where data for multiple individuals were 196 available. 'Rest of brain size' (RoB) was calculated by subtracting CX and CB from total brain 197 volume. One species, Megaptera novaeangliae, was subsequently excluded from the dataset as CX 198 and CB equalled total brain mass, suggesting one or both included additional structures. Component 199 volume data for CX, CB and RoB for an additional 124 terrestrial mammals were taken from Carlisle 200 et al. (2017) and Stephan et al. (1981). We excluded olfactory bulbs from RoB volumes because the 201 olfactory system is absent or greatly reduced in odontocetes (Oelschäger & Oelschäger, 2008), 202 which, when compared to other mammals, could give the appearance of reduced RoB volumes 203 relative to CB or CX volume. In theory, this could lead to a false signature of increased relative CB 204 and CX size in cetaceans. The olfactory neuropil are still present mysticetes (Thewissen et al., 2011) 205 but the available data are limited, prohibiting their exclusion in these species. However, in mysticetes 206 the olfactory bulbs are proportionally quite small (~0.13% brain volume; Thewissen et al., 2011) so 207 we consider their influence to have a negligible effect on our analyses. Given the small scale of 208 deviation from isometric scaling between brain mass and volume, relative to measurement error 209 (Isler et al., 2008), we also assume mass and volume are equivalent. Body mass was taken from the 210 same source, with additional data from Jones et al. (2009) where data were missing. All brain and 211 body data are available in Table S1A.

212 Phylogenetic trees for the included species were taken from two sources. For the analyses 213 across mammals we use the dated supertree produced by Bininda-Emonds et al. (2007). However, 214 the topology for cetaceans in this tree is poorly resolved. We therefore conducted cetacean-only 215 analyses using McGowen et al.'s (2009) dated phylogeny, and spliced this tree into the mammalian 216 supertree, re-scaling branch lengths according to the ratio of divergence dates between the last 217 common ancestor of Whippormorpha in the two trees (Figure 1A,B). Trees were visualised using 218 FigTree v1.4.3 (http://tree.bio.ed.ac.uk/software/figtree/). The spliced nexus tree is provided in the 219 supplementary material.

220

221 *Phylogenetic regressions*

The core phylogenetic analyses were performed in BayesTraits (Meade & Pagel, 2016; available at www.evolution.rdg.ac.uk/BayesTraitsV3.0.1/BayesTraitsV3.0.1.html), using log₁₀-transformed 224 species means. We first performed a series of phylogenetic *t*-tests using Phylogenetic Generalised 225 Least Squares (PGLS) in a Maximum Likelihood (ML) framework (Organ et al., 2007) to examine 226 variation in the size of each brain component between cetaceans and i) all available terrestrial 227 mammals, ii) terrestrial placental mammals, iii) just primates, iv) non-primate placentals. This was 228 repeated for CX and CB volume, including RoB volume as an independent variable to examine shifts 229 in relative component size. A final mammal-wide regression was performed to examine taxonomic 230 differences in CX~CB scaling. For each ML analysis, we performed 1,000 iterations and ran the 231 model with lambda, which measures phylogenetic signal, fixed to 1 and again with lambda freely 232 estimated. The fit of these models were compared using a Likelihood Ratio Test (Tables S2-5, S6). 233 We examined CX~RoB, CB~RoB, and CX~CB scaling within cetaceans using the same methods. In 234 general lambda was not significantly different from one and, where it was, it remained high. However, using PMC (Boettiger et al., 2012), we found that within cetaceans our power to 235 236 accurately estimate lambda was reduced due to the smaller sample size, increasing uncertainty over 237 the accuracy of these model comparisons (Supplementary Information). As the results are consistent 238 regardless of whether or not lambda is estimated freely, we report the full results for both sets of 239 models in the Supplementary Information, but focus on the models with lambda fixed to 1 in the 240 main text.

241 In addition, we used phylogenetic mixed models implemented in MCMCglmm (Hadfield, 242 2010) to test whether results found within cetaceans are consistent when individual level data is used 243 rather than species means. MCMCglmm controls for phylogenetic non-independence by including a 244 covariance matrix extracted from a given phylogenetic tree as a random factor in the model. All 245 MCMCglmm analyses were performed using a Gaussian distribution with uninformative, parameter 246 expanded priors for the random effect (G: V=1,n n =1, alpha.n = 0, alpha.V= 1,000; R: V=1, n 247 =0.002) and default priors for the fixed effects. We report the posterior mean (P-mean) of the 248 cofactor included in each model and its 95% confidence intervals (CIs), and the probability that the 249 parameter value is different to 0 (P_{MCMC}).

250

251 Rate heterogeneity

We implemented the variable rates (VR) model in BayesTraits (Baker et al., 2015; Venditti et al., 2011) to explore the distribution of rate heterogeneity in CX and CB evolution across the cetacean phylogeny. The VR model allows the rate parameter (σ) of a Brownian motion model to vary across individual branches or clades. A major advantage of this model is that it requires no *a priori* hypotheses about where rate shifts occur in a phylogeny, and instead uses a Bayesian Markov chain Monte Carlo reversible-jump procedure to optimise rate parameters across the tree (Baker et al., 2015; Venditti et al., 2011). This is suitable for our present analyses because we are interested about
the presence of rate heterogeneity *per se*, and whether or not shifts in the rate of brain components
are co-incident, rather than in testing specific hypotheses about when or why these shifts occur.

We applied the VR model to CX and CB with RoB included as an independent variable in 261 262 each case to permit an assessment of whether there is rate heterogeneity for CX and CB evolution 263 after accounting for variation in RoB. We also performed an analysis with CX or CB included as the 264 dependent variable in models with the other component included as an independent variable to 265 confirm whether or not these traits can evolve independently. Due to the relatively small sample size 266 it is not possible to implement this model using only the cetacean dataset. The models were therefore 267 run on the full mammal dataset, and the findings therefore apply to mammals in general and are not 268 specific to cetaceans. However, evidence of rate heterogeneity within cetaceans can be inferred from 269 the branch/clade-specific scalars applied to branches within this order. The models were run for 270 100,000,000 iterations, sampling every 100,000 iterations after a burn in of 100,000,000 iterations. 271 Marginal likelihoods (MLh) were calculated using the stepping-stone sample, sampling every 272 100,000 iterations. Marginal likelihoods of the VR model were compared to the null model, in which 273 σ cannot vary across the phylogeny, by calculating a log(Bayes Factor) (BF) as:

274

275 BF = 2[logMLh(variable rates model) - logMLh(null model)]

276

277 BFs of 5-10 indicates 'strong support' for the VR model and BFs >10 indicate 'very strong' support. 278 The VR logfile was processed using the online post processor tool (available at 279 www.evolution.reading.ac.uk/VarRatesWebPP), to extract branch lengths scaled according to their 280 mean/median rate of evolution. These were then plotted against raw branch lengths to highlight 281 periods of high CX/CB evolution (Barton & Venditti, 2014). Linear regressions between sets of 282 scaled branch lengths were performed in R (R Core Team, 2014) using the lm() function. 283 Comparisons among models were performed using Akaike Information Criterion (AIC: calculated as 284 $(2 \times \text{number of parameters}) - (2 \times \log[\text{likelihood}]))$ to identify the best supported model, where a 285 lower value indicates a better fitting model, and a difference between models greater than two 286 suggests a substantial difference (Burnham and Anderson 2002).

