- 1 **Title:** Inferring node dates from tip dates in fossil Canidae: the importance of tree
- 2 priors

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4 **Running head:** Tip-dating with fossil Canidae

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20 **Word count:** 2496 (title page + abstract + main text + 21 acknowledgements/funding/data statement + references + captions, minus these 22 word count lines) 23 24 **Abstract** 25 Tip-dating methods are becoming popular alternatives to traditional node 26 calibration approaches for building time-scaled phylogenetic trees, but questions 27 remain about their application to empirical datasets. We compared the performance 28 of the most popular methods against a dated tree of fossil Canidae derived from 29 previously published monographs. Using a canid morphology dataset, we performed 30 tip-dating using Beast 2.1.3 and MrBayes 3.2.5. We find that for key nodes (Canis, 31 ~3.2 Ma, Caninae ~11.7 Ma) a non-mechanistic model using a uniform tree prior 32 produces estimates that are unrealistically old (27.5, 38.9 Ma). Mechanistic models 33 (incorporating lineage birth, death, and sampling rates) estimate ages that are 34 closely in line with prior research. We provide a discussion of these two families of 35 models (mechanistic vs. non-mechanistic) and their applicability to fossil datasets. 36 **Keywords:** Tip-dating, total evidence dating, Canidae, MrBayes, BEASTmasteR, uniform tree prior 37

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Main text

"Tip-dating" methods allow for fossils to be incorporated as terminal taxa in divergence dating analysis. These methods require a tree model that allows non-contemporaneous tips. These models can be categorized broadly into two types: the non-mechanistic uniform prior on trees and node ages [1], and mechanistic models where trees are a function of speciation, extinction, and sampling rates, termed birth-death-serial-sampling (BDSS; [2]) or fossilized birth-death (FBD; [3]) models. Some BDSS/FBD model variants allow sampled ancestors (SA; [4, 5]). Importantly, tip-dating methods allow researchers to avoid relying on node calibrations. While "node-dating" approaches are valuable, they are subject to a number of well-known criticisms [1, 3, 6-8] such as subjectivity and incomplete use of information. Nodedating also weakens inferential capacity by requiring *a priori* constraint of nodes and dates that researchers would prefer to infer.

As a result of these analytical advantages, tip-dating methods are becoming popular. However, some studies using these approaches on empirical datasets have reached negative conclusions about the plausibility of inferred dates (references in Supplemental Material, SM). While tip-dating methods have been validated against simulations, it is debatable to what extent manufactured histories are comparable to the complexity of real evolutionary histories [9]. For empirical work, it can be

difficult to tell if problematic inferences in a particular study are due to the data, the methods, human error or a combination of the three.

It may therefore be useful to compare tip-dating inferences on a high-quality empirical dataset, one where the fossil record strongly corroborates key divergence times without Bayesian computational methods. An ideal dataset would also avoid difficulties found in classic dating questions such as the origin of angiosperms, placental mammals, crown birds, and the Cambrian phyla (Table 1). Suitable fossil datasets are rare, but one for which a decent argument (Table 1) can be made is the fossil Canidae (dog family; [10]). Monographs on the three Canidae subfamilies Hesperocyoninae [11], Borophaginae [12], and Caninae [13] combined cladistic analysis of discrete characters with expert knowledge of stratigraphy and continuous characters to produce species-level phylogenies dated to ~1-2 my resolution. We use Canidae to compare date estimates made under mechanistic (BDSS/FBD) and non-mechanistic (uniform tree prior) models to expert opinion. We conclude that reasonable date estimation requires an appropriate choice of tree prior, which may vary by paleontological dataset.

Methods

Data. The "expert tree" was digitized from the monographs of Wang and Tedford
[11-13] using TreeRogue [14], with judgment calls resolved in favour of preserving

the authors' depiction of divergence times (SM). Morphological characters and dates came from Slater (2015) [15, 16].

Tip-dating analyses. MrBayes analyses were conducted by modification of Slater's commands file. 58 variants of MrBayes analyses were constructed to investigate several issues noticed in the interaction of MrBayes versions and documentation, and Slater's commands file (SM, Appendix 1).

We compared the expert tree (Figure 1a) and Slater's published uniform tree prior analysis which included many node-date constraints (Figure 1b: mb1_orig) to six focal analyses (four MrBayes3.2.5 analyses and two Beast2.1.3). These were (1c) $mb1_UC$: Slater's analysis with various corrections; (1d) $mb8_UU$: uniform tree prior, uninformative priors on clock parameters, and no node date calibrations except for a required root age calibration, set to uniform(45,100) to represent the common situation where researchers wish to infer node dates rather than pre-specify them; (1f) $mb9x_SA$: $mb8_UU$ but with SA-BDSS tree prior and flat priors on speciation, extinction, and sampling rate; (1e) $mb10_noSA$: $mb9x_SA$ but noSA-BDSS, i.e. disallowing sampled ancestors; (1g) $r1_noSA$: Beast2 noSA-BDSS analysis with flat priors used for each major parameter (mean and SD of the lognormal relaxed clock; and birth, death, and serial sampling rates); (1h) $r2_SA$: Beast2 SA-BDSS analysis

with the same priors. Beast2 analyses were constructed with BEASTmasteR [17, 18]; full details on the analyses are in SM.

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Results

The six focal analyses are compared in Figure 1, and key priors and results are shown in Table S1. The unconstrained MrBayes uniform tree prior analysis (mb8 UU) produces estimates with implausibly old ages and huge uncertainties, and with the age of Canidae overlapping the K-Pg boundary. This behaviour was also noted by Slater [15]. The expert-tree dates of crown Canis (which includes Cuon, Lycaon, and Xenocyon) and crown Caninae are ~3.2 and ~11.7 Ma, but mb8_UU makes mean estimates of 27.5 and 38.9 Ma, and even the wide 95% highest posterior densities (HPDs), spanning 22-25 my, do not overlap expert opinion. More surprisingly, even Slater's highly constrained analysis (mb1_UC), although closer, does not produce HPDs (5.1-9.6 Ma; 17.8-25.5 Ma) that overlap previous opinion. In contrast, both Beast2 estimates (r1 noSA and r2 SA) and MrBayes noSA-BDSS (mb10 noSA, mb9x SA) are within \sim 1-2 Ma of expert estimates. HPD widths \sim 2-3 my). The date of total-group Canidae (node 3, Figure 1) matches the expert tree when it has been constrained (mb1 UC), but is 27 Ma older in mb8 UU, and consistently ~3-5 Ma younger in BDSS-type analyses.

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Additional comparisons are available in SM and Tables S1-S2, including comparisons of topological distances between the Bayesian dating estimates and an undated MrBayes analysis on the same data and posterior prediction of tip dates.

The SM and Appendix 1 also discuss difficulties observed in some non-focal runs.

Discussion

The result of greatest interest is the poor ability of uniform tree prior runs to approximate expert opinion in this dataset. Whether or not this is surprising may depend on researcher background. We suggest that reasoning from first principles suggests that effective tip-dating under the uniform tree prior will be difficult-to-impossible without strongly informative priors on node dates and/or clock rate and variability. Apart from such constraints, nothing in the tip dates or the uniform tree prior restricts the age of nodes below the dated tips; thus, in our fossils-only analysis, the node ages are scaled up and down as the root age is sampled according to the (required) root age prior. Without informative priors, the clock rate and variability parameters will adjust along with the tree height; highly uncertain node dates will result.

