# A Total-Group Phylogenetic Metatree for Cetacea and the Importance of Fossil Data in Diversification Analyses

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### Abstract

Phylogenetic trees provide a powerful framework for testing macroevolutionary hypotheses, but it is becoming increasingly apparent that inferences derived from extant species alone can be highly misleading. Trees incorporating living and extinct taxa are are needed to address fundamental questions about the origins of diversity and disparity but it has proved challenging to generate robust, species-rich phylogenies that include large numbers 5 of fossil taxa. As a result, most studies of diversification dynamics continue to rely on 6 molecular phylogenies. Here, we extend and apply a recently developed meta-analytic 7 approach for synthesizing previously published phylogenetic studies to infer a well-resolved set of species level, time-scaled phylogenetic hypotheses for extinct and extant cetaceans 9 (whales, dolphins and allies). Our trees extend sampling from the  $\sim 90$  extant species to 10 over 400 living and extinct species, and therefore allow for more robust inference of 11 macroevolutionary dynamics. While the diversification scenarios we recover are broadly 12 concordant with those inferred from molecular phylogenies they differ in critical ways, 13 most notably in the relative contributions of extinction and speciation rate shifts in driving 14 rapid radiations. Supertrees are often viewed as poor substitute for phylogenies inferred 15 directly from character data but the metatree pipeline overcomes many of the past 16

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criticisms leveled at these approaches. Meta-analytic phylogenies provide the most
immediate route for integrating fossils into macroevolutionary analyses, the results of
which range from untrustworthy to nonsensical without them.

Key words: supertree, morphology, matrix representation with parsimony, extinction,
 macroevolution.

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It is now widely accepted that a phylogenetic framework is essential for addressing 23 questions regarding diversification dynamics, phenotypic evolution, and historical 24 biogeography. The covariances between species that are imposed by the hierarchical 25 structure of a phylogenetic tree mean that any attempt to understand the processes 26 responsible for generating observed patterns of diversity must take the tree and its 27 associated branch lengths into account (Felsenstein, 1985; Harvey and Pagel, 1991; Foote 28 1996 O'Meara et al., 2006 Ree and Smith, 2008. As a consequence of this phylogenetic 29 dependence, the development of new tools for inferring macroevolutionary dynamics has 30 been paralleled by innovations in the field of phylogenetic inference, and it is now possible 31 to infer time-scaled trees using complex models of molecular evolution applied to 32 genome-scale data. 33

The need for a well-resolved, time-calibrated phylogeny places substantial 34 constraints on the kinds of clades that are accessible to most biologists for testing 35 macroevolutionary hypotheses. Some authors have noted that clades are often selected for 36 study due to their tractability rather than because they are suitable candidates for testing 37 a particular hypothesis, resulting in a form of empirical ascertainment bias (Beaulieu and 38 O'Meara, 2018, 2019). For example, early burst models of adaptive radiation arose to 39 explain the origins of higher taxa (Simpson, 1944, 1953; Van Valen, 1971; Valentine, 1980; 40 Humphreys and Barraclough, 2014; Slater and Friscia, 2019) but have mostly been tested 41 in lower level clades, such as genera, where the early burst signal is conspicuously lacking 42

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(e.g., Harmon et al., 2010). Although lower level clades certainly have a role to play in 43 comparative biology (Schluter, 2000; Losos, 2009; Donoghue and Edwards, 2019), there is a 44 pressing need to develop suitable phylogenetic frameworks for studying macroevolutionary 45 pattern and process at higher taxonomic levels. 46 The major barrier to obtaining appropriate phylogenetic frameworks for higher-level 47 clades has always been data availability (Smith et al., 2009). The "Supermatrix" approach 48 was initially suggested as a solution to this problem (Sanderson et al., 1998; Gatesy et al. 49 2002; de Queiroz and Gatesy, 2007). Here, one obtains all available sequence data for a 50 clade of interest through a combination of direct sequencing and from repositories such as 51 Genbank. Sequences are aligned and concatenated to create a large but sparsely sampled 52 matrix that can be analyzed using standard phylogenetic software and methods. Concerns 53 regarding the impact of missing data and data quality (e.g., McMahon and Sanderson, 54 2006) have, more recently, led to alternative approaches based on bioinformatic pipelines 55 Smith et al. (2009) or patching of subclades onto backbone trees (Jetz et al., 2012; Tonini 56 et al. 2016; Jetz and Pyron, 2018; Upham et al., 2019). These methods have proved 57 effective for generating large, higher-level phylogenetic hypotheses (particularly where 58 taxonomic information can also be used to constrain the placement of species that lack 59 character data) and have yielded novel insights into diversification dynamics, trait 60 evolution and historical biogeographic patterns. Recent examples include a 5,284 species 61 tree of agariomycete fungi (Varga et al., 2019), an 11,638 species tree of extant fishes 62 (Rabosky et al., 2018), and a 353,185 species tree of seed plants (Smith and Brown, 2018). 63 While these methods provide promise for extant clades, they cannot be used to 64 generate phylogenetic hypotheses for most of the > 99% of life that is now extinct (Raup 65 1994). This is particularly problematic given that fossil data play a critical role in refining 66 estimates of ancestral character states (Finarelli and Flynn, 2006), choosing among 67 competing models of trait evolution (Slater et al., 2012), inferring ancestral biogeographic 68 patterns (Meseguer et al., 2014), and understanding speciation and extinction dynamics 69

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through time (Mitchell et al., 2018; Louca and Pennell, 2020). The difficulty in generating 70 large character-taxon matrices for fossil taxa is due in large part to the unique and often 71 subjective ways in which morphological characters and their states are defined and coded 72 across studies. Unlike molecular data, where character states are universally coded, two 73 morphological matrices with partially overlapping taxon lists cannot be concatenated 74 without extensive revision of characters and re-coding of their states, which is, in itself, a 75 challenging, time-consuming, and potentially impossible task. The effect of this 76 incompatibility is that, although the number of species included in morphological 77 character-taxon matrices has continued to increase over the past few decades (fig 1), they 78 lag well behind molecular datasets in size. One recent study included character state 79 codings for 501 OTUs (Hartman et al., 2019), but this is twice the size of the next largest 80 matrix published to date (N=254, Mo et al., 2012). 81

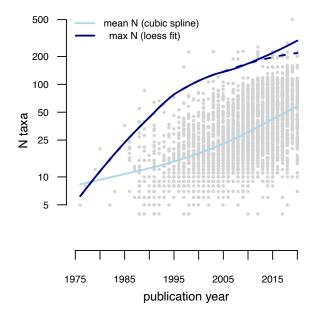


Fig. 1. Although the number of taxa included in morphological character-taxon matrices has increased over time, they lag behind the largest molecular datasets. Based on a cubic spline (light blue line) fitted to log(number of taxa) in 3671 morphological studies (graemetlloyd.com/matr.heml), the average dataset has only increased from 8.3 OTUs in 1975 to 58 OTUs in 2020 (note log scale on y-axis). The maximum number of taxa has also increased, corroborated by a loess fit (dark blue solid line). Removing Hartman et al. (2019), which contains the largest number of taxa by a factor of 2, indicates a slow-down in the rate of increase towards the present (dark blue dashed line).