287

288 Ecological associations

Social complexity has long been seen as a potential explanation for brain expansion in cetaceans (Connor et al., 1998; Marino 2002; 2007; Marino et al., 2007), and has recently been supported by an

291	analysis of social repertoire size (Fox et al., 2017). As an initial test of whether social ecology is
292	driving relative CX and/or CB expansion we obtained data on social group and repertoire size from
293	Fox et al. (2017) and performed a PGLS regression between CX or CB with each social trait,
294	controlling for RoB size. We also repeated these analyses using diet breadth and latitude range (also
295	from Fox et al., 2017) as a proxy for environmental heterogeneity, maximum dive time and two tonal
296	traits, tonal range and tonal complexity (number of inflection points). Data on dive time were taken
297	from Marino et al. (2006), with additional and updated data from further studies (Argüelles et al.,
298	2016; Barlow et al., 1997; Ishii et al., 2017; Krutzikowsky & Mate, 2000; Miller et al., 2010;
299	Minamikawa et al., 2013; Silva et al., 2016). Tonal data was taken from May-Collado et al. (2007).
300	All traits are continuous variables except for diet breadth which was coded by Fox et al. (2017) into
301	4 categorical groups. Data are presented in Table S1B. All analyses we performed using ML in
302	BayesTraits with 1,000 iterations. The models were performed with lambda fixed to 1 and freely
303	estimated (Table S6), but due to the relatively small sample size we favour the more conservative
304	models where lambda is fixed (see Supplementary Information). All trait data has been deposited on
305	Data Dryad (doi:10.5061/dryad.rm4368f)
306	
307	
308	
309	
310	
311	
312	
313	
314	
315	
316	
317	
318	
319	
320	
321	
322	
222	
525	

324 **Results**

325

326 Both the cerebrum and cerebellum are expanded in cetaceans

All brain components are larger in cetaceans than other mammals (CX: $t_{141} = 3.853$, p < 0.001; CB: 327 $t_{141} = 3.814$, p < 0.001), but only narrowly so for RoB ($t_{141} = 2.592$, p = 0.042). The scaling 328 329 relationship between the CX and RoB is significantly different in cetaceans compared to other mammals ($t_{141} = 6.240$, p < 0.001). This is also the case between CB and RoB ($t_{141} = 5.749$, p < 330 331 0.001). In both cases the effect is a grade-shift toward larger component volumes than predicted by 332 the terrestrial mammalian scaling relationship with RoB (Figure 1C,D). However, the scaling 333 relationship between CX and CB is consistent between cetaceans and terrestrial mammals (t_{141} = 334 0.549, p = 0.585; Figure 1E). The same results are obtained regardless of whether cetaceans are 335 compared to all terrestrial mammals, only placental terrestrial mammals, only primates or only non-336 primates (Table S2, S3).

337

338 The cerebrum and cerebellum co-evolve in cetaceans, but exceptions occur

339 Consistent with the comparisons between cetaceans and terrestrial mammals, within cetaceans there is a significant association between CX and CB volume after correcting for RoB volume ($t_{13} = 4.453$, 340 341 p < 0.001). We confirmed this result, which is based on species means, using all individual-level data 342 while controlling for species identity (P-mean = 0.653, 95% CI: 0.446-0.834, pMCMC < 0.001). We 343 also find a potential shift in this relationship between mysticetes and odontocetes ($t_{13} = -3.749$, p = 344 0.002; Figure 2A), although the data for mysticetes is very limited (n=3) so this result should be 345 revisited. To further explore these data we calculated the residual variance around a regression 346 between CX volume and RoB and plotted them against the residual variance around a regression 347 between CB volume size RoB. A non-phylogenetic regression between these phylogenetically-348 corrected residuals is only significant when P. macrocephalus is removed (present $t_{15}=1.741$, p = 349 0.102; removed $t_{14}=3.238$, p = 0.006; Figure 2A), after which there is again a significant shift between suborders ($t_{12} = -4.596$, p < 0.001). Plotting the individual data also highlights the two 350 351 *Physeter* individuals as outliers to the CB~CX scaling relationship (Figure 2B). This suggests that 352 there is a potential deviation in CB~CX scaling between mysticetes and odontocetes, and highlights 353 specific lineages where the association between the expansion of both the CX and CB is relaxed, 354 most notably in *P. macrocephalus* (Figure 2A). In contrast to previous studies (Ridgway et al., 2017) 355 we do not find robust support for shifts in component scaling within odontocetes (Table S4), 356 however, this analysis is again limited by sample size.

357

358 Rate heterogeneity in the evolution of cerebrum and cerebellum size

We next applied a variable rates (VR) model to both CX and CB, while controlling for RoB volume, using the full mammalian dataset. In both cases the VR model was supported over a single-rate Brownian motion model (CX, BF = 25.082; CB, BF = 19.489; Table S5), providing 'very strong' evidence for significant variation in the evolutionary rate of both components that is independent of RoB volume, implying a degree of independent evolution between brain components. All variable rate models included branches within cetaceans that deviate from the background rate during mammalian evolution.

366 Focusing on cetaceans specifically, we plotted the *mean* scaled branch lengths against the 367 untransformed branch lengths to visualise branches with an accelerated evolutionary rate (Figure 3A-368 C). The top four branches highlighted for the CB include the branch leading to the last common 369 ancestor (LCA) of extant cetaceans, the terminal C. commersonii and O. orca branches, and the 370 branch leading to the LCA of B. mysticetus and E. australis (Figure 3A,A'). For the CX the branch 371 leading to the LCA of extant cetaceans, the terminal branches of *P. macrocephalus*, *O. orca*, and *C.* 372 commersonii are highlighted (Figure 3B,B'). However, the more conservative median scalars for 373 both components only indicate deviation for two branches for both structures, the branch leading to 374 LCA of extant cetaceans and the terminal C. commersonii branch.

We next repeated the variable rates test using CX mass whilst controlling for CB volume (and vice versa, where the results obtained were highly similar, Table S5). Again, the variable rate model was supported over a single-rate Brownian motion model (BF = 28.635), suggesting that despite their tendency to co-evolve, these components have also varied independently through time. Plotting the within-cetacean *mean* scaled branch lengths for the CX and CB VR models highlights several branches with higher evolutionary rates for CX or CB (Figure 2C,C'). However, the *median* scalars only indicated deviation for the branch leading to LCA of extant cetaceans.

382

383 Expansion of the cerebrum and cerebellum both contribute to variation in brain expansion

To explore whether increases in relative CX or CB mass drive brain expansion in cetaceans we repeated the VR analysis on brain size, while controlling for body mass, across all mammals. Again, the VR model is supported over a constant-rate model (BF = 25.467) indicating significant rate heterogeneity in the evolution of mammalian brain size when correcting for body mass. Within cetaceans, the mean scalars of each branch (indicating variation in σ) for body corrected brain size are not significantly associated with the mean scalars for either CX (t₃₀ = 1.208, p = 0.237) or CB (t₃₀ = 1.0885, p = 0.287) (Figure 4). However, this could reflect the dominant effect of body mass on 391 variation in relative brain size in cetaceans (Montgomery et al., 2013). Indeed, across cetaceans the 392 size of the CB ($t_9 = 18.853$, p < 0.001) and CX ($t_9 = 98.363$, p < 0.001) are significantly associated 393 with whole brain size, after accounting for RoB volume, but body mass is not $(t_9 = 2.200, p =$ 394 0.055). Removing body mass from the model also significantly improves the fit ($\Delta AIC = 3.944$). We 395 take this to indicate that variation in the relative size of the CB and CX are associated with variation 396 in whole brain size. A VR analysis of brain size, without controlling for body mass, does not support 397 significant rate heterogeneity across mammals (BF = -0.326), precluding a reliable test of whether or 398 not changes in CB, CX and whole brain size occur co-incidentally in cetaceans.

399

400 A preliminary assessment of ecological traits driving cortical and cerebellar expansion

401 Finally, we explored the relationship between the relative size of both components and key 402 ecological variables. We first focused on social ecology, which has often been invoked to explain 403 cetacean brain expansion. We found no evidence of the predicted *positive* linear association between 404 either CX mass and either social repertoire size ($t_{13} = -0.525$, p = 0.608) or social group size ($t_{13} = -$ 405 1.734, p = 0.107), while controlling for RoB mass. This prediction is also not met for CB, where we 406 find no association between CB mass and social repertoire size ($t_{13} = 0.480$, p = 0.639) and a weak 407 *negative* association with social group size ($t_{13} = -3.033$, p = 0.010). Similar results were found when 408 CX, CB and RoB were analysed in a single multiple regression (Table S5). In the latter case there is 409 a suggestion of an association between social group size and RoB ($t_{11} = 2.594$, p = 0.022). We 410 repeated these analyses with whole brain and body mass and again found no significant association 411 with either social trait (Table S6).