Despite what first principles suggest, we suspect our results may surprise some researchers. The MrBayes uniform tree prior was the leading model in the early tip-dating literature (11/16 papers as of mid-2015, 9 of them as the exclusive Bayesian

tip-dating method; SM), and until recently (October 2014, v. 3.2.3) the uniform tree prior was the only option available in MrBayes. Early tip-dating efforts in Beast/Beast2 required tedious manual editing of XML and/or elaborate scripting efforts (such as BEASTmasteR), whereas MrBayes was relatively easy to use. Therefore, many early attempts at tip-dating used the uniform tree prior. In contrast to the disappointing results with the uniform tree prior, analyses using BDSS/FBD tree priors (mb10 noSA, mb9x SA, r1 noSA, r2 SA) retrieved results that approximate previous age estimates. Given only the characters and tip-dates, and with uninformative priors on parameters and the root age, these analyses were able to estimate node ages that were reasonably close to expert opinion, because fossil sampling is good, limiting the age of nodes and allowing inference of the birth, death, and sampling parameters. Surprisingly, these analyses outperformed the uniform tree prior even when this analysis was given substantial additional information in the form of many node calibrations (mb1_UC). Even well constrained uniform tree prior analyses displayed a tendency to space node ages unrealistically evenly between calibrations and tip dates, regardless of morphological branch lengths (SM). Tip-dating with the uniform tree prior was explicitly introduced [1] as an

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alternative to node-dating, attractive because tip-dating avoided various

undesirable compromises that researchers are forced to make to when constructing node-age priors. Ronquist et al. [1] also critiqued Stadler's [2] BDSS prior as being "complete but unrealistic," particularly due to assumptions about constant birth/death/sampling rates and sampling in the Recent. They offered the uniform prior as an alternative, free of these difficulties. If, however, strongly informative priors on rates or node-date calibrations are required to produce reasonable results under the uniform tree prior, its main appeal is lost. The addition of BDSS/FBD models with sampled ancestors to MrBayes [5] suggests that the best prospects for tip-dating may lay in adding realism to mechanistic models, rather than in attempting to devise non-mechanistic, agnostic dating priors.

A major caveat in our study is that we did not attempt to study the effect of poorer fossil taxon sampling on the inferences made under different tree priors. Canidae are unusually well sampled. A more typical situation for researchers is one where a handful of fossils are available, but the true diversity spanned hundreds or thousands of species over the history of the clade (closer to the situation in the exemplar Hymenoptera dataset explored by [1, 5]). In such situations the uniform tree prior's performance may improve relative to BDSS-type models attempting to estimate mechanistic parameters from few data.

183	A great deal of work remains to understand how best to perform tip-dating
184	analyses. We have shown that for this high-quality dataset, mechanistic and non-
185	mechanistic models perform quite differently, and present an argument that
186	mechanistic models are more appropriate for this dataset.
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188	Data accessibility. All scripts, data files, and results files are available via a zipfile
189	on Dryad (doi:10.5061/dryad.750p8) [Backups:
190	https://drive.google.com/folderview?id=0B2S6mul1KaCdNk5iR1dieWxHX0U&usp
191	=sharing, or: https://github.com/nmatzke/Matzke_Wright_2016]
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193	Competing interests. We have no competing interests.
194	
195	Authors' Contributions. NJM wrote <i>BEASTmasteR</i> , conducted the Beast2
196	computational analyses and drafted the manuscript. AW contributed to MrBayes
197	dating efforts and edited and corrected the manuscript.
198	
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202 Paleontology tip-dating workshop/symposium. We also thank the BEAST 203 developers and the *beast-users* Google Group, particularly Remco Bouckaert. 204 205 **Funding.** NJM was supported by NIMBioS fellowship under NSF Award 206 #EFJ0832858, and ARC DECRA fellowship DE150101773. Work on this topic began 207 under the NSF Bivalves in Time and Space grant (DEB-0919451). AW was supported 208 by NSF DEB-1256993. 209 210 211 **Captions for Figures and Tables** 212 **Figure 1.** Comparison of (a) the ground-truth tree, to seven Bayesian dating 213 analyses (b-h) using the Slater (2015) characters and dates. As the ground-truth 214 tree's taxa do not perfectly overlap with the Slater taxa, key node dates are compared: (1) the common ancestor of crown (extant) Canis, (2) the common 215 216 ancestor of living Caninae, and (3) the common ancestor of the total group Canidae. 217 The ground-truth dates are given in (a), and the deviations from the ground-truth 218 are given in (b-h). The percentages represent the Mean Topological (RF) Distances between (b-h) and mb2_undated (average within-posterior distance=24.6%). Note: 219 220 The ground-truth tree lacks Slater's "outgroup" OTU (the branch below node 3).

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222	Table 1. Clade features that present challenges to tip-dating methods (or any dating				
223	methods). Canidae exhibit few of the issues that may confound dating in other				
224	clades (e.g. angiosperms, mammals, birds).				
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226	References				
227	[1] Ronquist, F., Klopfstein, S., Vilhelmsen, L., Schulmeister, S., Murray, D.L. &				
228	Rasnitsyn, A.P. 2012 A total-evidence approach to dating with fossils, applied				
229	to the early radiation of the Hymenoptera. Systematic Biology 61 , 973-999.				
230	(doi:10.1093/sysbio/sys058).				
231	[2] Stadler, T. 2010 Sampling-through-time in birth-death trees. <i>Journal of</i>				
232	Theoretical Biology 267, 396-404. (doi:10.1016/j.jtbi.2010.09.010).				
233	[3] Heath, T.A., Huelsenbeck, J.P. & Stadler, T. 2014 The fossilized birth-death				
234	process for coherent calibration of divergence-time estimates. <i>Proceedings of</i>				
235	the National Academy of Sciences 111, E2957-E2966.				
236	(doi:10.1073/pnas.1319091111).				
237	[4] Gavryushkina, A., Welch, D., Stadler, T. & Drummond, A.J. 2014 Bayesian				
238	inference of sampled ancestor trees for epidemiology and fossil calibration.				
239	PLoS Comput Biol 10, e1003919. (doi:10.1371/journal.pcbi.1003919).				
240	[5] Zhang, C., Stadler, T., Klopfstein, S., Heath, T.A. & Ronquist, F. 2016 Total-				
241	evidence dating under the fossilized birth-death process. Systematic Biology				
242	65, 228-249. (doi:10.1093/sysbio/syv080).				