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Supertree methods provide an alternative avenue for the inference of large 82 phylogenies of extinct taxa. Supertrees are a class of consensus tree in which a set of 83 topologies derived from distinct datasets are summarized in some common form to yield a 84 topology containing shared or well-supported splits (Sanderson et al., 1998; Sanderson and 85 Driskell 2003; Bininda-Emonds et al. 2002; Bininda-Emonds, 2004). Importantly, 86 supertree methods can accommodate sets of input trees with partially or non-overlapping 87 leaf sets, and they therefore provide a way of synthesizing morphological character-taxon 88 matrices covering distinct clades without re-coding characters or concatenating matrices. 89 The best–known method for combining trees is Matrix Representation with Parsimony 90 (MRP), where all input topologies are represented using a binary coding scheme (Fig. 2). 91 Each column, or character, in a MRP matrix represents a bipartition from one of the 92 source trees. An entry of "1" for a given row indicates the presence of that taxon within 93 the clade, "0" indicates its exclusion from the clade, and "?" indicates that the taxon is 94 not represented in the source tree in question (Baum, 1992; Ragan, 1992; Baum and 95 Ragan, 2004, Fig 2C). A supertree containing the union of tips over the source trees may 96 then be inferred using standard parsimony methods. Like supermatrices, supertrees (and 97 MRP supertrees in particular) have been criticized on a number of grounds. Character 98 non-independence necessarily arises due to reuse of characters across multiple analyses 99 (Springer and de Jong, 2001), and issues concerning the relative quality of individual 100 studies must also be addressed (Gatesy et al., 2004). Further sources of concern include 101 how to select and code topologies produced from analysis of the same matrix (Gatesy 102 et al. 2004), weighting of strongly versus weakly supported nodes (Gatesy and Springer 103 2004), the potential recovery of clades that are not found in any of the input trees (Pisani 104 and Wilkinson, 2002; Bininda-Emonds, 2003; Wilkinson et al., 2005) and how best to deal 105 with supraspecific OTUs (Page, 2004). 106

<sup>107</sup> In response to these criticisms, a number of alternative supertree approaches have <sup>108</sup> been developed (e.g, Bininda-Emonds, 2004; Semple et al., 2004; Levasseur and Lapointe

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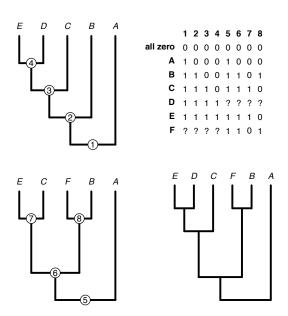


Fig. 2. Matrix representation of tree topologies allows for the inference of total clade trees even if taxa are missing from individual source trees. Here, the two source trees on the left differ in that tree 1 does not sample taxon F while tree 2 is missing taxon D. Parsimony analysis of the matrix representation of the two topologies results in a single shortest tree that captures the intuitive relationships of F with B and C as sister to D+E that are not both present in either of the two source trees.

2006 Steel and Rodrigo 2008 Lin et al. 2009 Ranwez et al. 2010 Swenson et al. 2012 109 Akanni et al. 2015; Kettleborough et al. 2015; Fleischauer and Böcker 2017). Some of 110 these methods allow for character weighting based on information such as bootstrap 111 values, or relative importance of a given source tree, but none provides a straightforward 112 way to explicitly accommodate phylogenetic uncertainty within individual source studies, 113 particularly where the number of studies is large. Furthermore, none of these approaches or 114 pipelines explicitly deal with earlier criticisms of the supertree paradigm that are rooted in 115 issues of data reuse and redundancy (Springer and de Jong, 2001) Gatesy and Springer, 116 2004 Gatesy et al. 2004). Lloyd et al. (2016) introduced an alternative approach that they 117 called a "metatree". As with MRP supertrees, metatrees use binary encoding of tree 118 topologies to generate a matrix that can be analyzed using standard phylogenetic methods. 119 The principal difference between an MRP supertree and a metatree is that the matrix from 120 which MRP supertrees are built typically uses individual tree topologies gleaned from 121

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published papers as data, while the metatree approach explicitly requires reanalysis of 122 morphological character-taxon matrices to sample and encode *all* optimal topologies. 123 Moreover, the metatree pipeline introduces specific rules to ameliorate concerns associated 124 with data redundancy and uncertainty in the inference of source trees. In practice, 125 metatrees tend to lead to more resolved consensus topologies than traditional MRP 126 supertrees (compare Lloyd et al. 2016 to Lloyd et al. 2008) while also better 127 accommodating phylogenetic uncertainty in the source studies than the figured trees 128 typically used by supertree methods (Bell and Lloyd, 2015). 129

In this paper we leverage the metatree approach to assess diversification dynamics in 130 extant and extinct cetaceans (whales, dolphins and relatives). A number of recent studies 131 based on molecular phylogenies have provided evidence for a recent increase in cetacean 132 net diversification rates during the past 10 Ma, driven by rapid speciation of ocean 133 dolphins (Delphinidae) (Steeman et al., 2009; Slater et al., 2010; Rabosky, 2014; Rabosky 134 and Goldberg 2015). However, the relative contributions of speciation and extinction rate 135 variation to trends in net diversification can be extremely difficult to disentangle using 136 phylogenies of extant taxa (Liow et al., 2010; Louca and Pennell, 2020) and the rich 137 cetacean fossil record suggests that different dynamics may have been at play during the 138 past 36 million years than might be suggested on the basis of molecular phylogeny alone 139 Quental and Marshall 2010; Morlon et al., 2011; Marx and Fordyce 2015). Until now, the 140 lack of a densely-sampled higher-level phylogeny of the clade has precluded thorough 141 comparison of diversification dynamics inferred from molecular and fossil phylogenies. We 142 here use the metatree pipeline (Lloyd et al., 2016) to assemble a comprehensive set of 143 phylogenetic hypotheses for extant and extinct cetaceans. We then use a Bayesian 144 model-averaging approach (fossilBAMM Rabosky et al., 2014; Mitchell et al., 2018) to 145 estimate rates of speciation and extinction through time and across branches of the 146 time-scaled cetacean trees. Our results demonstrate that simultaneous analysis of extinct 147 and extant taxa can yield different conclusions regarding macroevolutionary dynamics 148

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than are derived from analyses of extant taxa alone, and stress the important of
paleo-phylogenetic approaches for studying macroevolutionary dynamics.

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### MATERIALS AND METHODS

The metatree approach was fully described in Lloyd et al. (2016) but we provide an overview here in the context of assembly of our cetacean metatree. For ease of reference, our pipeline is summarized visually as a flow-chart in Figure 3 and our description of methods follow this structure.

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# Data Acquisition

Morphological character data We collected 146 morphological character matrices 157 from 143 published studies (See Supplementary Bibliography). Sampled studies range in 158 publication date from 1994 to 2020. New species of (typically extinct) cetacean are 159 described with sufficient regularity that such a tree can quickly become out-of-date. 160 However, our pipeline allows easy integration of additional data for continuous updating. 161 We included phylogenetic analyses of exclusively extinct, exclusively extant, and both 162 extinct and extant taxa in our dataset. The only requirement for inclusion was that a 163 morphological character matrix was provided in the paper, the associated supplementary 164 methods, or on some repository such as Morphobank (O'Leary and Kaufman, 2011). All 165 character matrices have been deposited on the cetacean metatree GitHub repository 166 (https://github.com/graemetlloyd/ProjectBlackFish). We retained information 167 regarding any character weighting or ordering schemes used in the published analyses. To 168 minimize the impact of data duplication, we removed molecular data, where included, from 169 each alignment. 170

<sup>171</sup> Molecular character data Molecular evidence may provide a strong and divergent <sup>172</sup> phylogenetic signal for extant taxa compared with the signal provided by morphological

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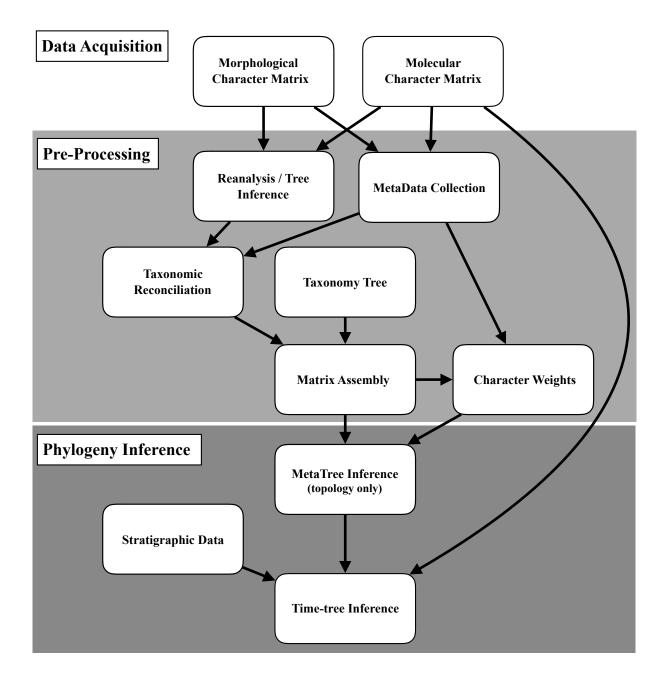


Fig. 3. Schematic showing the general outline of metatree assembly. Description of methods used in the assembly of our cetacean metatrees follow this workflow.

data. Parsimony analyses of morphological character data often employ a molecular
scaffold approach, whereby tree searches are constrained to recover topologies for extant
taxa that are consistent with molecular estimates. However, the fact that a single topology

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<sup>176</sup> constraint must typically be enforced means topological uncertainty inherent in tree
<sup>177</sup> inference from molecular data cannot be accommodated. The metatree pipeline can readily
<sup>178</sup> incorporate molecular data as an additional data source, thus accommodating topological
<sup>179</sup> uncertainty. We here used the molecular supermatrix of McGowen et al. (2009). This
<sup>180</sup> matrix contains 42,335 characters from 45 nuclear loci, mitochondrial genomes, and
<sup>181</sup> transposon insertion events coded for 91 taxa (four artiodactyl outgroups and 87 of 91
<sup>182</sup> currently recognized cetacean species).