412 Finally, we also explored the relationship between CB and CX size and diet breadth, latitude 413 range, maximum dive time, and tonal complexity (Table S6). We found only one trait with evidence 414 of an association between either brain component; both CB ($t_{13} = 2.574$, p = 0.023) and CX ($t_{13} =$ 415 2.967, p = 0.011) show evidence of a positive association with diet breadth. These results are 416 however vulnerable to correction for multiple tests and should be treated as preliminary. However, 417 both associations were also present when the number of dietary categories was reduced to 3, as only 418 one species in the original dataset was assigned to category 4 (CB $t_{13} = 2.484$, p = 0.027; CX $t_{13} =$ 419 2.374, p = 0.034).

- 420
- 421
- 422
- 423

424 **Discussion**

425

426 Compared to most other extant mammals, cetaceans have evolved under dramatically different 427 selection regimes. Comparisons between cetacean brains and those of terrestrial mammals suggest 428 that this included changes in the selection pressures and constraints that shape how brains evolve. 429 Using the largest available dataset on cetacean brain components, together with comparable data 430 from terrestrial mammals, we revisited key questions about cetacean brain evolution. Despite several 431 unique features (highlighted above), we confirm that cetacean brain expansion shares a common 432 dependency on cortico-cerebellar expansion with terrestrial mammals, in particular primates (Barton 433 & Harvey, 2000; Herculano-houzel & Sherwood, 2010; Whiting & Barton, 2003). Within cetaceans 434 we find evidence of coordinated cortico-cerbellar evolution at a phylogenetic scale (Maseko et al., 435 2012; Montgomery, 2017; Ridgway et al., 2017; Smaers et al., 2018), but also evidence that suggests 436 the capacity for independent changes in the size of each component. We tested three common 437 hypotheses that seek to explain the behavioural relevance of larger cerebrums or cerebella in 438 cetaceans, and provide preliminary evidence of a importance of diet breadth, a proxy of the diversity 439 of prey types. Below, we discuss each of these results in further detail.

440 We found robust evidence that both the CB and CX are expanded in cetaceans relative to the 441 rest of the brain, but also find a general pattern of co-evolution between them. However, this 442 phylogenetic co-ordination appears to mask a more flexible relationship. This is indicated by 443 significant rate heterogeneity in CX/CB volume across mammals, after accounting for their co-444 variation with each other or with RoB, and by individual branches showing evidence of higher rates 445 of change in one structure or the other. We interpret this pattern as indicating a combination of 446 distinct and shared selection pressures acting on the CX and CB, with the presence of some form of 447 functional constraint that limits the extent to which one structure can diverge without reciprocal 448 changes in the other (see Montgomery, et al., 2016 for further discussion). This functional 449 dependence is consistent with known patterns of connectivity (Ramnani, 2006), coordinated activity 450 (Wagner et al., 2019), and evidence from other mammals, particular humans, that the coordinated 451 action of the cortico-cerebellar system is important for many behaviours (Barton, 2012; Parvizi, 452 2009; Sokolov et al., 2017).

An alternative explanation for the apparent co-evolution of brain components argues instead that the evolution of brain structure is constrained by shared developmental programs that couple component size to whole brain size (c.f. Finlay & Darlington, 1995; Finlay et al., 2001). One predicted pattern of a strictly concerted model of brain evolution is that structures that develop late in 457 a neurogenic time course, such as the cerebrum and cerebellum, are more prone to disproportionate 458 expansion ('late equals large' Finlay et al., 2001; Finlay & Brodsky, 2006). This hypothesis is 459 strongly debated (Weisbecker 2009), and nevertheless cannot explain our results as it argues that 460 disproportionate expansion is caused by conserved allometric scaling across groups and 461 hyperallometric scaling exponents. Our results instead provide two pieces of evidence that suggest 462 that cetacean brain structure provides a clear counter example to a general prevalence of overarching 463 developmental constraints on brain structure (c.f. Marino et al., 2000). First, major grade-shifts are 464 observed in the size of both the cerebrum and cerebellum relative to the rest of the brain; hence, their 465 increase in relative size is not due to conserved hyperallometric scaling. Second, across mammals in 466 general, and among cetaceans, there is further evidence of independent evolution of both structures. 467 Our results are therefore consistent with a 'mosaic' model of brain evolution (Barton & Harvey, 468 2000), and data from molecular studies in other vertebrates that suggest selection may act on 469 independent sets of genes and developmental pathways that control the size of each brain component 470 (e.g. Noreikiene et al., 2015; Harrison & Montgomery, 2017; Montgomery et al., 2016).

471 The question that follows, of course, is what is the behavioural relevance of these expanded 472 brain regions? Here, we focused on three hypotheses that seek to explain at least some variance in 473 overall brain size, and test whether they explain variation in either relative cerebrum or cerebellum 474 size. First, we sought to test whether variation in CB/CX size is explained by variation in social 475 ecology. The social complexity of extant cetaceans is well recognised, and includes evidence of 476 cooperative behavior, social transmission of behavior, and dynamic social structures (Connor, 2007; 477 Marino et al., 2007). Although the social complexity of odontocetes is often emphasized, many of 478 these behaviours are also observed in mysticetes (Marino, 2007; Simmonds, 2006; Whitehead, 479 2011). Several authors have suggested increases in cetacean brain size could be explained by 480 selection associated with social cognition (Connor et al., 1998; Marino, 2002; Shultz & Dunbar, 481 2010), however, evidential data has been limited. Recently Fox et al. (2017) reported an association 482 between cetacean group size, a composite measure of social repertoire size and brain size (absolute 483 and body-size corrected). We revisited these data to test whether or not group or social repertoire size has a simple linear relationship with CB or CX size, independently of RoB. We found no 484 485 support for this hypothesis.

A major component of cetacean social ecology is acoustic communication. The importance of auditory information arguably further increased in odontocetes following the evolution of echolocation. Indeed brain structure in cetaceans has clearly evolved to support perception and processing of auditory information (Marino, 2007; Marino et al., 2002; Ridgway, 2000). Cerebellar expansion is also shared among mammals with pronounced auditory adaptations, including 491 echolocating bats and cetaceans, and elephants, which utilise long distance infrasonic vocalisations 492 (Hanson et al., 2013; Maseko et al., 2012; Paulin, 1993). Indeed, neural activity in the cerebellum 493 has been linked to the processing of acoustic signals (e.g. Baumann & Mattingley, 2010; Jen & 494 Schlegel, 1980; Singla, et al., 2017), and is consistent with the role of this brain structure as an 495 adaptive filter that tracks patterns of predicted and observed sensory input (Marino et al., 2002; 496 Paulin, 1993; Ridgway, 2000). We therefore next explored whether vocal repertoire (measured as 497 tonal range and tonal complexity; May-Collado et al., 2007) was associated with CB or CX mass. 498 Again, we found no significant association with either brain structure. Across social and tonal traits 499 the closest result to a nominal significance threshold of 0.05 was between RoB and group size, which 500 could suggest a potential association between social behavior and an expanded midbrain, which 501 includes several auditory structures (Marino, 2007). However, this trend was weaker for tonal traits.