- [6] Parham, J.F., Donoghue, P.C.J., Bell, C.J., Calway, T.D., Head, J.J., Holroyd, P.A.,
- Inoue, J.G., Irmis, R.B., Joyce, W.G., Ksepka, D.T., Patané, J.S.L., Smith, N.D.,
- Tarver, J.E., van Tuinen, M., Yang, Z., Angielczyk, K.D., Greenwood, J.M., Hipsley,
- C.A., Jacobs, L., Makovicky, P.J., Müller, J., Smith, K.T., Theodor, J.M., Warnock,
- 247 R.C.M. & Benton, M.J. 2012 Best practices for justifying fossil calibrations.
- *Systematic Biology* **61**, 346-359. (doi:10.1093/sysbio/syr107).
- [7] Pyron, R.A. 2011 Divergence time estimation using fossils as terminal taxa and
- the origins of Lissamphibia. *Systematic Biology* **60**, 466-481.
- 251 (doi:10.1093/sysbio/syr047).
- 252 [8] Wood, H.M., Matzke, N.J., Gillespie, R.G. & Griswold, C.E. 2013 Treating fossils as
- terminal taxa in divergence time estimation reveals ancient vicariance
- patterns in the Palpimanoid spiders. *Systematic Biology* **62**, 264-284.
- 255 (doi:10.1093/sysbio/sys092).
- [9] Hillis, D.M. 1995 Approaches for assessing phylogenetic accuracy. *Systematic*
- 257 *Biology* **44**, 3-16. (doi:10.1093/sysbio/44.1.3).
- 258 [10] Wang, X.T., Richard H. 2008 Dogs: their fossil relatives and evolutionary history.
- New York, Columbia University Press.
- 260 [11] Wang, X. 1994 Phylogenetic systematics of the Hesperocyoninae (Carnivora,
- 261 Canidae). *Bulletin of the American Museum of Natural History* **221**, 1-207.
- 262 [12] Wang, X.T., Richard H.; Taylor, Beryl E. 1999 Phylogenetic systematics of the
- Borophaginae. *Bulletin of the American Museum of Natural History* **243**, 1-391.

264	[13] Tedford, R.H.W., Xiaoming; Taylor, Beryl E. 2009 Phylogenetic systematics of
265	the North American fossil Caninae (Carnivora, Canidae). Bulletin of the
266	American Museum of Natural History 325, 1-218.
267	[14] Matzke, N.J. 2013 TreeRogue: R code for digitizing trees.
268	https://stat.ethz.ch/pipermail/r-sig-phylo/2010-October/000816.html
269	[15] Slater, G.J. 2015 Iterative adaptive radiations of fossil canids show no evidence
270	for diversity-dependent trait evolution. Proceedings of the National Academy of
271	Sciences 112, 4897-4902. (doi:10.1073/pnas.1403666111).
272	[16] Slater, G.J. 2015. Data from: Iterative adaptive radiations of fossil canids show
273	no evidence for diversity-dependent trait evolution. Dryad. Accessed May 1,
274	2015. http://dx.doi.org/10.5061/dryad.9qd51
275	[17] Matzke, N.J. 2015 BEASTmasteR: automated conversion of NEXUS data to
276	BEAST2 XML format, for fossil tip-dating and other uses. PhyloWiki.
277	http://phylo.wikidot.com/beastmaster
278	[18] Matzke, N.J. 2016 The evolution of antievolution policies after Kitzmiller versus
279	Dover. Science 351, 28-30. (doi:10.1126/science.aad4057).
280	

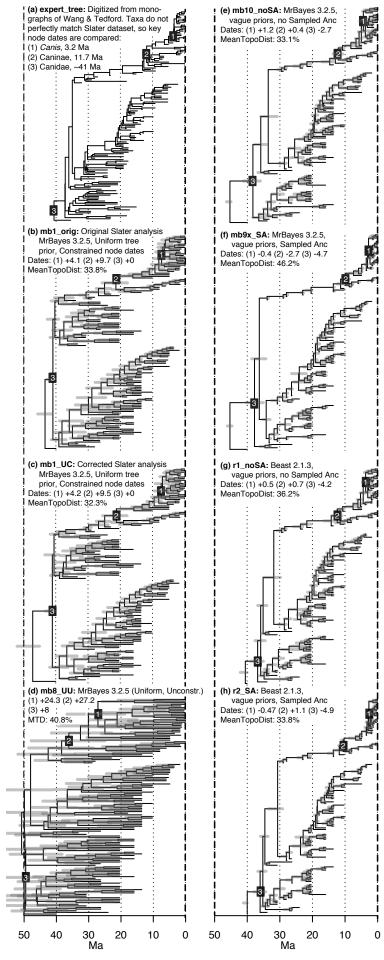


Table 1. Clade features that present challenges to tip-dating methods (or any dating methods). Canidae exhibit few of the issues that may confound dating in other clades (e.g. angiosperms, mammals, birds).

Clade features that make tip-dating challenging	Example clades with challenges	Canidae
Clade evolved into widely disparate niches	angiosperms, mammals; hominids (forest vs. savanna habitats)	Clade in about the same ecological niche (carnivore)
Clade spans a mass extinction and post- extinction diversification	mammals, birds	Approximately constant macroevolutionary regime
Clade has a massive worldwide radiation, and/or biogeographical history in region with weaker fossil availability (e.g. Australia)	angiosperms, mammals, birds, Australian marsupials	Mostly endemic to a single region (North America) for most of Canidae history
Fossils have few characters	angiosperms (pollen), bivalves	Canid fossils have many characters (100+), although more desired due to the number of extant/fossil taxa (160+)
Fossils episodic or scarce near possible clade origin	placentals, angiosperms, Cambrian arthropods	Fossils preserved continuously throughout clade history (40-0 Ma)
Morphological evolution affecting preservability	angiosperms (woody vs. herbaceous); Cambrian phyla (soft vs. hard parts; body size)	Approximately constant preservability
Likely changes in molecular/ morphological rate (due to major changes in body size, population size, growth rate, etc.)	angiosperms (woody vs. herbaceous, annuals vs. perennials)	Moderate change
Available coded fossils represent only a small proportion of total known diversity	E.g. O'Leary et al. (2012) placental dataset	Coded fossil diversity greatly exceeds extant diversity

Supplemental Material for Matzke and Wright (2016), "Inferring node dates from tip dates in fossil Canidae: the importance of tree priors"

Supplemental Introduction

Terminology. The methods we refer to as "tip-dating" methods are often called "total evidence" dating methods. As originally devised, these methods combined molecular and morphological data with tip-dates. However, in this study, we use a morphology-only dataset, but the models and methods are otherwise the same. So, we refer to the methods as "tip-dating" rather than "total evidence" in this paper.

Brief review of tip-dating studies. Major papers have introduced tip-dating methods and models [1-6]. A number of tip-dating studies have been published at the time of writing [4, 5, 7-23].

A review of this literature, while generally approving, shows that some studies consider some of their tip-dating results implausible (e.g. [9, 22, 24]), and some infer dates that are wildly uncertain [12, 17, 25]. Evaluation of the methods against each other, or against expectations based on the fossil record, is hampered by the complexity of Bayesian analyses: differences in results might be produced by differences in clock models, tree models, site models, priors (user-set or default) on any of the parameters used in these models, issues in implementation (bugs in the code, decisions about defaults, MCMC operators, etc.), user error in setting up the analysis or post-analysis processing, and/or issues with the data itself.