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# Pre-processing

We reanalyzed each morphological character-taxon matrix, under the Reanalysis 184 outgroup, weighting, and ordering schemes specified by the original authors, using the 185 maximum parsimony software TNT (Goloboff et al., 2008). The use of parsimony allowed 186 us to balance our desire to incorporate phylogenetic uncertainty via a set of most 187 parsimonous trees with the need for an efficient pipeline for processing large numbers of 188 source datasets while guaranteeing convergence on an optimal set of solutions. However, 189 any approach (Maximum Likelihood, Bayesian Inference) could be used to reanalyze 190 source data. The settings for each analysis were determined on the basis of matrix size. For 191 24 or fewer taxa the implicit enumeration option was used, which guarantees that all 192 optimal topologies will be returned. For 25 or more taxa, 20 separate replicates of TNT's 193 "New Technology Searches" were performed, each starting with a random seed. Trees from 194 each replicate were then combined and a final round of tree bisection-reconnection was 195 performed. In some cases the maximum tree limit (100,000) was hit, indicating additional 196 equally optimal relationships exist. In order not to miss these topologies, searches were 197 repeated until the least frequent bipartition was found at least twice suggesting complete 198 coverage was reached). For the purposes of inference, trees were summarised using matrix 199 representation, with all duplicate bipartitions removed. All unique bipartitions were 200 equally weighted as under parsimony there is no clear basis for considering bipartition 201

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<sup>202</sup> frequency within the set of shortest trees as a measure of support.

The molecular data from McGowen et al. (2009) were analyzed in MrBayes v 3.2 203 (Ronquist et al., 2012) via the CIPRES portal (Miller et al., 2010) using the same MCMC 204 settings and models as in the original study. In Bayesian phylogenetic methods, topologies 205 (and their associated branch lengths) are sampled in proportion to their posterior 206 probabilities, which means that bipartition frequency is meaningful. We encoded unique 207 bipartitions found within 1000 trees drawn at random from the posterior sample using 208 matrix representation but assigned each column of the resulting character matrix a weight 209 corresponding to its frequency in the posterior sample. For example, a clade sampled in 210 only 10% of the posterior sample was assigned a weight that is one-tenth that of a clade 211 present in all trees in the sample. 212

Metadata We recorded two key pieces of metadata from each source study. First, 213 we noted whether supra-specific Operational Taxonomic Units (OTUs) in the character 214 matrix were coded from a specific taxon or taxa. For example, the NEXUS file of Godfrey 215 et al. (2017) lists the OTU *Phocageneus* but the paper itself confirms that this OTU is 216 *Phocageneus venustus.* If a supra–specific OTU was coded from more than one taxon, all 217 were recorded if listed in the paper. If no species-level taxa were listed, we retained the 218 supra-specific taxon as the unit of analysis. Direct editing of names in NEXUS files can 219 lead to problems if taxa are later synonymized or names are altered. We therefore 220 generated custom XML files for each source study in which each OTU was reconciled to its 221 constituent taxa, as recorded in the Paleobiology Database (Peters and McClenner, 2016). 222 Cetaceans, both extinct and extant, are extremely well documented in the Paleobiology 223 Database thanks largely to the efforts of Mark Uhen (e.g., Uhen and Pyenson, 2007). 224 Additionally, as the database is continually updated and has an API (Peters and 225 McClennen, 2016), dynamic updating of taxonomy can be achieved in future metatree 226 iterations. Seventy undescribed OTUs did not have a species name. Following Lloyd et al. 227 (2016) we retain these as "valid" taxa in our analyses because 1) they may represent key 228

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data for resolving phylogenetic relationships, dating the tree, or performing downstream
macroevolutionary analysis, and 2) there is a clear and repeated tendency for these
specimens to become the holotypes of new species (for example, the specimen-level OTU,
"GSM 109" was included in multiple trees prior to its formal description as *Echovenator sandersi* by Churchill et al. (2016). Such OTUs are a common feature in other clades too;
10% (97 of 961) of OTUs in Lloyd et al. (2016) were unnamed specimens.

The second piece of information noted was whether the matrix was based on a previous study. For example, the matrix of Godfrey et al. (2017) was based on an earlier study by Lambert et al. (2014) and was itself later used by Boersma et al. (2017). This information was added to each matrix's XML file for use in determining relative weighting or study redundancy when assembling the final MRP matrix.

Taxonomic reconciliation and taxonomy tree Before matrix representations for
each source study can be combined to form a global matrix, a list of valid species must be
decided on and taxonomic assignments reconciled to this list. We dynamically reconciled
tip names recorded in the XML files to currently valid taxon names recognized in the
Paleobiology Database, for example updating junior synonyms to their senior synonyms.
This procedure allows taxonomic information to be automatically updated and limits
human error while updating names.

The taxonomic hierarchy present in the database also represents a 247 pseudo-phylogenetic hypothesis (Soul and Friedman, 2015), a feature exploited here in two 248 ways. First, supraspecific taxon rows that cannot be reconciled to specific taxa can be 249 replaced with a set of duplicated rows corresponding to species-level OTUs, avoiding the 250 situation where, for example, Balaenoptera and Balaenoptera musculus exist as separate 251 tips in the final metatree. Second, the taxonomy can be included as an additional, albeit a 252 heavily down-weighted data set (Gatesy and Springer, 2004). This is important as the 253 presence of a basic but comprehensive estimate of phylogeny derived from taxonomy can 254 ameliorate inference issues that might arise due to a lack of data overlap (an affliction of 255

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<sup>256</sup> formal supertrees often termed "rogue taxa"). For example, Mysticetes and Odontocetes
<sup>257</sup> should logically be separated as clades, but if all phylogenetic analyses only focused on one
<sup>258</sup> or the other of these clades, then information on their reciprocal monophyly would be
<sup>259</sup> lacking.

The use of a taxonomy tree also allows for the inclusion of species that are 260 un-sampled in the set of source trees. Higher-level analyses of extant clades have included 26 taxa for which molecular data are unavailable by simultaneously enforcing topology 262 constraints, based on taxonomy, and integrating over possible placements of missing taxa 263 under a birth-death process (e.g., Kuhn et al. 2011; Jetz et al., 2012; Rabosky et al., 2018 264 Upham et al., 2019). We here increased taxonomic coverage for fossil cetaceans by 265 producing two additional versions of our MRP matrix, one in which all species assigned to 266 a sampled genus were included and another where all species assigned to Cetacea in the 26 Paleobiology Database were included. We refer to these analyses as GENUS and ALL, 268 respectively, for the remainder of this paper, with the species-level analysis referred to as 269 EXCLUDE to account for the fact that unsampled OTUs were excluded. It should be 270 stressed that, because our pipeline treats taxonomic bipartitions as data that are 271 down-weighted relative to bipartitions derived from phylogenetic analyses, this approach 272 does not force a taxonomic structure on the result where there are primary character data 273 available that disagree with it (cf. Jetz et al., 2012; Rabosky et al., 2018; Upham et al. 274 2019). 275

Matrix assembly and character weighting After taxonomic reconciliation, it is straightforward to merge MRP matrices from source studies into a global character-taxon matrix. At this stage, we also compute character weights, based on three attributes of source studies: non-independence, date of publication, and size (measured in number of MRP characters). Older character matrices that were reused in a subsequent study without modification of the characters themselves (e.g., by the addition of a single new taxon to an existing dataset) were deemed redundant and automatically removed. The remaining