502 The third hypothesis we explored is that cetacean brain composition is largely shaped by 503 foraging behavior. When discussing the striking differences between Orcinus and Physeter 504 cerebellar sizes, Ridgway and Hanson (Ridgway & Hanson, 2014) suggested that either reduced 505 visual processing or prolonged periods of oxygen depletion during deep water diving might limit 506 investment in *Physeter* cerebellar neuron number (see also Marino et al., 2006). Indeed, our analysis 507 supports the contention that *Physeter* has a unique brain composition among cetaceans, with an 508 expanded CX but relatively small CB (Figure 2). Although the data is limited, both individuals in our 509 dataset are adults, and have consistent brain compositions. Ridgway et al.'s (2017) original dataset 510 also includes two further individuals with data for CB but not CX size, which are again consistent 511 with the two individuals we include in the dataset. This suggests the small CB size observed for 512 *Physeter* is unlikely to be due to sampling biases or measurement error. However, while it is possible 513 that the constraints imposed by deep diving are particularly pronounced or limited to *Physeter*, we 514 find no general association between maximum dive time and relative CB/CX mass. Finally, Fox et 515 al. (2017) also reported an association between body-size corrected brain mass and two measures of 516 non-social ecological complexity, diet richness and geographic (latitudinal) range. While we found 517 no evidence of an association between geographic range and RoB-corrected CB or CX mass, we do 518 find a significant association between both RoB-corrected CB and CX size and a categorical measure 519 of dietary breadth. We stress that these results should be viewed as preliminary because they are 520 based on a relatively small dataset and we have performed tests for 7 ecological traits. However, they 521 are consistent with evidence that the behavioural challenges associated with foraging exert strong 522 selection pressures on the evolution of brain size and structure (Clutton-Brock & Harvey, 1980; 523 Barton 1998; DeCasien et al., 2017; Powell et al., 2017; Fox et al., 2019). We therefore encourage 524 further studies of the role of non-social cognitive specialisation in cetacean evolution.

525 We also acknowledge that, while we find no evidence that CB/CX expansion is driven by 526 social ecology, our dataset (n=17) is substantially smaller than Fox et al.'s (n=46) and we do not 527 replicate their findings with whole brain size using this subset of data. It is therefore possible that 528 social traits do contribute to CB/CX expansion but we do not detect its effects for various reasons. 529 First, it is possible that these null results merely reflects a combination of examining a relatively 530 small phylogenetic dataset, and the use of behavioural data that is potentially highly "noisy", 531 particularly given the challenge of collecting these data for cetaceans. In part, the limitations of the 532 data come from using proxy measures of cognition. For example, Fox et al. (2017) suggest there is a 533 non-linear relationship between group size and social complexity, and even when examining 534 measures of social organisation (aggregations/megaopods/mid-sized associations) there is significant 535 variation in social repertoire size, suggesting the full repertoire of social complexity is poorly 536 captured. Similarly, May-Collado et al.'s tonal data focuses solely on tonal sounds but broadband, 537 burst-pulsed calls also play important roles in social communication (Lammers, Au, & Herzing, 538 2003; Sørensen et al., 2018), and may support social interactions between individuals of species that 539 that don't produce tonal sounds, and which do not aggregate on the surface frequently enough to 540 accurately record social complexity (Sørensen et al., 2018). A second issue is data coverage. Despite 541 attempts to correct for biases in publication rates (Fox et al., 2017) the availability and quality of 542 data is likely in part determined by a species' ecology, and may not fully represent biologically relevant variation in behavioural traits across cetaceans. Even in large, comprehensive datasets, 543 544 variability in trait data from alternative sources can result in differing results in comparative analyses 545 (Powell et al., 2017), and this problem is likely to be more pronounced in hard to study species.

546 It is also possible that our results are influenced by different selection pressures acting on 547 CB/CX mass in different parts of the phylogeny, or reciprocally across time. Indeed, in both 548 cetaceans and terrestrial mammals no single ecological trait appears to explain variation in relative 549 brain size or structure (Barton et al., 1995; DeCasien et al., 2017; Fox et al., 2017; Powell et al., 550 2017). In a small dataset, testing interdependencies between multiple traits is unreliable, making it 551 hard to discern a full model of what drives the evolution of cetacean brain structure. However, given 552 that by far the largest shift in evolutionary rate for both the CB and CX occurred on the branch 553 leading to the last common ancestor of extant cetaceans, and that there is no pronounced shift at the 554 origin of echolocation in odontocetes, it at least seems unlikely that CB/CX expansion was primarily 555 driven by the evolution of echolocation, as has been previously suggested (Marino et al., 2000; 556 Paulin, 1993; Ridgway, 2000; S. H. Ridgway & Hanson, 2014). Changes in the internal structure of 557 the CB/CX that have been associated with echolocation (e.g. Marino et al., 2000) would therefore 558 have evolved on the back of an already expanded cortico-cerebellar system. A similar exaptation

hypothesis has been proposed to explain how expansion of the cerebellum in apes could have initially supported increased fine motor and sequential learning needed for tool use, but was later coopted and adapted to support the evolution of language in hominins (Barton, 2012).

501

562 An early origin of an expanded CB is consistent with some endocasts of early archaeoceti 563 (Edinger, 1955; Kellogg, 1936; but see Bajpal et al., 1996; Breathnach, 1955), suggesting the switch 564 to an obligate aquatic lifestyle may have itself altered the selection regimes acting on the size of 565 major brain components. Indeed, there is evidence of convergent changes in cerebellar morphology 566 between cetaceans and pinnipeds, although these are also shared by hominoid primates (Smaers et 567 al., 2018). Teasing apart which were the key selection pressures during this period is difficult, as the 568 shift to an aquatic environment likely involved major changes in sensory processing and motor 569 control, both of which have been suggested as drivers of variation in CB size (e.g. Marzban et al., 570 2011; Maseko et al., 2012; Ridgway & Hanson, 2014). We also note that likely changes in size-571 related constraints on brain expansion that are associated with aquatic weightlessness, major 572 increases in body mass (Huggenberger, 2008; Marino, 1998; Montgomery et al., 2013) and an 573 energy-rich diet (Evans et al., 2012) may have resulted in the unique brain structure and mode of 574 expansion characteristic of cetaceans (Marino, 2004). Although CB structure is thought to be widely 575 conserved (Larsell, 1967; Sultan & Glickstein, 2007), the low neuronal density, non-laminar 576 connectivity and 'cortical adjacency' of the CX (Marino, 2002; Marino, 2007) could conceivably 577 have downstream effects on CX-CB connectivity and co-evolution in cetaceans.

578 Understanding the interacting selection pressures that have produced the expanded brains of 579 cetaceans remains a daunting challenge. Given the potential for brain components to evolve 580 independently, and to reflect complex patterns of reciprocal dependencies on other brain regions and 581 with multiple ecological traits, we suggest that efforts to identify simple relationships between crude 582 traits like whole brain size, and compound traits like general cognition will have limited success. 583 Improved and more precise data for both neuroanatomical and behavioural traits is sorely needed, 584 and the collections obtained by Ridgway et al. (2017) and others represent a major contribution 585 towards this effort. Given the difficulty in obtaining comparative datasets, renewed long-term efforts 586 and increased academic cooperation will be required to provide robust behavioural data, access to 587 cetacean brain samples and imaging data, as well as tissue samples suitable for genome and 588 transcriptome sequencing.

- 589
- 590
- 591

592 Acknowledgments

We are very grateful to Sam Ridgway for discussions at the beginning of this project and for sharing data. We also thank Sam Ridgway, Stephanie King, Robert Barton, two anonymous reviewers and Alejandro Gonzalez for helpful comments on the draft manuscript. The authors declare no conflict of interest.