Canidae background. The bulk of canid evolution occurred in North America from the Eocene to present, and their fossil record is approximately continuous, with fossil diversity greater than extant diversity (approximately 35 living species, at least 123 well-described fossil taxa). In addition, the group has been thoroughly revised in three major monographs on the three subfamilies of Canidae: the extinct Hesperocyoninae (~27 species, 40-15 Ma; [26]), the extinct Borophaginae (~66 species, 34-2 Ma; [27]), and the extinct and extant Caninae (>40 fossil species, 34 Ma-present; [28]). All living dogs thus represent a small surviving branch, originating 10-12 Ma, of a much more massive tree of fossil Canidae. Thus, apart from utility for methods testing, the Canidae serve as a useful group for comparing trait evolution inferences made with living-only versus living+fossil datasets [19, 29, 30].

Further caveats on the Wang/Tedford Canidae tree.

An early version of this manuscript suggested that the Canidae tree might serve as a "ground truth" dataset for phylogenetic dating methods. (Therefore, various filenames in Supplemental Data reflect this language, although we have changed it in the manuscript.) "Ground truth" is a term taken from remote sensing [31], where researchers visit points on the ground to measure the accuracy of statistical classifications of landscape features from satellite imagery (e.g. primary forest versus secondary forest versus grassland). Subsequent discussion

indicated that using the term "truth" raised philosophical questions about what "the truth" means, whether or not "good approximations" can count as "ground truth", whether or not approximate truth about key focal dates can be valid even while fine-scale topological issues are unresolved, etc. While the term "ground truth" is a commonplace in geography, and does not carry the connotation of absolute precision or perfect knowledge of the truth, introducing it to phylogenetics would require a larger discussion than is possible here. Therefore, this study focuses on comparing Bayesian inference to previous expert opinion.

Several points should be considered by researchers making use of the Wang/Tedford expert tree as a test dataset for phylogenetic methods. While Wang and Tedford are indeed extremely accomplished experts, their dated trees are still subjective to a degree, constituting hand-drawings built on a maximum-parsimony tree, using stratigraphic consistency to resolve some polytomies, and then using stratigraphy, continuous traits and additional data and expert judgment to subjectively place uncoded specimens and to depict ancestral-descendant relationships. In addition, the Wang/Tedford tree does not perfectly match the molecular tree for living Caninae, and the reciprocal monophyly of the subfamilies may not be as secure as Wang/Tedford assumed (Graham Slater, personal communication). These points are significant for various individual nodes, but we believe that the three main node dates we use for Figure 1 would not be affected by these issues.

A second potential criticism that could be raised is that paleontological timetrees, as a general rule, are not hypotheses about divergence times: they depict taxon stratigraphic ranges and cladistic relationships, but the node spacing below the stratigraphic ranges is arbitrary. This is indeed usually the case, but Tedford and Wang actually went a fair bit beyond usual practice. For example, they actually did not adhere to common paleontological practices such as (a) always forcing nodes below stratigraphic ranges according to something like a 1-Ma minimum branch length (MBL) approach; (b) forcing sister taxa with overlapping stratigraphic ranges to have their ancestor node below the first occurrence of both species; or (c) relying on stratigraphic ranges of higher taxa (genera etc.) made up of occurrences of specimens that may not be identified to species.

Instead, Tedford and Wang (for the most part) depict species-level stratigraphic ranges. They depict these time ranges at sub-million-year resolution, and they allow direct ancestors and paraphyletic species rather than forcing cladistic sister taxa to be reciprocally monophyletic in the time tree. Furthermore, the fossil species diversity is often equal to or greater than the living species diversity, and the sampling of species through time is unusually through (meaning that dramatic range extensions of most of these species are not likely -absence in sampling at a time point is likely reasonably good evidence of true absence at that time point, particularly past a few million years).

In this case, therefore, we think we are more justified than one would usually be in taking the expert paleontological tree as a source of comparison dates. Another way to consider the question is the following: in the case of Canidae,

what is likely in terms of future discoveries about modifications and extensions of species stratigraphic ranges? Are we likely to see *Canis lupus* (current time range \sim 0-1 Ma) range-extended back to 15 Ma? Are we likely to find a crown Caninae (crown age \sim 12 Ma) older than all of the stem Caninae *Leptocyon* species, of which 11 or so are known that range from 7-34 Ma?

Such issues are indeed likely common in many clades studied by palaeontologists, but are much less of an issue in Canidae. We believe that a reasonable summary of the situation is that Tedford and Wang's semi-subjective hand-drawn plots are likely to be better estimates of a dated history than almost any dating analysis for almost any other fossil group (foraminifera might be an exception). This statement is admittedly less true for the Hesperocyoninae part of the tree, as discussed elsewhere.

Supplemental Methods

Expert tree. The expert tree was digitized using TreeRogue [32], with judgment calls resolved in favour of preserving Wang and Tedford's depictions of divergence times. The source figures were, specifically, Figure 65 of Wang (1994) [26]; Figure 141 of Wang et al. (1999) [27]; and Figure 66 of Tedford et al. (2009) [28]. Digitization resolution was <1 my, undoubtedly more precise than either the expert estimate or any Bayesian inference.

A plot of the tree, and a lineages-through-time plot, are available in Supplemental Figure 1. The Newick file is Canidae_ground_truth.newick (Supplemental Data).

Data. Morphological characters and dates came from the published matrix of Slater (2015) [19], specifically the Dryad repository [33] containing a NEXUS file with both morphology and MrBayes commands. Slater's matrix synthesized and updated the matrices published in the monographs by Wang and Tedford.

The data (characters and tip-dates) were left unchanged, except that no non-North American species were removed. Slater used last-occurrence dates for the tip-date of each species; for the purposes of tip-dating, this decision might be suboptimal, because a specimen bearing characters may sample from anywhere in a species' time-range. However, the nature of OTUs in tip-dating analyses is a complex question not yet addressed in the literature (Matzke and Irmis, this volume). Therefore, Slater's tip dates were retained for purposes of simplicity and direct comparability. Slater also used extensive node calibrations to represent the stratigraphic first occurrences of many taxa; these are reasonable given Slater's goal (fitting models of trait evolution), but node calibrations obscure the differences between tip-dating methods and so they were deleted from most analyses here.

Terminology for analyses. There appears to be variation in the literature and in the program documentation of MrBayes 3.2.x and Beast2 regarding the exact models being referred with terms such as "birth-death serial sampling" and "fossilized birth-death" process. Therefore, we are adopting the terminology of

"SA-BDSS" and "noSA-BDSS," following the usage of the Bapst et al. (in review, this issue).

"SA-BDSS" refers to:

- Beast2 "SABD" model (which approximate equals, or is supposed to be very similar to)
- MrBayes FBD with Sampled Ancestors
- Or, sometimes it is called just "Fossilized Birth-Death" (e.g. Gavryushkina et al 2014)
- MrBayes with these settings:
 - prset brlenspr=clock:fossilization;[BDSS instead of uniform node age prior]
 - prset samplestrat = random;
 [possible some tips are sampled ancestors; available starting with MrBayes 3.2.5]

"noSA-BDSS" refers to:

- Beast2 "BDSS"
- Beast1 "BDSS" (these approximate equal, or are supposed to be very similar to)
- MrBayes FBD without Sampled Ancestors
- Or sometimes it is called just "Transmission Birth-Death" (e.g. Gavryushkina et al 2014)
- MrBayes with
 - prset brlenspr=clock:fossilization [BDSS instead of uniform node age prior]
 - prset samplestrat = fossiltip;
 [no sampled ancestors, every tip goes extinct; available starting with MrBayes 3.2.2]

MrBayes analyses.