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non-independent data sets were assigned equal weights that sum to one, with this weight 283 being applied to each character of the data set. Next, following Lloyd et al. (2016), 284 publication year weights were assigned such that the oldest included data-set received a 285 weight of 10 (an order of magnitude higher than the weight assigned to the taxonomy tree) 286 and with weights doubling every two years. Again, this weight was applied to each 287 character in a data set. Finally, some data sets generated more MRP characters than others 288 simply because they contained greater phylogenetic uncertainty and without intervention 289 these would dominate the final tree. To account for this individual characters (bipartitions) 290 were weighted such that any within-data-set characters (biparitions) with which they 291 conflict are clustered and down-weighted such that they sum to one, with any unconflicted 292 characters being weighted one. These different character weights were combined by taking 293 the product of the three criteria-based weights. Other ways of weighting characters and 294 source studies are possible (interested readers can consult the *in development metatree* R 295 package github.com/graemetlloyd/metatree for more information and options) but we 296 have so far found the above to work well across a range of groups. 297

TNT (Goloboff et al., 2008) requires that weights fall in the range 0.50 - 1000.00. 298 We set default weights of one for the taxonomy tree (always enforced) and 10 for the 299 minimum phylogenetic weight, but no initial maximum weight can be specified and in 300 practice this may exceed 1000.00. When this occurred, we rescaled the phylogenetic 301 weights only to fall on a 10.00 – 1000.00 scale. Lloyd et al. (2016) applied multistate 302 characters to effectively stretch this maximum possible weight to 31000.00, but we found 303 that this dramatically slowed the run time of TNT. Thus when it came time to upweight 304 molecular topologies relative to morphological topologies, we instead assigned them 305 maximum weights combined with column (character) duplication. Column duplication is 306 identical to numerically upweighting character state changes or site likelihoods using 307 integer-valued weights, and is the method employed in model-based phylogenetic inference 308 tools such as RAxML (Stamatakis, 2014) and BEAST 2 (Bouckaert et al.) 2014). 309

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# Phylogeny Inference

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Metatree inference Prior to analysis, the final MRP matrix was subjected to Safe 311 Taxonomic Reduction (STR: Wilkinson, 1995) using the SafeTaxonomicReduction() 312 function in the R (R Development Core Team, 2019) package Claddis (Lloyd, 2016) and 313 an all-zero outgroup was added to provide character polarity during the tree search 314 (Baum, 1992; Ragan, 1992). We performed 1000 independent parallel tree searches using 315 TNT with the **xmult** option for multiple replications using sectorial searches, drifting, 316 ratchet and fusing invoked at level 10, and a maximum of 1000 trees held in memory 317 (Goloboff et al., 2008). We reinserted STR taxa using the SafeTaxonomicReinsertion 318 function in Claddis (Lloyd, 2016) and constructed a strict consensus tree from the final 319 sample of shortest trees. 320

*Time-tree Inference* The result of metatree inference is a set of most parsimonious 321 topologies that can be summarized using consensus methods. However, macroevolutionary 322 analyses require topologies with associated branch lengths in units of time. Paleontological 323 approaches for time scaling phylogenies have historically been somewhat arbitrary in 324 nature (for a review see Hunt and Slater, 2016). However, these approaches have recently 325 been superseded by probabilistic methods that allow for simultaneous inference of topology 326 and branch lengths for extinct and extant species under a birth-death process (Heath 327 2014; Gavryushkina et al., 2014, 2017). et al. 328

We combined three sources of data to sample a distribution of time-scaled phylogenies for extinct and extant cetaceans using BEAST 2.5.2 (Bouckaert et al.) 2014). We first used the strict consensus metatree topology to derive a series of topological constraints for each BEAST analysis. No character data were used for extinct taxa and so no morphological clock was invoked to derive branch lengths. In an analysis of extant taxa only, the resulting topological arrangements among unconstrained taxa would be random, but for extinct taxa they are influenced by stratigraphic age, via the use of the Fossilized

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birth-death process tree prior (Heath et al., 2014) Gavryushkina et al., 2014, 2017). As a 336 result, sampled topologies can be thought of as reflecting a balance between strong prior 337 belief, in the form of hard topological constraints derived from metatree inference, and 338 stratigraphic data. For each extinct terminal taxon in our strict consensus topology, we first 330 queried the Paleobiology Database to obtain the age of first occurrence. The age of each 340 taxon was then specified as the beginning and end dates for the stage of first occurrence, 341 based on the 2018 International Commission on Stratigraphy updated chronostratigraphic 342 chart (http://stratigraphy.org/ICSchart/ChronostratChart2018-07.pdf). Where 343 possible, we supplanted PBDB-derived ages, with more refined biostratigraphic or 344 radiometric age estimates taken from primary sources or previous phylogenetic analyses 345 and revisions (Table S1). 346

We selected a subset of the alignment from McGowen et al. (2009) for use in our 347 BEAST analyses. Molecular data can provide important information regarding the relative 348 branch lengths for extant taxa, particularly in clades lacking fossil representatives. 349 Preliminary attempts to perform BEAST analyses using the entire alignment yielded poor 350 mixing, even after very long (>  $10^8$  generations) runs. We therefore used SortaDate (Smith 351 et al., 2018) to identify and rank genes that were most congruent with the topology 352 reported by McGowen et al. (2009) and that displayed the most clock-like behavior. Based 353 on these criteria *Cytochrome B* was identified as the most appropriate gene and was used 354 in Bayesian estimation of topology and branch lengths (note that the same gene was used, 355 due to its availability for all 87 extant taxa, in McGowen et al. 2009) We determined that 356 an uncorrelated relaxed clock with log-normally distributed rates best fitted the molecular 357 data, based on comparison of marginal likelihoods computed for a fixed topology of extant 358 taxa (see Supplementary Information). We set informative priors on the net diversification 359  $(r \sim \text{exponential}[1.0])$ , and relative extinction rates  $(\epsilon \sim \beta [2.0, 1.0])$  based on Marshall's 360 2017 third paleobiological law that speciation  $\approx$  extinction), and placed a flat prior on 361 fossilization probability ( $s \sim U[0, 1]$ ). For the origin of the FBD process we specified an 362

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offset exponential prior, with an offset of 54 million years, corresponding to the age of the 363 oldest known cetacean *Himalayacetus subanthuensis* (Bajpai and Gingerich, 1998), and 364 mean of 3.5 that resulted in a 95% quantile corresponding to the Cretaceous – Paleogene 365 boundary (66 Ma). We ran two chains for  $10^8$  generations, sampling every  $10^5$  generations 366 and, after visually checking for convergence and parameter effective sample sizes > 200367 using Tracer v1.7.1, we discarded a chain–specific burn–in and combined tree files. 368 Attempts to produce a maximum clade credibility tree annotated with mean or median 369 branch lengths failed due to negative branch lengths, indicating conflict between the most 370 frequently sampled topology and the distribution of underlying branch lengths. Instead, we 371 sampled the Maximum A Posteriori (MAP) tree for visualization purposes and for 372 subsequent macroevolutionary analysis. 373

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# Inference of Diversification Dynamics

Analyses based on molecular phylogenies of extant cetacean phylogeny have 375 recovered evidence for an increase in mean net diversification rates during the past 10 Ma, 376 driven by increased rates of speciation in oceanic dolphins (McGowen et al., 2009; Steeman 377 et al., 2009; Slater et al., 2010; Rabosky et al., 2014). It is well known that inference of 378 trait evolution dynamics can be misleading when based on phylogenies of extant taxa alone 379 (Finarelli and Flynn, 2006; Slater et al., 2012, 2017) and some evidence suggests that 380 inference of cetacean diversification dynamics may suffer from similar issues (Quental and 381 Marshall 2010 Morlon et al. 2011). We used fossilBAMM (Mitchell et al. 2018) to infer 382 speciation and extinction dynamics for each of the MAP time-scaled cetacean metatrees. 383 As with the standard form of BAMM (Rabosky et al., 2014), fossilBAMM is a Bayesian 384 model-averaging approach that samples speciation and extinction rates along branches of 385 a phylogentic tree while allowing for shifts in one or both rates. The method requires a 386 bifurcating, time-scaled tree containing living and extinct taxa, as well as the number of 387 unique fossil occurrences for tips included in the tree. We queried the Paleobiology 388