597

598 **References**

- Argüelles, M. B., Fazio, A., Fiorito, C., Pérez-Martínez, D., Coscarella, M., & Bertellotti, M. (2016).
 Diving behavior of southern right whales (*Eubalaena australis*) in a maritime traffic area in
 Patagonia, Argentina. *Aquatic Mammals*, 42(1), 104–108.
- 602 http://doi.org/10.1578/AM.42.1.2016.104
- Arnold, S.J. (1992). Constraints on phenotypic evolution. *The American Naturalist*, 140, S85107.https://doi.org/10.1086/285398
- Bajpal, S., Thewissen, J., & Sahni, A. (1996). *Indocetus* (Cetacea, Mammalia) endocasts from
 Kachchh (India). *Journal of Vertebrate Paleontology*, *16*, 582–584.
- 607 http://doi.org/doi.org/10.1080/02724634.1996.10011343
- Baker, J., Meade, A., Pagel, M., & Venditti, C. (2015). Positive phenotypic selection inferred from
 phylogenies. *Biological Journal of the Linnean Society*, 118(1), 95-115.
- 610 https://doi.org/10.1111/bij.12649
- 611 Barlow, J., Forney, K., Von Saunder, A., & Urban-Ramirez, J. (1997). A report of cetacean acoustic
- 612 detection and dive interval studies (CADDIS) conducted in the southern gulf of California,
- 613 1995. NOAA Technical Memorandum NMFS, (July).
- Barton, R. A. (2012). Embodied cognitive evolution and the cerebellum. *Philosophical Transactions of the Royal Society of London. Series B, Biological Sciences*, 367(1599), 2097–107.
- 616 http://doi.org/10.1098/rstb.2012.0112
- Barton, R. A., Purvis, A., & Harvey, P. H. (1995). Evolutionary radiation of visual and olfactory
 brain systems in primates, bats and insectivores. *Philosophical Transactions of the Royal*
- 619 Society of London. Series B, Biological Sciences, 348(1326), 381–92.
- 620 http://doi.org/10.1098/rstb.1995.0076
- Barton, R. A., & Harvey, P. H. (2000). Mosaic evolution of brain structure in mammals. *Nature*,
 405(6790), 1055–8. http://doi.org/10.1038/35016580
- 623 Barton, R. A, & Venditti, C. (2014). Report rapid evolution of the cerebellum in humans and other
- 624 Great Apes. *Current Biology*, 24(20), 2440–2444. http://doi.org/10.1016/j.cub.2014.08.056

- Baumann, O., & Mattingley, J. B. (2010). Scaling of neural responses to visual and auditory motion
- 626 in the human cerebellum. *Journal of Neuroscience*, *30*(12), 4489–4495.
- 627 http://doi.org/10.1523/jneurosci.5661-09.2010
- Benson-Amram, S., Dantzer, B., Stricker, G., Swanson, E.M., & Holekamp, K.E. (2016). Brain size
 predicts problem-solving ability in mammalian carnivores. *Proceedings of the National Academy of Sciences USA*, 113(9),2532-7. https://doi.org/10.1073/pnas.1505913113
- 631 Bininda-emonds, O. R. P., Cardillo, M., Jones, K. E., Macphee, R. D. E., Beck, R. M. D., Grenyer,
- R., ... Purvis, A. (2007). The delayed rise of present-day mammals. *Nature*, 446(7135), 507–12.
 http://doi.org/10.1038/nature05634
- Boettiger C., Coop G., & Ralph, P. (2012). Is your phylogeny informative? Measuring the power of
 comparative methods. *Evolution*, 66(7), 2240-51. https://doi.org/10.1111/j.1558-
- 636 5646.2011.01574.x
- Breathnach, A. (1955). Observations on endocranial casts of recent and fossil cetaceans. *Journal of Anatomy*, 89(4), 532–546.
- Breathnach, A. S. (1960). The Cetacean Central Nervous System. *Biological Reviews*, *35*(2), 187–
 230. http://doi.org/10.1111/j.1469-185x.1960.tb01414.x
- 641 Butti, C., Janeway, C. M., Townshend, C., Wicinski, B. A., Reidenberg, J. S., Ridgway, S. H., ...
- 642 Jacobs, B. (2015). The neocortex of cetartiodactyls: I. A comparative Golgi analysis of neuronal
- 643 morphology in the bottlenose dolphin (*Tursiops truncatus*), the minke whale (*Balaenoptera*
- *acutorostrata*), and the humpback whale (*Megaptera novaeangliae*). *Brain Structure and Function*, 220(6), 3339–3368. http://doi.org/10.1007/s00429-014-0860-3
- 646 Carlisle, A., Selwood, L., Hinds, L. A., Saunders, N., Habgood, M., Mardon, K., & Weisbecker, V.
- 647 (2017). Testing hypotheses of developmental constraints on mammalian brain partition
- evolution, using marsupials. *Scientific Reports*, 7(1), 1–13. http://doi.org/10.1038/s41598-01702726-9
- Cheverud, J.M. (1996). Developmental integration and the evolution of pleiotropy. *American Zoologist*, 36(1):44-50. https://doi.org/10.1093/icb/36.1.44
- 652 Connor, R. C. (2007). Dolphin social intelligence: complex alliance relationships in bottlenose
- dolphins and a consideration of selective environments for extreme brain size evolution in
- 654 mammals. *Philosophical Transactions of the Royal Society of London. Series B, Biological*
- 655 Sciences, 362(1480), 587–602. http://doi.org/10.1098/rstb.2006.1997
- 656 Connor, R. C., Mann, J., Tyack, P. L., & Whitehead, H. (1998). Social evolution in toothed whales.
- 657 *Trends in Ecology and Evolution*, *13*(6), 228–232. http://doi.org/10.1016/S0169-
- 658 5347(98)01326-3

- Deaner, R.O., Isler, K., Burkart, J., & Van Schaik, C. (2007). Overall brain size, and not
 encephalization quotient, best predicts cognitive ability across non-human primates. Brain,
 Behavior and Evolution, 70(2), 115-24. https://doi.org/10.1159/000102973
- DeCasien, A. R., Williams, S. A., & Higham, J. P. (2017). Primate brain size is predicted by diet but
 not sociality. *Nature Ecology and Evolution*, 1(5), 1–7. http://doi.org/10.1038/s41559-017-0112
- Edinger, T. (1955). Hearing and smell in cetacean history. *European Neurology*, *129*(1–3), 37–58.
- 665 Eriksen, N., & Pakkenberg, B. (2007). Total neocortical cell number in the mysticete brain.

666 *Anatomical Record*, 290(1), 83–95. http://doi.org/10.1002/ar.20404

Evans, A. R., Jones, D., Boyer, A. G., Brown, J. H., Costa, D. P., Ernest, S. K. M., ... Uhen, M. D.
(2012). The maximum rate of mammal evolution. *Proceedings of the National Academy of*

669 Sciences, 109(11), 4187–4190. http://doi.org/10.1073/pnas.1120774109

670 Finlay, B.L., & Brodsky, P. (2006). Cortical evolution and development conserved programs

671 producing predictable, disproportionate cortical growth and systematic proliferation of cortical
 672 areas. In J. Kaas, L. Krubitzer (Eds.), The evolution of nervous systems in mammals, Academic

673 Press, Oxford. pp. 73-96

- Finlay, B.L., & Darlington, R. (1995). Linked regularities in the development and evolution of
 mammalian brains. *Science*, *268*(5217), 1578–1584. http://doi.org/10.1126/science.7777856
- Finlay, B. L., Darlington, R. B., & Nicastro, N. (2001). Developmental structure in brain evolution.
 The Behavioral and Brain Sciences, *24*, 263-278; discussion 278-308.
- 678 http://doi.org/10.1017/S0140525X01003958
- Fox, K. C. R., Muthukrishna, M., & Shultz, S. (2017). The social and cultural roots of whale and
 dolphin brains. *Nature Ecology and Evolution*, *1*(11), 1699–1705.
- 681 http://doi.org/10.1038/s41559-017-0336-y
- 682 Gould, S.J. (1966). Allometry and size in ontogeny and phylogeny. *Biological Reviews*, 41(4), 587 638. https://doi.org/10.1111/j.1469-185X.1966.tb01624.x
- Gould, S.J., & Lewontin, R.C. (1979). The spandrels of San Marco and the Panglossian paradigm: a
 critique of the adaptationist programme. *Proceedings of the Royal Society of London. Series B. Biological Sciences*, 205(1161), 581-98. https://doi.org/10.1098/rspb.1979.0086
- Hadfield, J. D. (2010). MCMC methods for multi-response generalized linear mixed models: The
 MCMCglmm R package. *Journal of Statistical Software*, *33*(Brown), 1–22.
- Hall, Z.J., Street, S.E., & Healy, S.D. (2013) The evolution of cerebellum structure correlates with
 nest complexity. *Biology Letters*, 9(6),20130687. https://doi.org/10.1098/rsbl.2013.0687
- Hanson, A., Grisham, W., Sheh, C., Annese, J., & Ridgway, S. (2013). Quantitative examination of
 the bottlenose dolphin cerebellum. *Anatomical Record*, 296(8), 1215–1228.