The 6 focal analyses presented in the main text are mb1_UC (Slater's original uniform tree prior analysis including node date calibrations, with some corrections), mb8_UU (uniform node age prior, unconstrained node dates, flat priors on clock parameters, uniform(45,100) prior on the root age), mb9x_SA (mb8_UU but with SA-BDSS tree prior and flat priors on speciation, extinction, and sampling rate), and mb10_noSA (mb9_SA but noSA-BDSS, i.e. disallowing sampled ancestors via the command "prset samplestrat = fossiltips;").

These focal analyses were selected out of a much larger collection of MrBayes analyses (58 total) that were run while experimenting with modifications of the original Slater (2015) NEXUS file. A summary of the variant inputs, and the results, is presented in Supplemental Table S2. Apart from the issues surrounding the uniform tree prior versus birth-death tree priors, which are the topic of the main text, Appendix 1 identifies other issues noticed in the interactions between in the Slater NEXUS file, the MrBayes implementation, and documentation.

All MrBayes analyses (following Slater's settings) ran for 5 million generations (sampling every 2500), with 2 runs, 4 chains. (The only exceptions were 3 analyses run with varying temperatures, and another 4 runs aimed at improving the unsatisfactory topological result of the original mb9_SA run, and 8 exploratory runs (conducted in the review stage) with MrBayes 3.2.6; see Supplemental Table S2). Typically this was sufficient for convergence as assessed in Tracer plots and MrBayes output statistics. For a few non-focal runs (Supplemental Table S2) it was not. Sometimes this was due to improper settings, although Table S2 shows some unusual behavior in some MrBayes SA-BDSS runs even after settings were corrected to the best of our ability. As the purpose of many of the runs was exploratory, to determine the effects of certain versions, models, or settings (i.e. including problems with convergence), no effort was made to improve sampling further (except for the mb9 variants mentioned above). The Perl scripts burntrees and catmb [34] were used to extract the last 50% of each tree sample and convert to dated trees. The mb9x SA run, selected for Figure 1, is one of the mb9 variants run for much longer (100 million generations) and at the default temperature (0.1, instead of Slater's 0.5), in order to minimize the chance of displaying an uncharacteristic result.

Justification of using fixed tip-dates in this study. We deliberately decided to use Slater's (2015) fixed tip-dates (which were last-occurrence dates), even though they are not necessarily ideal from the perspective of obtaining a "best possible" dating analysis and maximum matching between dating analyses and the expert tree. This was done for several reasons:

- 1. Direct comparability between the Slater analysis, the variant analyses here, and the expert tree (where the tips terminate at the last occurrence of the lineage, a practice also followed by Slater).
- 2. Isolation and identification of the effect of methodological choices (meaning specifically: settings in the computer programs, such as choice of tree/node age priors) on dates. If the tip-dates are varying, this could be the cause of any difference observed, confounding the comparison.
- 3. The best practices for incorporating species' stratigraphic ranges in tip ages are, at the moment, unresolved in the literature. It appears to be becoming standard practice that, for species with stratigraphic ranges, the species' stratigraphic ranges are input as uniform priors on the tip dates. However, this decision assumes that the following two things are identical:
 - a. A fossil specimen has a date that is uncertain, so the tip gets a Uniform prior across this date range.
 - b. A fossil taxon has a stratigraphic range, so the tip gets a Uniform prior across this date range.

While (a) is correct, (b) actually represents multiple specimens. It could be argued that, given knowledge of a fossil species, its stratigraphic range, and the assumption (perhaps a big one) that the

character states do not change within the species over the stratigraphic range, then for all we know, those character states might have been sampled from any time point within the species' stratigraphic range.

However, this might or might not be a reasonable approximation of reality. More appropriate strategies might be:

- c. The researcher codes many individual specimens and then puts them into the analysis as separate tips with separate specimenspecific date priors. This, of course, involves vastly more work and perhaps much more wrestling with incomplete specimens and the like.
- d. Take the character states for the OTU and create a number of duplicate OTUs with identical character states, perhaps one for each relevant stratigraphic unit where the species has been found. This would be much easier than (c), but involves creating data.

Which strategies are computationally feasible (creating many OTUs may fatally slow down MCMC searches) and/or acceptable approximations are basically unexplored in the literature at present.

4. Finally, a "best possible" dating analysis would include DNA (which exists for virtually all living dog species, and some extinct ones) in a total evidence analysis, which again introduces issues beyond those we choice to explore in this study.

Resolution of point #3 will take additional focused studies, which cannot be done here. And, the goal of the present study is to evaluate which tip-dating methods are "in the ballpark," which is a question that needs to be answered before much more elaborate and time-consuming analyses of canids are done.

Justification of a broad prior on the root age. For most of the dating analyses (the replications of Slater's intended analysis – mb1_orig and mb1_UC – are the exceptions), we set a broad, uninformative prior on the root age: Uniform(45, 100). The minimum age was set to match Slater's minimum age for Canidae+the outgroup, and the maximum was set to represent the situation where no useful information is supplied to the analysis about the age of the root. We did this because, in many real-life dating situations, the part of the point of the dating analysis is to *infer* the age of the root and nodes near the root, rather than have it be constrained *a priori* by an informative prior.

Readers who wish to see what a uniform node-age prior analysis would look like with a reasonable, informative prior on the root age may consult the mb1_UC analysis. This analysis has many additional node constraints, but a "no constraints except for an informative root age prior" analysis would fall between mb1_UC and mb8_UU.

Comparing key node dates between the expert tree and the Bayesian inferences. The three nodes chosen for comparison in Figure 1 represent the time of origin for major taxa in Canidae. The definitions used here are:

- Node 1. Crown *Canis*: Common ancestor of all living *Canis* in the tree (including *Cuon*, *Lycaon*, and *Xenocyon* included inside of *Canis*, as it is known to be paraphyletic with respect to these taxa; [28]).
- Node 2. Crown Caninae: The common ancestor of living *Canis* in the tree (*Canis, Cuon, Lycaon*, and *Xenocyon*) and living foxes (*Urocyon* and *Vulpes*). This node is the common ancestor of all living Canidae.
- Node 3. Total Group Canidae: the common ancestor of all living and fossil species in the dataset, excluding Slater's "outgroup" OTU.

These three nodes were used as the primary evaluation method because:

- a. They represent "important" nodes Nodes 1 and 2 would be important calibration points in node-dating studies, and Node 3 represents the origin of the group.
- b. The Wang/Tedford expert tree and the Slater character matrix do not overlap perfectly in their OTUs. This can be solved by reducing both trees to the set of common OTUs, but such trees might shift the meaning of crown group nodes if key taxa are left out.
- c. Node ages will be highly correlated with each other across the tree (older trees will tend to have most/all nodes older), so it is debatable if analysing dozens of node dates provides a great advantage over analysing a few key node dates.
- d. When many nodes are analysed, for example with regressions, there is a tendency to interpret these as detailed statements about the biases of the models. We have included these regressions in Supplemental Data, but we warn that they cannot bear the weight of representing detailed statements about the biases of the models. For example, as discussed elsewhere, the fact that the BDSS-type analyses infer ages younger than the expert tree at the bottom of the tree is very likely due to the use of Slater's last-occurrence dates at the tips, using fixed dates, and the lower actual rate of sampling fossils for the Hesperocyoninae, when the analyses we have conducted assume constant sampling rates.