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Database to recover unique stratigraphic occurrences associated with each terminal taxon 380 present in each of the three metatrees. Taxa not in the database (i.e., undescribed taxa) 390 were treated as having unique single occurrences. Prior to analysis, we also pruned 391 sampled ancestors from the MAP trees to avoid biasing estimates of speciation and 392 extinction due to very short terminal edges. We determined priors for each analysis by 393 using the setBAMMpriors function in the BAMMtools library (Rabosky et al., 2014) and ran 394 two independent MCMC chains for  $10^8$  generations, sampling every  $10^4$ . We checked for 395 convergence and large effective sample sizes using functions in the coda library (Plummer 396 et al., 2006) and processed post-burnin output using functions from the BAMMtools library 397 (Rabosky et al. 2014). To compare and contrast trends in diversification dynamics derived 398 from the three metatrees, we plotted median and 95% confidence intervals for speciation, 390 extinction and net diversification rates through time using the plotRateThroughTime() 400 function. To compare branch and clade specific rates, we also plotted mean per-branch 401 rates on the respective phylogenetic hypotheses. 402

### RESULTS

# Metatree Inference

Analysis of the 147 source studies (146 morphological plus 1 molecular) resulted in 405 an MRP matrix comprising 494 species, approximately two-thirds of all recognized 406 cetacean taxa, and 14257 binary characters. Safe Taxonomic Reduction reduced the size of 407 the matrix for analysis to 440 taxa. The strict consensus of 1000 most parsimonious trees, 408 after reinsertion of STR tips, is remarkably well-resolved (78% of nodes, Fig 4a) with 400 polytomies concentrated in basilosaurid archaeocetes, Balaenopteroidea (including extant 410 rorquals), squalodontid odontocetes, and the beaked whale genus *Mesoplodon*. Adding taxa 411 to the taxonomy source tree allowed us to increase taxonomic coverage but, without 412 additional data to place the new species, tended to lead to much less well resolved strict 413

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consensus topologies. Specifically, the percentage of resolved nodes dropped to 56% in the
GENUS tree (615 taxa, 14326 characters; Fig 4b) and to 29% for the ALL tree (746 taxa,
14344 characters; Fig 4c).

The lack of resolution in the ALL strict consensus metatree, in particular, poses 417 problems for reliable inference of topology and branch lengths during time-tree inference. 418 We therefore used Matrix Representation with Likelihood (MRL; Nguyen et al., 2012) to 419 generate a more stable estimate of topology for this dataset. We first switched the codings 420 of 50% of data columns selected at random, such that "0" became "1" and vice versa to 421 avoid violating the assumptions of the symmetric Markov models employed in 422 phylogenetics software. We then used RAxML v. 8 (Stamatakis, 2014) to find the 423 maximum likelihood estimate of topology under the BINCAT model with rate 424 heterogeneity disabled (-V option). Taxa removed during safe taxonomic reduction were 425 subsequently reinserted and the resulting tree was then used as a topology constraint for 426 BEAST analyses. 427

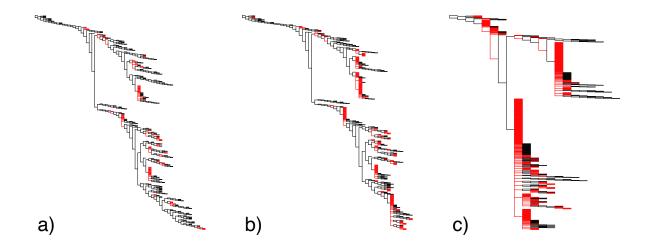


Fig. 4. Strict Consensus metatrees of cetaceans based on inclusion of a) 494 species–level OTUs from source trees, b) 615 species belonging to genus–level OTUs from source trees, and c) all 746 valid cetacean taxa recorded in the Paleobiology Database. Black edges represent those branches arising from bifurcating nodes. Red edges are those arising from polytomies either due to uncertainty in the MPT set or due to reinsertion of taxa that were removed prior to analysis during safe taxonomic reduction.

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# Time-tree Inference

The availability of stage-level or finer stratigraphic data reduced the number of 429 taxa from 494 to 487 for Bayesian estimation of topology and branch lengths for the 430 EXCLUDE dataset. Divergence time estimates among extant clades in the MAP tree (Fig 431 5) are broadly consistent with previously published estimates for cetaceans but the 432 inclusion of extinct taxa yields novel insights into the timescale of whale evolution. The 433 cetacean stem extends back to 51.3 Ma, with the divergence of the semi-aquatic 434 archaeocete clade Pakicetidae (*Pakicetus*, *Ichthyolestes*, and *Nalacetus*) from all other 435 cetaceans. Fully aquatic cetaceans (the Pelagiceti of Uhen, 2008) originate at 41.7 Ma with 436 the divergence of a clade comprising the paraphyletic Basilosauridae and Neoceti. The 437 time-scaled metatree emphasizes that many of the gaps along long internal branches of 438 molecular time-trees should be filled with now-extinct radiations. For example, the long 439 stem lineage leading to crown odontocetes that is implied by molecular phylogenies is filled 440 in by the radiations of Xenorophidae, Waipatiidae, Patricetidae, and Squalodontidae. The 441 former diversity of Physeteroidea and Platanistoidea is also apparent in the time-scaled 442 tree, despite the low diversity of these clades in modern times (3 and 1 extant species, 443 respectively). 444

Bayesian estimation of branch lengths on the GENUS and ALL datasets resulted in 445 larger time trees with more fossil taxa but yielded substantially older divergence times for 446 some crown clades than we found for the EXCLUDE dataset. To facilitate comparison of 447 our results to divergence time estimates derived from node-dated trees, we extracted mean 448 ages and their associated 95% HPD intervals for select crown clades and compared them to 449 those inferred by McGowen et al. (2019) using a genomic dataset. These estimates (Table 450 1) show that node age estimates are relatively consistent between the genomic tree and our 451 EXCLUDE metatree, albeit with the metatree generating slightly younger node ages. Node 452 ages for the GENUS and ALL datasets are, on average, a little older than those in the 453 EXCLUDE tree and more similar to those of the genomic tree. Balaenidae and 454

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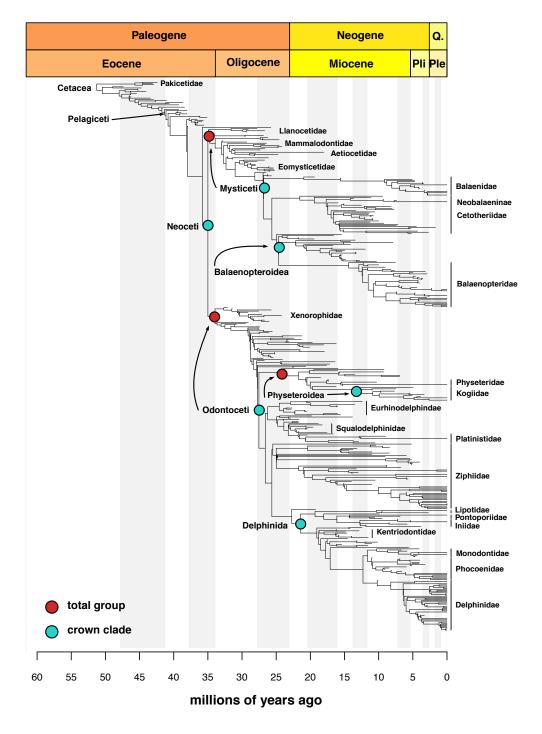


Fig. 5. Maximum *a posteriori* chronogram derived from simultaneous Bayesian inference of topology and branch lengths. The strict consensus metatree derived from analysis of species–level OTUs is used as a topology constraint with stratigraphic ages for extinct taxa and *Cytochrome B* sequence data for extant taxa used to help resolve polytomies. Shaded bars correspond to marine stages.

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<sup>455</sup> Delphinidae deviate substantially from this pattern, however, with mean age estimates

that are approximately 10 and 7 million years older, respectively, than the EXCLUDE

457 dataset and have 95% HPD intervals that do not overlap.

Table 1. Divergence time estimates (mean and 95% HPD intervals) for select crown clades from the genomic study of McGowen et al. (2019) and the three metatree analysis.