- 693 http://doi.org/10.1002/ar.22726
- Harrison, P. W., & Montgomery, S. H. (2017). Genetics of cerebellar and neocortical expansion in
 anthropoid primates: a comparative approach. *Brain Behav Evol*, 89(4), 274–285.

696 http://doi.org/10.1159/000477432

- Harvey, P.H., & Krebs, J.R. (1990) Comparing brains. *Science*, 249(4965), 140-6.
 https://doi.org/10.1126/science.2196673
- Haug, H. (1987). Brain sizes, surfaces, and neuronal sizes of the cortex cerebri: a stereological
- investigation of man and his variability and a comparison with some mammals (primates,
- whales, marsupials, insectivores, and one elephant). *The American Journal of Anatomy*, *180*,

702 126–142. http://doi.org/10.1002/aja.1001800203

- Herculano-Houzel, S. (2009). The human brain in numbers: a linearly scaled-up primate brain.
 Frontiers in Neuroscience, 3, 31. https://doi.org/10.3389/neuro.09.031.2009
- Herculano-houzel, S., & Sherwood, C. C. (2010). Coordinated scaling of cortical and cerebellar
 numbers of neurons, *Frontiers in Neuroanatomy*, *4*, *12*, 1–8.
- 707 http://doi.org/10.3389/fnana.2010.00012
- Hof, P. R., & Van Der Gucht, E. (2007). Structure of the cerebral cortex of the humpback whale,
 Megaptera novaeangliae (Cetacea, Mysticeti, Balaenopteridae). *Anatomical Record*, 290(1), 1–
 31. http://doi.org/10.1002/ar.20407
- 711 Huggenberger, S. (2008). The size and complexity of dolphin brains A paradox? *Journal of the*
- 712 *Marine Biological Association of the United Kingdom*, 88(6), 1103–1108.
- 713 http://doi.org/10.1017/S0025315408000738
- 714 Huxley, J.S. (1932) Problems of Relative Growth. Methuen & Co., London.
- Ishii, M., Murase, H., Fukuda, Y., Sawada, K., Sasakura, T., Tamura, T., ... Mitani, Y. (2017).
- Diving behavior of Sei whales (*Balaenoptera borealis*) relative to the vertical distribution of
 their potential prey. *Mammal Study*, 42(4), 1–9. http://doi.org/10.3106/041.042.0403
- 718 Isler, K., Christopher Kirk, E., Miller, J. M. A., Albrecht, G. A., Gelvin, B. R., & Martin, R. D.
- 719 (2008). Endocranial volumes of primate species: scaling analyses using a comprehensive and
- reliable data set. *Journal of Human Evolution*, 55(6), 967–978.
- 721 http://doi.org/10.1016/j.jhevol.2008.08.004
- 722 Iwaniuk, A.N., Dean, K.M., & Nelson, J.E. (2004). A mosaic pattern characterizes the evolution of
- the avian brain. *Proceedings of the Royal Society of London. Series B: Biological Sciences*,
 271(4), S148-51. https://doi.org/10.1098/rsbl.2003.0127
- Jen, P. H. S., & Schlegel, P. A. (1980). Neurons in the cerebellum of echolocating bats respond to
 acoustic signals. *Brain Research*, *196*(2), 502–507. http://doi.org/10.1016/0006-

727 8993(80)90415-1

- Jones, K. E., Bielby, J., Cardillo, M., Fritz, S. a., O'Dell, J., Orme, C. D. L., ... Purvis, A. (2009).
 PanTHERIA: a species-level database of life history, ecology, and geography of extant and
- 730 recently extinct mammals. *Ecology*, *90*(9), 2648–2648. http://doi.org/10.1890/08-1494.1
- Kellogg, R. (1936). A review of the Archaeoceti. *Carnegie Institution of Washington Publication*,
 482, 1–366.
- 733 Krebs, J.R., Sherry, D.F., Healy, S.D., Perry, V.H., & Vaccarino, A.L. (1989). Hippocampal
- specialization of food-storing birds. *Proceedings of the National Academy of Sciences USA*,
 86(4), 1388-92. https://doi.org/10.1073/pnas.86.4.1388
- Krutzikowsky, G. K., & Mate, B. R. (2000). Dive and surfacing characteristics of bowhead whales
 (*Balaena mysticetus*) in the Beaufort and Chukchi seas. *Canadian Journal of Zoology*, 78(7),
 1182-1198. https://doi.org/10.1139/z00-046
- Lammers, M. O., Au, W. W. L., & Herzing, D. L. (2003). The broadband social acoustic signaling
 behavior of spinner and spotted dolphins. *The Journal of the Acoustical Society of America*, *114*(3), 1629–1639. http://doi.org/10.1121/1.1596173
- Larsell, O. (1967). *The comparative anatomy and histology of the cerebellum: from monotremes through apes.* Minnesota, US: University of Minnesota Press.
- Logan, C.J., Avin, S., Boogert, N., Buskell, A., Cross, F.R., Currie, A., V... & Montgomery, S.H.
- (2018). Beyond brain size: uncovering the neural correlates of behavioral and cognitive
 specialization. *Comparative Cognition & Behavior Reviews*, 13.
- MacLean, E.L., Hare, B., Nunn, C.L., Addessi, E., Amici, F., Anderson, R.C.,... &Zhao, Y. (2014).
 The evolution of self-control. *Proceedings of the National Academy of Sciences USA*, 111(20),
 E2140-8. https://doi.org/10.1073/pnas.1323533111
- Marino, L. (2002). Convergence of complex cognitive in cetaceans and primates. *Brain, Behavior, and Evolution*, *59*, 21–32. http://doi.org/10.1159/000063731
- Marino, L. (1998). A comparison of encephalization between odontocete cetaceans and anthropoid
 primates. *Brain, Behavior and Evolution*, 51(4), 230-238. https://doi.org/10.1159/000006540
- Marino, L. (2004). Cetacean brain evolution: multiplication generates complexity. *Behavioral Biology*, *17*(1), 1–16. http://doi.org/10.1017/S0140525X00052961
- Marino, L. (2007). Cetacean brains: How aquatic are they? *Anatomical Record*, *290*(6), 694–700.
 http://doi.org/10.1002/ar.20530
- 758 Marino, L., Connor, R. C., Fordyce, R. E., Herman, L. M., Hof, P. R., Lefebvre, L., ... Whitehead,
- H. (2007). Cetaceans have complex brains for complex cognition. *PLoS Biology*, 5(5), 0966–
- 760 0972. http://doi.org/10.1371/journal.pbio.0050139

- Marino, L., Rilling, J. K., Lin, S. K., & Ridgway, S. H. (2000). Relative volume of the cerebellum in
 dolphins and comparison with anthropoid primates. *Brain, Behavior and Evolution*, *56*(4), 204–
 211. http://doi.org/10.1159/000047205
- Marino, L., Sol, D., Toren, K., & Lefebvre, L. (2006). Does diving limit brain size in cetaceans?
 Marine Mammal Science, 22(2), 413–425. http://doi.org/10.1111/j.1748-7692.2006.00042.x