Attempting to improve MrBayes SA-BDSS inference. The topological result of the original mb9_SA SA-BDSS run was unsatisfactory in that wild dogs (*Lycaon pictus*) and the dhole (*Cuon javanicus*) came out as a clade within the extinct Borophagines. It was suggested that adding more runs and varying temperatures might help. We attempted this by changing the number of runs from the default 2 to 4, and then running three analyses with different temperatures: 9a (4 runs, temperature=0.05), 9b (4 runs, temperature=0.5, the default), and 9c (4 runs, temperature=1). These runs are numbered 36a, 36b, and 36c in Supplemental Table S2. Further runs consisted of a series of replicate runs for 100 million generations, varying (a) settings with nruns=1, nchains=4 versus nruns=2,

nchains=4; (b) settings with temperature=0.5 versus temperature=0.1; and (c) MrBayes 3.2.5 versus MrBayes 3.2.6. The results of these runs are also listed in Table S2. Overall, the extra runs indicated that mb9_SA was an unusual result, and most runs on most settings retrieve a more conventional topology. An example of a run with a conventional topology is reported in Figure 1 as mb9x SA.

Beast2 analyses. BEASTmasteR was used to construct the XML files for two Beast2 tip-dating analyses; the R scripts and Excel settings files are available in SM. The first analysis (r1_noSA) used a noSA-BDSS tree prior [35]; the second (r2_SA) used SA-BDSS [2, 3]. Flat priors were used for each major parameter (mean and SD of the lognormal relaxed clock; and birth, death, and serial sampling rates). Rho (proportion of living species sampled) was fixed to 1, as it is not statistically identifiable if left free in noSA-BDSS [36], and the dataset is relatively complete, at least for widespread species in North America (where the vast majority of the fossil record is located). Although rho is identifiable in SA-BDSS [2], we kept the same setting to ensure direct comparability across analyses. All runs in both programs used a single morphology partition, with an Mkv model correcting for the ascertainment bias against invariant characters [37, 38] and gamma-distributed rate variation with 4 rate categories.

The Beast2 analyses were run for 50 million generations (sampling every 25000). For all runs, TreeAnnotator was used to choose the Maximum Clade Credibility (MCC) tree and calculate node-date HPDs (95% highest posterior densities) and bipartition posterior probabilities (PP). Burntrees [34] was used to process MrBayes outputs for input into TreeAnnotator.

BEASTmasteR [39] and custom R scripts (Supplemental Data) were used to plot all MrBayes and Beast2 MCC trees, as well as the trace plots for all key parameters (SI), and to extract parameter and node-date estimates of interest. To assess the overall estimate of topology in each analysis, the topological symmetric distance (treedist function; phangorn R package; [40]) between the dated MCC tree and the MCC tree from the undated (mb2_undated) analysis was calculated and compared to the distribution of distances between trees in the mb2_undated post-burnin treecloud [41].

For the six focal analyses, an additional test was run to see how well the methods could predict selected tip dates [20]. Four tips were selected from across the tree (*Canis ferox*, 3.5 Ma; *Epicyon haydeni*, 5.3 Ma; *Leptocyon gregorii*, 23 Ma; *Hesperocyon gregarious*, 30.8 Ma). For each tip and focal analysis, the settings file was modified to change the tip date to a uniform(0,100) prior. After the MCMC run, the sampled tip date was extracted from the post-burnin tree sample and plotted as a histogram.

Supplemental Results

Summary results of all 40 variant analyses are presented in Supplemental Table S2 (supplemental Excel file). Trace plots of key variables for all 40 analyses are

available in Supplemental Data (file *Canidae_traceLogs.pdf*). Plots of the MCC trees for all 40 analyses are also available (*Canidae_treeLogs.pdf*).

Rate parameters. Estimates of rate parameters in the focal analyses are consistent with the dating results, in that analyses with the youngest node age estimates have the highest clock, speciation, and sampling rates. The parameter describing the mean of relaxed clock branchwise rate variation (IGRvar for MrBayes, clockSD for Beast2) was inferred with similar precision across all analyses, despite uninformative priors, suggesting no special effort is needed to determine the prior for clock relaxation (clock models with autocorrelated rates may be different; [5]). The uncorrected Slater analysis does show the effect of the IGRvar prior used there (the intention was a diffuse prior, but the setting used forced a close-to-strict clock instead; see Appendix 1); however, the downstream effect on the analysis was minimal.

Topological distances between Bayesian posterior tree samples and expert tree. Comparing topological distances (Table S1) provides a more systematic assessment of topology differences between analyses. Randomly chosen trees in the post-burnin posterior distribution of Slater's undated MrBayes analysis (mb2_undated; SM) have a mean symmetric distance of 31.0% (95% C.I.=±8.3%). The dated MCC trees of all 8 focal analyses fall within this range, except for the MrBayes-uniform and -SA-BDSS analyses (which both have significantly higher topological distances).

Correlation between estimated and true node dates. A heuristic view of the correlation between date estimates and expert tree dates is shown in linear regression plots (Supplemental Data, file <code>expert_vs_estimated_node_ages.pdf</code>) comparing the ages of nodes that are shared between the expert tree and estimated tree (i.e., have the same descendant OTUs after removing OTUs not shared by both trees; 127 OTUs were shared). These regressions should be taken as heuristic exploration of the inference biases resulting from the of the combination of data, priors, and methods used in this study, rather than definitive statements about the biases of the methods in all situations.

While all analyses have statistically significant correlation to expert tree ages, mb8_UU has a lower R^2 (0.71) than the others (>0.9), and also has a systematic bias towards older ages (intercept=6.67±2.94; for other analyses intercept is ~0-1). All of the BD analyses have a bias towards underestimating dates near the base of the tree, where the expert tree is dominated by Hesperocyoninae, with a lower density of fossil OTUs and thus longer branches; the BD methods tend to infer shorter branches here, leading to younger ages. This bias leads to an underestimation of ages by about 2 my at age 20 Ma, to 4-5 my at 30 Ma.

Posterior prediction of tip dates. Prediction of tip dates (Supplemental Data) generally succeeded in overlapping the true value, although uncertainty is usually high (5+ my) and extreme in the case of mb8_UU (17+ my). SA-BDSS analyses consistently produce younger date estimates than noSA-BDSS analyses, but the effect is small (\sim 1 my).

MrBayes SA-BDSS topology and convergence issues. The disagreement between the original MrBayes noSA-BDSS and SA-BDSS (mb10_noSA and mb9_SA) analyses about the position of the wild dogs (Lycaon pictus) and dhole (Cuon javanicus) was puzzling, because both analyses place this clade with a sister with posterior probability 1.0; they just disagree on whether that sister is Xenocyon texanus (in Caninae) or Desmocyon thomsoni (in the extinct Borophaginae). In undated analyses (mb2_undated), the clade has a relatively long morphological branch, and this may make it more difficult to place; however, further MrBayes runs (see Supplemental Methods) tended to place these taxa within Canini, so we report one of those longer runs in Figure 1 (mb9x_SA; see Supplemental Table S2).