Clade	McGowan et al. (2019)	EXCLUDE	GENUS	ALL
Neoceti	36.7(37.5 - 36.4)	36.8(38.4 - 35.2)	37.8(39.3-35.4)	40.3 (42.0–38.3)
Mysticeti	25.7(26.7-25.2)	23.3 (28.1 - 24.4)	26.8(28.4-24.5)	28.7 (31.2 - 26.4)
Balaenidae	10.6 (12.1 - 9.2)	$6.9 \ (8.3 - 5.9)$	17.2 (18.4 - 15.5)	17.8 (19.6 - 16.0)
Balaenoperidae	$15.7\ (16.9-14.7)$	13.0(16.2 - 9.7)	15.9(18.5 - 12.3)	20.5(22.4 - 18.4)
Odontoceti	34.1 (34.9 - 33.7)	28.0(26.7 - 29.5)	28.6(29.7 - 26.8)	31.9(33.5 - 30.2)
Physteroidea	22.4(24.1 - 20.6)	21.0(23.2 - 18.4)	23.1 (24.5 - 21.2)	25.0(27.7-22.4)
Delphinida	$25.1 \ (26.1-24.2)$	21.4(23.7-19.2)	22.9(25.1 - 20.3)	23.2 (25.1 - 21.4)
Delphinidae	12.7 (13.6 - 11.8)	8.7 (10.6 - 6.7)	15.7 (16.7 - 13.8)	17.4(19.7-15.4)

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# Inference of Diversification Dynamics

Similar to analyses based on extant cetaceans alone, we found that net 459 diversification rates are relatively constant through time, but with a rapid increase in mean 460 net diversification rates beginning at approximately 10 Ma for the EXCLUDE MAP 461 chronogram. In contrast with inference from molecular phylogenies, this result arises not 462 only from a moderate increase in speciation rates, but also from a precipitous decline in 463 extinction rates over the same time frame (Figs  $\frac{6}{6}$  b,c). These average rates are clearly 464 emergent properties of more complex, clade-specific dynamics. The 95% credible shift set 465 for the EXCLUDE MAP tree contained 483 distinct configurations, with 2-6 shifts 466 recovered most often (Table 2). No individual configuration occurred with any meaningful 467 frequency (f = 0.055 or less). However, plots of mean per-branch speciation, extinction, 468 and net diversification rates show that elevated net diversification rates in mesoplodont 460 beaked whales, a result not previously identified in molecular phylogenies, result from 470 depressed rates of extinction against a backdrop of already low rates of speciation, while 471 rapid diversification rates in oceanic dolphins result from both elevated speciation and 472 depressed extinction rates (Figs 7a–c). 473

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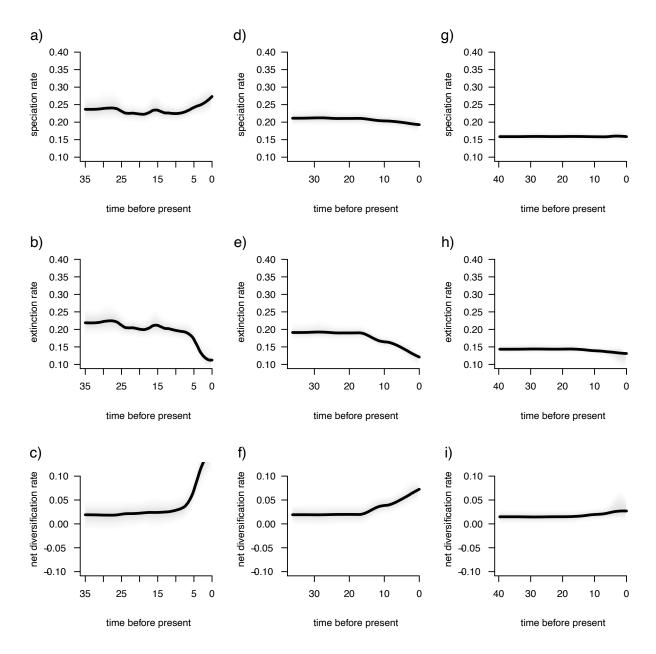


Fig. 6. Diversification dynamics through time inferred from the EXCLUDE (a:c), GENUS (d:f), and ALL (g:i) datasets suggest very different dynamics through time. Note that Speciation and Extinction rates are plotted on the same scale as each other, and as in Rabosky 2014 figure 9D:E) for extant cetaceans.

Increases in mean net diversification rates towards the present day are more muted in the GENUS chronogram (Figs 6 d-f). Although we recovered similarly declining mean extinction rates as for the EXCLUDE tree, we found no increase in mean speciation rates and, in fact, recovered a slight decline over this time-frame (Figs 6 d,e). The number of

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			/
N.Shifts	Exclude	Genus	All
0	0	< 0.01	0.46
1	< 0.01	0.51	0.23
2	0.14	0.36	0.18
3	0.29	0.09	0.10
4	0.23	0.02	0.02
5	0.17	$<\!0.01$	$<\!0.01$
6	0.11	0	< 0.01
7	0.03	0	0
8	0.02	0	0
9	< 0.01	0	0
10	0	0	0
11	< 0.01	0	0

Table 2. Posterior probabilities for numbers of rate shifts (N. shifts) on the 3 MAP time-scaled metatrees.

<sup>478</sup> inferred shifts is much lower for the GENUS dataset (Table 2), and only 83 possible <sup>479</sup> configurations are present in the 95% credible set. Mean per-branch rates (Figs 7d-f) show <sup>480</sup> that the more muted increases in net diversification for mesoplodontid ziphiids and ocean <sup>481</sup> dolphins arise from decreased extinction rates in these clades.

Rate variation is further dampened in the ALL analysis. Here, there is no increase 482 in mean net diversification rate and both mean speciation and extinction rates have 483 remained relatively low and constant, albeit with a very slight increase in speciation and 484 decline in extinction at approximately 10 Ma (Figs. 6g-i). Although a configuration with 485 no shifts was the most frequently sampled (Table 2), 154 alternative configurations are 48F present in the 95% credible set. Mean per-branch rates of speciation and extinction are 487 relatively homogeneous, but with very slight increases in speciation and decreases in 488 extinction rates, leading to slight increases in net diversification in delphinids (Figs. 7g:i). 489

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# DISCUSSION

The ability to infer comprehensively sampled phylogenies of extant higher-level clades has led to novel hypotheses regarding their macroevolutionary dynamics (Smith et al., 2009; Smith and Brown 2018; Jetz et al., 2012; Zanne et al., 2014; Cooney et al., 2017; Tonini et al., 2016; Jetz and Pyron, 2018; Rabosky et al., 2018; Upham et al., 2019; Varga et al., 2019). However, even a limited amount of data from fossil taxa can overturn

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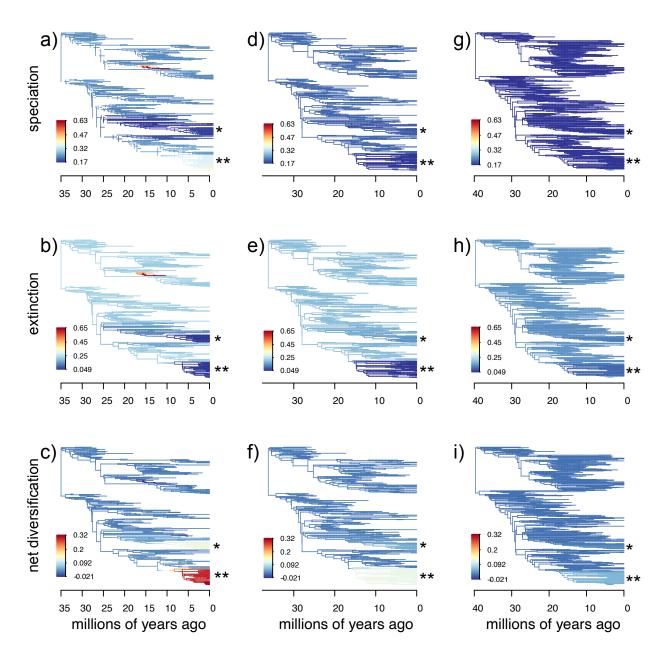


Fig. 7. Mean per-branch rates of speciaton, extinction, and net-diversification rates for the EXCLUDE (a:c), GENUS (d:f), and ALL (g:i) datasets. As in Figure 6 the top row is speciation rates, middle row is extinction rates, and bottom row is net diversification rate. The single asterix (\*) denotes mesoplodont beaked whales, the double asterices (\*\*) denote oceanic dolphins (Delphinidae). Note that the same scale is used for each plot to enable comparisons of absolute magnitudes of the underlying estimated rates.