766 Marino, L., Sudheimer, K. D., Pabst, D. A., McLellan, W. A., Filsoof, D., & Johnson, J. I. (2002).

- Neuroanatomy of the common dolphin (*Delphinus delphis*) as revealed by magnetic resonance
 imaging (MRI). *Anatomical Record*, 268(4), 411–429. http://doi.org/10.1002/ar.10181
- Marzban, H., Hoy, N., Aavani, T., Sarko, D. K., Catania, K. C., & Hawkes, R. (2011).
 Compartmentation of the cerebellar cortex in the naked mole-rat (*Heterocephalus glaber*). *Cerebellum*, *10*(3), 435–448. http://doi.org/10.1007/s12311-011-0251-8
- Maseko, B. C., Spocter, M. A., Haagensen, M., & Manger, P. R. (2012). Elephants have relatively
 the largest cerebellum size of mammals. *Anatomical Record*, 295(4), 661–672.
 http://doi.org/10.1002/ar.22425
- May-Collado, L. J., Agnarsson, I., & Wartzok, D. (2007). Phylogenetic review of tonal sound
 production in whales in relation to sociality. *BMC Evolutionary Biology*, *7*, 1–20.
 http://doi.org/10.1186/1471-2148-7-136
- McGowen, M. R., Spaulding, M., & Gatesy, J. (2009). Divergence date estimation and a
 comprehensive molecular tree of extant cetaceans. *Molecular Phylogenetics and Evolution*,
- 780 53(3), 891–906. http://doi.org/10.1016/j.ympev.2009.08.018
- 781 Meade, A., & Pagel, M. (2016). BayesTraits V3.
- 782 http://www.evolution.rdg.ac.uk/BayesTraitsV3.0.1/BayesTraitsV3.0.1.html
- Miller, I.F., Barton, R.A., & Nunn, C.L. (2019). Quantitative uniqueness of human brain evolution
 revealed through phylogenetic comparative analysis. *Elife*, 8, e41250.
- 785 https://doi.org/10.7554/eLife.41250.
- Miller, P. J. O., Shapiro, A. D., & Deecke, V. B. (2010). The diving behaviour of mammal-eating
 killer whales (*Orcinus orca*): variations with ecological not physiological factors. *Canadian Journal of Zoology*, 88(11), 1103–1112. http://doi.org/10.1139/z10-080
- 789 Minamikawa, S., Watanabe, H., & Iwasaki, T. (2013). Diving behavior of a false killer whale,
- 790 *Pseudorca crassidens*, in the Kuroshio-Oyashio transition region and the Kuroshio front region
- 791 of the western North Pacific. *Marine Mammal Science*, 29(1), 177–185.
- 792 http://doi.org/10.1111/j.1748-7692.2011.00532.x
- Montgomery, S. (2017). Evolution of Large Brain and Body Size in Mammals. In *Evolution of Nervous Systems* (Vol. 2, pp. 103–136). Oxford, UK: Elsevier. https://doi.org/10.1016/B978-0-

795 12-804042-3.00034-8

Montgomery, S. H., Geisler, J. H., McGowen, M. R., Fox, C., Marino, L., & Gatesy, J. (2013). The
evolutionary history of cetacean brain and body size. *Evolution*, 67(11), 3339-3353.

798 http://doi.org/10.1111/evo.12197

- Montgomery, S. H., Mundy, N. I., & Barton, R. A. (2016). Brain evolution and development:
 Adaptation, allometry and constraint. *Proceedings of the Royal Society B: Biological Sciences*,
 283(1838). http://doi.org/10.1098/rspb.2016.0433
- Morgane, P. J., Glezer, I. I., & Jacobs, M. S. (1990). Comparative and evolutionary anatomy of the
 visual cortex of the dolphin. In E. Jones & A. Peters (Eds.), *Cerebral cortex* (pp. 215–262).
 New York: Plenum Press.
- Mota, B., & Herculano-Houzel, S. (2014). All brains are made of this: a fundamental building block
 of brain matter with matching neuronal and glial masses. *Frontiers in Neuroanatomy*, 8
 (November), 127. http://doi.org/10.3389/fnana.2014.00127
- 808 Nowak, R. (1999). Walker's mammals of the world. JHU Press.
- 809 Oelschläger HHA, O. J. (2009). Brain. In P. WF, W. B, & T. JGM (Eds.), *Encyclopedia of Marine*810 *Mammals*. (2nd ed., pp. 134–149). San Diego, CA: Academic Press.
- 811 Oeschläger, H.H.A., & Oelschäger, J.S. (2008). Brain. In W.F. Perrin, B. Würsig & J.G.M.
- 812 Thewissen (Eds), Encyclopedia of marine mammals. 2nd Ed. Elsevier, Amsterdamn,
 813 Netherlands. pp. 124-149.
- Organ, C. L., Shedlock, A. M., Meade, A., Pagel, M., & Edwards, S. V. (2007). Origin of avian
 genome size and structure in non-avian dinosaurs. *Nature*, 446(March), 180–184.
- 816 http://doi.org/10.1038/nature05621
- Parvizi, J. (2009). Corticocentric myopia: old bias in new cognitive sciences. *Trends in Cognitive Sciences*, *13*, 354–359. http://doi.org/10.1016/j.tics.2009.04.008
- 819 Patzke, N., Spocter, M. A., Karlsson, K., Bertelsen, M. F., Haagensen, M., Chawana, R., ... Manger,
- P. R. (2013). In contrast to many other mammals, cetaceans have relatively small hippocampi
 that appear to lack adult neurogenesis. *Brain Structure and Function*, 220(1), 361–383.
- 822 http://doi.org/10.1007/s00429-013-0660-1
- Paulin, M. G. (1993). The role of the cerebellum in motor control and perception. *Brain, Behavior and Evolution*, 41(1), 39–50. http://doi.org/10.1159/000113822
- Pilleri, M., & Gihr, G. (1970). The central nervous system of the mysticete and odontocete whales. *Investigations on Cetacea*, *2*, 89–127.
- Poth, C., Fung, C., Güntürkün, O., Ridgway, S. H., & Oelschläger, H. H. A. (2005). Neuron numbers
 in sensory cortices of five delphinids compared to a physeterid, the pygmy sperm whale. *Brain*

- 829 *Research Bulletin*, *66*(4–6), 357–360. http://doi.org/10.1016/j.brainresbull.2005.02.001
- 830 Powell, L. E., Isler, K., & Barton, R. A. (2017). Re-evaluating the link between brain size and
- behavioural ecology in primates. *Proceedings of the Royal Society B: Biological Sciences*,
 284(1865), 1–8. http://doi.org/10.1098/rspb.2017.1765
- Ramnani, N. (2006). The primate cortico-cerebellar system: anatomy and function, 7(July), 511–522.
 http://doi.org/10.1038/nrn1953
- Ridgway, S. (2000). The auditory central nervous system of dolphins. In *Hearing by Whales and Dolphins* (pp. 273–293). New York, NY, US: Springer.
- Ridgway, S. H., Carlin, K. P., & Van Alstyne, K. R. (2018). Delphinid brain development from
 neonate to adulthood with comparisons to other cetaceans and artiodactyls. *Marine Mammal Science*, *34*(2), 420–439. http://doi.org/10.1111/mms.12464
- 840 Ridgway, S. H., Carlin, K. P., Van Alstyne, K. R., Hanson, A. C., & Tarpley, R. J. (2017).
- 841 Comparison of dolphins' body and brain measurements with four other groups of cetaceans
- reveals great diversity. *Brain, Behavior and Evolution*, *88*(3–4), 235–257.
 http://doi.org/10.1159/000454797
- Ridgway, S. H., & Hanson, A. C. (2014). Sperm whales and killer whales with the largest brains of
 all toothed whales show extreme differences in cerebellum. *Brain, Behavior and Evolution*,
 83(4), 266–274. http://doi.org/10.1159/000360519
- Sherry, D.F., Vaccarino, A.L., Buckenham, K., & Herz, R.S. (1989). The hippocampal complex of
 food-storing birds. *Brain, Behavior and Evolution*, 34(5). 308-17.