Supplemental Discussion

Uniform tree prior and spacing of node dates. We have observed that even well-constrained analyses using the uniform tree prior appear to exhibit a tendency to have "unrealistically even" spacing of node ages between calibrations and tip dates, regardless of morphological branch lengths. This can be seen in our mb1_UC analysis, for example in the old age for crown Canis. We have also observed the phenomenon with other datasets, and it seems to be a feature of published uniform tree prior analyses as well. Admittedly we have not devised a way to quantify the observation of "unrealistically even" node date estimates, but the phenomenon does appear to be real, at least when uniform tree prior results can be compared side-by-side to the expert tree and noSA-BDSS/SA-BDSS trees (e.g., mb1_UC vs. mb10_noSA, r1_noSA, r2_SA), or to undated trees (e.g. mb2_undated).

Caveats about the accuracy of inferred ancestors. The only point we would make regarding inferring ancestors is that our Sampled-Ancestor analyses tend to retrieve some of the ancestors that were postulated by Wang and Tedford – most prominently, *Leptocyon* species as ancestral to Caninae. We note that this is encouraging, but we caution that our study is not intended as a detailed examination of the accuracy of inferring direct ancestors, although the Canidae dataset might prove to be useful for such a study in the future.

Informally, in experimenting with SA-BDSS analyses on various datasets, we have found that they tend to infer a fair number of direct ancestors both on datasets where the sampling of fossil species diversity is likely to be reasonably thorough (as in Canidae), but also in situations where it is not (for example, dinosaurs). Accurately inferring direct ancestors is much more likely to be plausible in the former situation than the latter.

Future work on this point should carefully examine the issue of how much of true fossil diversity is being sampled and whether or not this is being thoroughly taken into account; a key question may be the interpretation of the BDSS rho parameter for fossils-only datasets, as rho typically means "proportion of extant species sampled in the present." For example, if the group is extinct, rho should be 0, and sampling rate inferred – but we may have some prior belief about true fossil diversity versus the fossil diversity captured in the data matrix.

Captions for Supplemental Figures, Tables, and Data

Supplemental Figure S1. Top: plot of the expert tree, derived from digitization of the phylogenies of Canidae published in the monographs of Wang and Tedford, using TreeRogue. Bottom: Lineages through time plot of the expert tree.

Supplemental Table S1. Five Bayesian tip-dating analyses are compared to (column 1) the conclusions of Tedford & Wang. The two Slater analyses (original, and a modification repairing some unintended issues; cols. 2-3) represent MrBayes analyses under a uniform node age prior, constrained by both tip dates and many node-date priors. The third run (col. 4) shows the effect of removing the node-age calibrations, and putting flat priors on the parameters for clock rate and variation. The fourth run (col. 5) shows the drastic effect of switching to a fossilized birth-death prior. Columns 5 and 6 show Beast2 analyses with flat clock priors and noSA-BDSS and SA-BDSS tree priors, respectively. These five analyses are drawn from the 60 analyses shown in Supplemental Table S2.

Supplemental Table S2. Summary settings and results of all 60 tip-dating analyses. As the table is large, it is presented as an Excel file.

Supplemental Data Files

canidae_traceLogs_ALL_v2.pdf -- Trace plots of key variables for all 60 analyses.

canidae_treeLogs_ALL_v2.pdf -- Plots of the MCC trees for all 60 analyses.

expert_vs_estimated_node_ages.pdf -- Linear regressions showing the correlation between the expert tree and estimated node ages, for nodes shared between the expert tree and estimated trees. Caveats for these regressions are discussed in Supplemental Text.

Canidae_expert.newick – The "expert" tree, derived from digitization of the phylogenies of Canidae published in the monographs of Wang and Tedford, using TreeRogue.

Table_S2_TipDate_runs_v3.xlsx – Summary of all 60 variant analyses (contains Supplemental Table S2, and some associated notes and file locations)

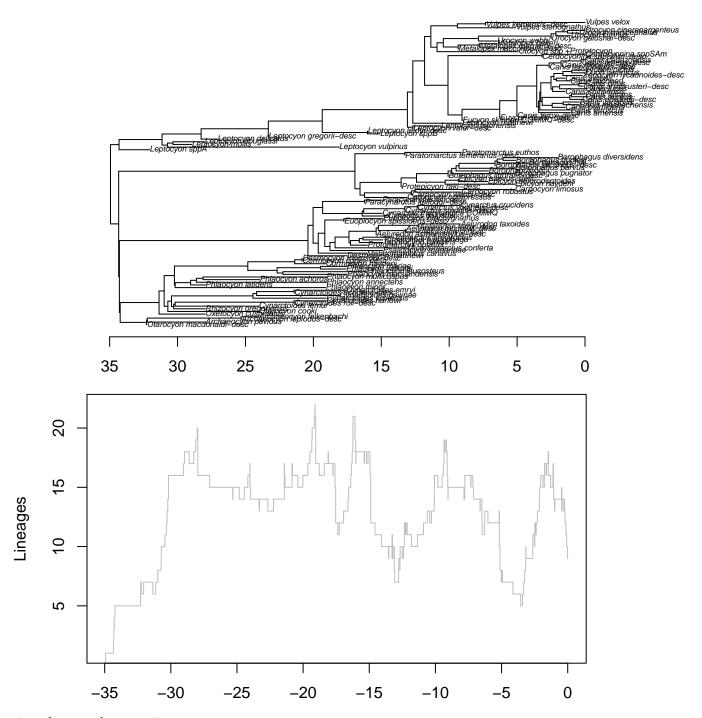
Matzke_Wright_SuppData.zip – A zipfile of all inputs, outputs, and scripts for all analyses.