well-supported hypotheses derived from analyses of extant taxa only (Finarelli and Flynn)
<sup>497</sup> 2006; Albert et al., 2009; Slater et al., 2012; Betancur-R et al., 2015; Meseguer et al., 2014)
<sup>498</sup> and it is likely that datasets consisting exclusively or primarily of fossil taxa are needed to

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test fundamental macroevolutionary hypotheses. The most substantial barrier to 490 implementing such tests has always been the difficulty in assembling robust, time-scaled 500 phylogenies for higher–level clades that contain sufficient numbers of fossil taxa. Our 501 well-resolved cetacean metatrees suggests that meta-analytic phylogenies can provide a 502 useful and compelling way of synthesizing studies of lower-level clades to produce 503 higher–level phylogenetic hypotheses for extinct taxa. Moreover, these trees provide an 504 accessible way of addressing questions of macroevolutionary importance using fossil data 505 and allow for the interrogation of results derived from phylogenies of extant taxa alone. 506

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# Implications for Cetacean Diversification

It has been recognized for some time that estimates of extinction rates derived from 508 molecular phylogenies may be problematic (Rabosky, 2010; Beaulieu and O'Meara, 2015). 509 Empirical studies have found that diversification rates estimated from molecular 510 phylogenies may be congruent with inferences derived from paleontological data but often 511 differ in the underlying estimates of speciation and extinction rates over time (e.g. 512 Simpson et al., 2011; Cantalapiedra et al., 2015; Hagen et al., 2017; Law et al., 2017). The 513 myriad ways in which speciation and extinction rates can vary to produce identical lineage 514 through time plots for phylogenies of extant species was recently emphasized by Louca and 515 Pennell (2020). One of the many implication of their work is that the dimensionality of 516 model space (that is, the number of possible combinations of time-varying speciation and 517 extinction rates) is too large to reliably identify the generating model when only extant 518 species are sampled and that robust inference of speciation and extinction rates through 519 time can only be achieved with densely sampled phylogenies that incorporate extinct and 520 extant lineages. 521

<sup>522</sup> One of the most striking results to emerge from our diversification analyses is that <sup>523</sup> variation in extinction rates, rather than speciation rates, have played a dominant role in <sup>524</sup> shaping extant cetacean diversity. It is, of course, a mathematical necessity that rates of

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speciation must increase or rates of extinction decline in order for net diversification rates 525 to increase. But, while many neontologists have (explicitly or implicitly) assumed a 526 dominant role for elevated rates of speciation in driving diversification in exceptionally 527 species-rich clades as a response to increased ecological opportunity (for reviews, see 528 Schluter, 2000; Glor, 2010; Stroud and Losos, 2016; Martin and Richards, 2019), 529 paleontologists have tended to recognize a role for extinction rate variation in facilitating 530 radiations over geologic time-scales (Jablonski et al., 1983; Van Valen, 1985; Labandeira 531 and Sepkoski, 1993; Valentine, 1990). However, the difficulty of inferring extinction from 532 molecular phylogenies means that the effects of extinction rate variation have received 533 little attention in phylogenetic contexts. Here, by incorporating fossil taxa in a 534 phylogenetic framework, we found that mesoplodont beaked whales emerge as a previously 535 unidentified rapid radiation. Despite accounting for 15 of 21 extant species Mead and 536 Brownell Jr (1993), this radiation is not characterized by elevated speciation rates but, 537 rather, by depressed extinction (Fig. 7b). Fossil evidence from diverse taxa has showed 538 that clade-level origination and extinction rates tend to be positively correlated (Stanley 539 (1979), meaning that clades with a higher instantaneous probability of speciating tend to 540 also have a higher long-term probability of going extinct (higher volatility: Gilinsky, 1994), 541 while clades with low extinction probabilities are more extinction resistant (Valentine, 542 1990). Recent work has found a strong link between ecological diversity and low volatility 543 across living and extinct clades of marine animals (Knope et al., 2020), suggesting that low 544 extinction at the clade level may arise due to factors such as ecological flexibility. 545 Unfortunately, too little is currently known about mesoplodont ecology to derive 546 reasonable hypotheses to explain their low extinction rates and macroevolutionary success. 547 Diversification studies based on extant cetacean phylogenies have consistently 548 identified the oceanic dolphins as a rapid radiation due to elevated speciation rates during 549 the past 10 myr (McGowen et al., 2009; Steeman, 2010; Slater et al., 2010; Rabosky et al. 550

<sup>551</sup> 2014). Although we still recover Delphindae as rapid radiation using a phylogeny of extant

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and extinct cetaceans, we find support for strikingly different underlying dynamics. While 552 there is still evidence for increased speciation rates in Delphinidae (Figs 6a; 7a), their 553 elevated net diversification rates are predominantly driven by dramatically decreased 554 extinction rates relative to other cetaceans (Figs 6b; 7b). One explanation for this finding 555 could be that dolphins are in the early phase of adaptive radiation within an unoccupied 556 adaptive zone, wherein speciation is rapid and extinction 0 due to a lack of competition 557 Simpson, 1953; Valentine, 1980; Van Valen, 1985). However, Stanley (1990) has argued 558 that, because so few clades break the strong correlation between origination and extinction 559 rates, those that do ("Supertaxa") likely possess uniquely advantageous combinations of 560 life history traits, such as low dispersal rates combined with large population sizes, 561 compared with related clades. The precise nature of the relationships that arise between 562 traits and speciation / extinction dynamics are complex and mechanism dependent (see, for example, Table 1 in Jablonski, 2008) but it is notable that delphinids are social and 564 ecologically flexible, while their diversification has previously been linked to 565 Plio–Pleistocene changes in ocean currents that resulted in abrupt, localized, soft barriers 566 to gene flow (do Amaral et al., 2018). A greater understanding of the multivariate 567 structure of life history traits with Cetacea (e.g., Pianka et al., 2017) may reveal more 568 insights into how Delphinidae has managed to break the speciation – extinction correlation 569 with such dramatic effect. 570

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### Paleo–Problems and Future Directions

Any phylogenetic hypothesis is only as robust as the data from which it is inferred. Ultimately the onus is on the user to ensure that the data are of sufficient quality and independence that the resulting tree(s) stand up to scrutiny (Bininda-Emonds et al., 2004). By establishing a formalized set of rules for dealing with data re-use, recovery of multiple optimal trees, and the use of OTUs corresponding to different levels of the taxonomic hierarchy, the metatree pipeline (Lloyd et al.) [2016) provides an explicit

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framework for ameliorating some of the criticisms and concerns leveled at earlier MRP 578 supertrees (Springer and de Jong, 2001; Gatesy et al., 2002, 2004; Gatesy and Springer, 579 2004 Page 2004). This is not to say that there are no concerns or areas for future 580 improvement with our approach. 581 MRP supertrees have been criticized on the basis that they can recover unique 582 clades that are not present in the profile of source trees (Wilkinson, 1995) 583 Bininda-Emonds, 2003 Gatesy et al., 2004). Few unusual clades emerge in our strict 584 consensus metatrees, but we do recover a unique Llanocetidae (Fig 5), consisting of 585 Llanocetus denticrenatus, Mystacodon selenensis, Niparajacetus palmidentis and ZMT62 an 586 undescribed taxon from New Zealand (Fordyce, 1989). Mystacodon's placement is not a 587 subject of concern; although the taxon was originally described as an earlier diverging 588 mysticete (Lambert et al., 2017) de Muizon et al., 2019) its placement within Llanocetidae 589 is in line with a number of recent studies (e.g., Fordyce and Marx, 2018; Marx et al., 2019; 590 Azucena Solis-Añorve and Gerardo González-Barba and René Hernández-Rivera, 2019). 591 The other two taxa have not been recovered as llanocetids in published sources 592 incorporated here, but their placements can be easily explained. ZMT62 features in a 593 single study, that of Geisler et al. (2017), and is figured (their Fig. 4) as the sister lineage 594 to a clade consisting of Mammalodontidae + Aetiocetidae and ((*Llanocetus*, 595 (Eomysticetidae, crown group mysticetes)). Inspection of the supplementary methods of 596 Geisler et al. (2017) reveals that this topology is derived from an analysis using implied 597 weights (Goloboff 1993), a procedure that has been shown to increase resolution at the 598 expense of accuracy (Congreve and Lamsdell) 2016), and that the authors' own analyses 599 using equal weights yield a topology with ZMT62 as the sister taxon to *Llanocetus*, as we 600 also found. The placement of *Niparajacetus* can be equally well explained. The original 601 description of this taxon included a bootstrap consenus tree rooted sequentially by the 602 archaeocete Zygorhiza and a selection of odontocetes, in which Niparajacetus is recovered 603 in a polytomy with *Coronodon havensteini*, Mammalodontidae, Aetiocetidae, 604