849 https://doi.org/110.1159/000116516

- Shultz, S., & Dunbar, R. (2010). Encephalization is not a universal macroevolutionary phenomenon
 in mammals but is associated with sociality. *Proceedings of the National Academy of Sciences*of the United States of America, 107(50), 21582–21586.
- 853 http://doi.org/10.1073/pnas.1005246107
- 854 Silva, T. L., Mooney, T. A., Sayigh, L. S., Tyack, P. L., Baird, R. W., & Oswald, J. N. (2016).
- 855 Whistle characteristics and daytime dive behavior in pantropical spotted dolphins (Stenella
- attenuata) in Hawai'i measured using digital acoustic recording tags (DTAGs) . *The Journal of*
- 857 *the Acoustical Society of America*, *140*(1), 421–429. http://doi.org/10.1121/1.4955081
- 858 Simmonds, M. P. (2006). Into the brains of whales. *Applied Animal Behaviour Science*, 100(1–2),
- 859 103–116. http://doi.org/10.1016/j.applanim.2006.04.015
- 860 Singla, S., Dempsey, C., Warren, R., Enikolopov, A. G., & Sawtell, N. B. (2017). A cerebellum-like
- 861 circuit in the auditory system cancels responses to self-generated sounds. *Nature Neuroscience*,
- 862 20(7), 943–950. http://doi.org/10.1038/nn.4567

- 863 Smaers, J. B., Turner, A. H., Gómez-Robles, A., & Sherwood, C. C. (2018). A cerebellar substrate
- for cognition evolved multiple times independently in mammals. *ELife*, 7, 1–19.

865 http://doi.org/10.7554/elife.35696

- Smaers, J.B., & Vanier, D.R. (2019). Brain size expansion in primates and humans is explained by a
 selective modular expansion of the cortico-cerebellar system. Cortex. In press.
 https://doi.org/10.1016/j.cortex.2019.04.023
- 869 Sokolov, A. A., Miall, R. C., & Ivry, R. B. (2017). The cerebellum: adaptive prediction for

870 movement and cognition. *Trends in Cognitive Sciences*, *21*(5), 313–332.
871 http://doi.org/10.1016/j.tics.2017.02.005

- 872 Sørensen, P. M., Wisniewska, D. M., Jensen, F. H., Johnson, M., Teilmann, J., & Madsen, P. T.
- 873 (2018). Click communication in wild harbour porpoises (*Phocoena phocoena*). Scientific

874 *Reports*, 8(1), 1–11. http://doi.org/10.1038/s41598-018-28022-8

- Stephan, H., Frahm, H., & Baron, G. (1981). New and revised data on volumes of brain structures in
 insectivores and primates. *Folia Primatologica*, *35*(1), 1–29. https://doi.org/10.1159/000155963
- Sukhum, K.V., Shen, J., & Carlson, B.A. (2018) Extreme enlargement of the cerebellum in a clade
 of teleost fishes that evolved a novel active sensory system. *Current Biology*, 28(23):3857-63.
 https://doi.org/10.1016/j.cub.2018.10.038
- Sultan, F., & Glickstein, M. (2007). The cerebellum: Comparative and animal studies. *Cerebellum*,
 6(3), 168–176. http://doi.org/10.1080/14734220701332486
- Thewissen, J.G., George, J., Rosa, C., & Kishida, T. (2011). Olfaction and brain size in the bowhead
 whale (Balaena mysticetus). *Marine Mammal Science*, 27(2), 282-94.
- 884 https://doi.org/10.1111/j.1748-7692.2010.00406.x
- Venditti, C., Meade, A., & Pagel, M. (2011). Multiple routes to mammalian diversity. *Nature*,
 479(7373), 393–6. http://doi.org/10.1038/nature10516
- 887 Wagner, M. J., Kim, T. H., Kadmon, J., Nguyen, N. D., Ganguli, S., Schnitzer, M. J., & Luo, L.
- (2019). Shared cortex-cerebellum dynamics in the execution and learning of a motor task. *Cell*,
 177(3), 669–682.e24. http://doi.org/10.2139/ssrn.3284449
- 890 Weaver, A.H. (2005). Reciprocal evolution of the cerebellum and neocortex in fossil humans.
- 891 *Proceedings of the National Academy of Sciences USA*, 102(10, 3576-80.
- 892 https://doi.org/10.1073/pnas.0500692102
- Weisbecker, V. (2009). Why "late equals large" does not work. *Neuroscience* 164(4), 1648-52.
 https://doi.org/10.1016/j.neuroscience.2009.09.027
- 895 Whitehead, H. (2011). The cultures of whales and dolphins. In Earthscan (Ed.), Whales and
- 896 Dolphins: Cogntion, Culture, Conservation and Human Perceptions. London, UK.

897	Whiting, B. A., & Barton, R. A. (2003). The evolution of the cortico-cerebellar complex in primates:
898	Anatomical connections predict patterns of correlated evolution. Journal of Human Evolution,
899	44, 3-10. http://doi.org/10.1016/S0047-2484(02)00162-8
900	Yopak, K.E., Lisney, T.J., Darlington, R.B., Collin, S.P., Montgomery, J.C., & Finlay, B.L. (2010).
901	A conserved pattern of brain scaling from sharks to primates. Proceedings of the National
902	Academy of Sciences USA, 107(29), 12946-51. https://doi.org/10.1073/pnas.1002195107
903	
904	
905	
906	
907	
908	
909	
910	
911	
912	
913	
914	
915	
916	
917	
918	
919	
920	
921	
922	
923	
924	
925	
926	

Figures



Figure 1: Phylogeny of species included in this study. A. The all mammal dataset. Inner dashed line shows marsupial mammals, inner solid line shows placental mammals. Outer green dashed line shows primates, outer blue dashed line and branches shows cetaceans. B. Cetacean phylogeny, showing major taxonomic groups. Within odontocetes the dashed/solid likes distinguish Delphinoidea from other odontocetes. Data for Megaptera novaeangliae (*) is available but was excluded as the sum of CB and CX equaled total brain volume, suggesting the inclusion of other components. C-D. Log-log plots of scaling between (C) CX and RoB, (D) CB and RoB, and (E) CB and CX for all mammals (grey points/black line) and cetaceans (blue points/orange line). *** indicates significant grade-shifts between cetaceans and other mammals at p<0.001, ns indicates non-significant grade-shifts.



946 Figure 2: CB~CX co-variance in cetaceans. A. A plot of residual variance around a CB~RoB and 947 CX~RoB regressions in cetaceans. Mysticetes are shown as in grey, odontocetes are shown in blue 948 except for the two genera in Physeteroidea, *Kogia* and *Physeter*, which are shown as orange or red 949 diamonds, respectively, to illustrate the position of *Physeter* as an outlier with the a smaller CB size 950 than expected given CX/RoB size. B. A plot of raw individual-level data of CB~CX mass for all 951 cetaceans, again highlighting the Physeteroidea to highlight consistency in the *Physeter* data.

971





974 Figure 3: Scaled branch lengths from the variable rates models. A. Scaled branch lengths against 975 untransformed branch lengths from the variable rates model for CB, numbers indicate the top four 976 branches with the highest deviation, which are coloured red and labelled in A'. B. Scaled branch 977 lengths against untransformed branch lengths from the variable rates model for the CX, numbers indicate the top four branches with the highest deviation, which are coloured red and labelled in B'. 978 979 C. Mean scalars from the variable rates model for CB and CX, controlling for RoB, in cetaceans. 980 Numbers indicate the top four branches with the highest deviation, which are coloured red and 981 labelled in C'.





Figure 4: Mean scalars from the variable rates model for CB (orange) and CX (green), controlling
for RoB, in cetaceans, plotted against the mean scalar for brain mass, controlling for body mass. The
dashed line indicates a 1:1 relationship.

- - -

- .001

002	Supp	lementarv	inform	nation
001	\sim app			10001011

003	
004	Table S1: Trait data
005	S1A: brain component data
006	S1B: ecological data
007	Table S3: Results of phylogenetic <i>t</i> -tests
008	Table S4: Results of brain scaling differences between taxa
.009	Table S5: Results of the variable rates models
010	Table S6: Results of the ecological association tests
011	Treefile
012	Supplementary Information
013	i) Uncertainty in estimating lambda
014	ii) Power to estimate lambda
015	
016	AVAILABLE HERE:
017	https://onlinelibrary.wiley.com/doi/10.1111/jeb.13539