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Eomysticetidae and crown group mysticetes, and with Llanocetidae as sister to this clade 605 (Azucena Solis-Añorve and Gerardo González-Barba and René Hernández-Rivera, 2019) 606 their Fig.7). Our reanalysis of the character matrix yields an identical topology with one 607 exception: the odontocete outgroups are nested within mysticetes. Indeed, reproving the 608 tree on the odontocetes produces a topology in which *Niparajacetus* falls within a 609 monophyletic Llanocetidae, consistent with our metatree results. The recovery of this 610 previously unreported clade in the metatree can therefore be considered to result from 611 careful scrutiny of the input data, rather than a compromise between conflicting 612 relationships in figured topologies that might emerge from a traditional MRP supertree. 613 It is well understood that failing to account for unsampled taxa can bias inference 614 of diversification dynamics based on molecular phylogenies (Pybus and Harvey, 2000) 615 FitzJohn et al. 2009; Höhna et al. 2011). To overcome this issue, some authors have used 616 random birth-death resolutions, combined with taxonomic constraints, to integrate over all 617 possible placements of unsampled taxa (Kuhn et al., 2011). We used a similar procedure 618 here to include unsampled fossil species by using the Paleobiology Database's taxonomy as 619 a down–weighted constraint during metatree inference. There are reasons to be concerned 620 that this procedure may introduce a substantial source of error when inferring the 621 placement of unsampled species. Although cetaceans possess one of the most well-curated 622 set of records in the database (e.g., Uhen and Pyenson, 2007), a number of records of 623 uncertain or doubtful status exist that have dramatic impacts on downstream analyses. 624 For example, the Paleobiology Database records the taxon *Balaena dubusi* from the middle 625 Miocene of Belgium (Louwye et al., 2010), in turn implying a minimum age of 15 Ma for 626 the divergence of the sole extant member of the genus Balaena, the bowhead B. mysticetus 627 from the right whales *Eubalaena*. In our GENUS and ALL analyses, inclusion of this taxon 628 contributes to an increase in the mean age of crown group balaenids from 8.6 Ma in the 629 EXCLUDE analysis to ~ 18 Ma (Table 1). B. dubusi was described by Van Beneden 630 (1872) from a single vertebral column and Steeman (2010) has discussed the many issues 631

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surrounding taxa described from the Antwerp faunas, considering many as nomina dubia. 632 While the status of *B. dubusi* awaits formal re-assessment, it seems plausible that its 633 assignment to the extant genus *Balaena* is in error. It is likely that similar taxonomic 634 issues influence topology, branch lengths, and subsequent macroevolutionary inference in 635 other parts of the GENUS and ALL trees (Figures 67). Notably, the inference of older 636 divergence times for Delphinidae in these "more complete" trees than for the EXCLUDE 637 analysis may provide an explanation for the loss of signal for increased diversification rates 638 during the past 10 Ma. It should be noted that the birth-death polytomy resolution is not 639 without issue in molecular phylogenetics either, resulting in elevated relative extinction 640 rates  $(\mu / \lambda)$ , increased "tippy-ness" and more balanced trees than are found in empirical 641 distributions of trees (Kuhn et al.) 2011). The appropriate placement of unsampled extant 642 taxa similarly depends on the accuracy of taxonomic constraints used. However, the fact 643 that fossil taxa are non-contemporaneous means that they potentially exert more influence 644 on divergence time estimates (Soul and Friedman, 2015). The inclusion of unsampled fossil 645 taxa in meta-analytic phylogenies should always be carefully considered and justified and, 646 at least for cetaceans, we recommend that the EXCLUDE trees should be the preferred 647 hypotheses used in downstream analyses. More generally, these results emphasize that 648 uncritical use of paleontological databases in phylogenetic and macroevolutionary research 649 has the potential to produce flawed inferences and every taxon should, ideally, be vetted 650 against the literature to corroborate its status. 651

<sup>652</sup> A potential criticism of the metatree approach, as applied here, is that the resulting <sup>653</sup> posterior distribution of time-scaled topologies does not explicitly incorporate topological <sup>654</sup> uncertainty derived from the sample of input trees. Previous paleo-supertree studies have <sup>655</sup> attempted to accommodate topological and divergence time uncertainty by first obtaining <sup>656</sup> a subsample of most parsimonius trees and then using paleontological approaches to <sup>657</sup> generate multiple sets of branch lengths per tree (e.g., Clarke et al.) 2016; Lloyd et al., <sup>658</sup> 2016). Although some phylogenetic uncertainty is propagated through our BEAST

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analyses due to the use of the strict consensus metatree as a topological constraint, many 659 nodes were fixed (for the EXCLUDE tree in particular) due to the well-resolved nature of 660 the resulting estimate. Molecular phylogeneticists have employed a divide-and-conquer 661 approach called "backbone-and-patch" (Jetz et al. 2012; Tonini et al., 2016) Jetz and 662 Pyron, 2018; Upham et al., 2019), wherein topologies for densely sampled monophyletic 663 subclades are pasted onto time-scaled higher-level topologies, to obtain a pseudo-posterior 664 distribution of time-scaled topologies that can be used in comparative analyses. 665 Logistically, such an approach cannot work in paleontological contexts because it would 666 require assumptions of monophyly, which may vary between studies, and appropriate 667 character taxon matrices for both the backbone and patch clades, which are also lacking in 668 most cases. There is some cause to be optimistic that solutions can be found. Akanni et al. 660 (2015) used Markov chain Monte Carlo to sample the posterior distribution of rooted 670 supertree topologies under the exponential error model of Steel and Rodrigo (2008) and 671 found that the approach performed well in terms of topology inference, clade support, and 672 computation time. Efficient approaches for generating time-scaled trees of extinct taxa 673 that also appropriately accommodate topological and branch length uncertainty will 674 require similar Bayesian treatments. 675

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# Conclusions

Metatrees have some key benefits over traditional MRP supertrees that render them 677 ideal for comparative paleobiologists. Complete sampling of taxa from the source data is 678 always achieved, whereas a supertree can suffer when figured source trees collapse 679 non-focal clades (loss of resolution) or key outgroups are excluded (loss of overlap). 680 Additionally, a preferred method of inference (e.g., parsimony, maximum likelihood, or 681 Bayesian inference) can be applied when re-analyzing the source data and a preferred 682 output, such as a complete set of most parsimonious trees, maximum likelihood tree or 683 sample from a Bayesian posterior distribution, can be used for metatree inference. This 684

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latter step enables a more realistic inclusion of phylogenetic uncertainty in the resulting 685 composite phylogeny than can be accomplished through the use of published consensus 686 trees (see Bell and Lloyd 2015, their Figure 4). In other words, metatrees take more 687 information forward from the source data to the synthetic hypothesis than traditional 688 MRP supertrees do, and this tends to lead to better resolved topologies (Lloyd et al.) 689 2016). Most importantly, and as our comparative analyses demonstrate, the ability to 690 generate synthetic phylogenies containing large numbers of extinct taxa allows for the 691 critical assessment of macroevolutionary hypotheses derived from extant taxa alone. Here, 692 we showed that the apparent pulse of increased cetacean diversification during the past 10 693 myr is driven more by reduced extinction rates than by increased speciation, a pattern 694 long established in the fossil record but almost undetectable using extant species alone. 695 While a supermatrix, with character states coded for every extinct species, remains a 696 compelling standard for morphologists to strive for (Gatesy and Springer, 2004), supertrees 697 realistically provide the most direct and accessible route for generating large phylogenies 698 containing extinct taxa which, as simulations suggest (Slater et al., 2012; Louca and 699 Pennell, 2020) and our results show, are essential for obtaining accurate parameter 700 estimates and model inference from macroevolutionary and macroecological analyses. 701

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