Supplemental References

- [1] Bouckaert, R., Heled, J., Kühnert, D., Vaughan, T., Wu, C.-H., Xie, D., Suchard, M.A., Rambaut, A. & Drummond, A.J. 2014 BEAST 2: a software platform for Bayesian evolutionary analysis. *PLoS Comput Biol* **10**, e1003537. (doi:10.1371/journal.pcbi.1003537).
- [2] Gavryushkina, A., Welch, D., Stadler, T. & Drummond, A.J. 2014 Bayesian inference of sampled ancestor trees for epidemiology and fossil calibration. *PLoS Comput Biol* **10**, e1003919. (doi:10.1371/journal.pcbi.1003919).
- [3] Heath, T.A., Huelsenbeck, J.P. & Stadler, T. 2014 The fossilized birth-death process for coherent calibration of divergence-time estimates. *Proceedings of the National Academy of Sciences* **111**, E2957-E2966. (doi:10.1073/pnas.1319091111).
- [4] Pyron, R.A. 2011 Divergence time estimation using fossils as terminal taxa and the origins of Lissamphibia. *Systematic Biology* **60**, 466-481. (doi:10.1093/sysbio/syr047).
- [5] Ronquist, F., Klopfstein, S., Vilhelmsen, L., Schulmeister, S., Murray, D.L. & Rasnitsyn, A.P. 2012 A total-evidence approach to dating with fossils, applied to the early radiation of the Hymenoptera. *Systematic Biology* **61**, 973-999. (doi:10.1093/sysbio/sys058).
- [6] Zhang, C., Stadler, T., Klopfstein, S., Heath, T.A. & Ronquist, F. 2016 Total-evidence dating under the fossilized birth-death process. *Systematic Biology* **65**, 228-249. (doi:10.1093/sysbio/syv080).
- [7] Alexandrou, M.A., Swartz, B.A., Matzke, N.J. & Oakley, T.H. 2013 Genome duplication and multiple evolutionary origins of complex migratory behavior in Salmonidae. *Molecular Phylogenetics and Evolution* **69**, 514-523. (doi:http://dx.doi.org/10.1016/j.ympev.2013.07.026).
- [8] Arcila, D., Alexander Pyron, R., Tyler, J.C., Ortí, G. & Betancur-R, R. 2015 An evaluation of fossil tip-dating versus node-age calibrations in tetraodontiform fishes (Teleostei: Percomorphaceae). *Molecular Phylogenetics and Evolution* **82**, **Part A**, 131-145. (doi:http://dx.doi.org/10.1016/j.ympev.2014.10.011).
- [9] Beck, R.M.D. & Lee, M.S.Y. 2014 Ancient dates or accelerated rates? Morphological clocks and the antiquity of placental mammals. *Proceedings of the Royal Society of London B: Biological Sciences* **281**.
- [10] Bracken-Grissom, H.D., Ahyong, S.T., Wilkinson, R.D., Feldmann, R.M., Schweitzer, C.E., Breinholt, J.W., Bendall, M., Palero, F., Chan, T.-Y., Felder, D.L., Robles, R., Chu, K.-H., Tsang, L.-M., Kim, D., Martin, J.W. & Crandall, K.A. 2014 The emergence of lobsters: phylogenetic relationships, morphological evolution and divergence time comparisons of an ancient group (Decapoda: Achelata, Astacidea, Glypheidea, Polychelida). *Systematic Biology* **63**, 457-479. (doi:10.1093/sysbio/syu008).
- [11] Dornburg, A., Moore, J., Beaulieu, J.M., Eytan, R.I. & Near, T.J. 2015 The impact of shifts in marine biodiversity hotspots on patterns of range evolution: Evidence from the Holocentridae (squirrelfishes and soldierfishes). *Evolution* **69**, 146-161. (doi:10.1111/evo.12562).
- [12] Grimm, G.W., Kapli, P., Bomfleur, B., McLoughlin, S. & Renner, S.S. 2015 Using more than the oldest fossils: dating Osmundaceae with three

- Bayesian clock approaches. *Systematic Biology* **64**, 396-405. (doi:10.1093/sysbio/syu108).
- [13] Huang, D., Goldberg, E.E. & Roy, K. 2015 Fossils, phylogenies, and the challenge of preserving evolutionary history in the face of anthropogenic extinctions. *Proceedings of the National Academy of Sciences* **112**, 4909-4914. (doi:10.1073/pnas.1409886112).
- [14] Lee, M.S.Y., Cau, A., Naish, D. & Dyke, G.J. 2014 Morphological clocks in paleontology, and a mid-Cretaceous origin of crown Aves. *Systematic Biology* **63**, 442-449. (doi:10.1093/sysbio/syt110).
- [15] Lee, M.S.Y., Cau, A., Naish, D. & Dyke, G.J. 2014 Sustained miniaturization and anatomical innovation in the dinosaurian ancestors of birds. *Science* **345**, 562-566. (doi:10.1126/science.1252243).
- [16] Marx, F.G. & Fordyce, R.E. 2015 Baleen boom and bust: a synthesis of mysticete phylogeny, diversity and disparity. *Royal Society Open Science* **2**.
- [17] Sharma, P.P. & Giribet, G. 2014 A revised dated phylogeny of the arachnid order Opiliones. *Frontiers in Genetics* **5**, 255. (doi:10.3389/fgene.2014.00255).
- [18] Slater, G.J. 2013 Phylogenetic evidence for a shift in the mode of mammalian body size evolution at the Cretaceous-Palaeogene boundary. *Methods in Ecology and Evolution* **4**, 734-744. (doi:10.1111/2041-210X.12084).
- [19] Slater, G.J. 2015 Iterative adaptive radiations of fossil canids show no evidence for diversity-dependent trait evolution. *Proceedings of the National Academy of Sciences* **112**, 4897-4902. (doi:10.1073/pnas.1403666111).
- [20] Drummond, A.J. & Stadler, T. 2016 Bayesian phylogenetic estimation of fossil ages. *arXiv*, 1-23. (doi:arXiv:1601.07447v1).
- [21] Matzke, N.J. 2016 The evolution of antievolution policies after *Kitzmiller versus Dover. Science* **351**, 28-30. (doi:10.1126/science.aad4057).
- [22] Wood, H.M., Gillespie, R.G., Griswold, C.E. & Wainwright, P.C. 2015 Why is Madagascar special? The extraordinarily slow evolution of pelican spiders (Araneae, Archaeidae). *Evolution* **69**, 462-481. (doi:10.1111/evo.12578).
- [23] Wood, H.M., Matzke, N.J., Gillespie, R.G. & Griswold, C.E. 2013 Treating fossils as terminal taxa in divergence time estimation reveals ancient vicariance patterns in the Palpimanoid spiders. *Systematic Biology* **62**, 264-284. (doi:10.1093/sysbio/sys092).
- [24] Puttick, M.N., Thomas, G.H. & Benton, M.J. 2016 Dating placentalia: morphological clocks fail to close the molecular fossil gap. *Evolution*. (doi:10.1111/evo.12907).
- [25] Tseng, Z.J., Wang, X., Slater, G.J., Takeuchi, G.T., Li, Q., Liu, J. & Xie, G. 2013 Himalayan fossils of the oldest known pantherine establish ancient origin of big cats. *Proceedings of the Royal Society of London B: Biological Sciences* **281**.
- [26] Wang, X. 1994 Phylogenetic systematics of the Hesperocyoninae (Carnivora, Canidae). *Bulletin of the American Museum of Natural History* **221**, 1-207.
- [27] Wang, X.T., Richard H.; Taylor, Beryl E. 1999 Phylogenetic systematics of the Borophaginae. *Bulletin of the American Museum of Natural History* **243**, 1-391.

- [28] Tedford, R.H.W., Xiaoming; Taylor, Beryl E. 2009 Phylogenetic systematics of the North American fossil Caninae (Carnivora, Canidae). *Bulletin of the American Museum of Natural History* **325**, 1-218.
- [29] Finarelli, J.A. & Flynn, J.J. 2006 Ancestral state reconstruction of body size in the Caniformia (Carnivora, Mammalia): the effects of incorporating data from the fossil record. *Systematic Biology* **55**, 301-313. (doi:10.1080/10635150500541698).
- [30] Jablonski, D. & Shubin, N.H. 2015 The future of the fossil record: Paleontology in the 21st century. *Proceedings of the National Academy of Sciences* **112**, 4852-4858. (doi:10.1073/pnas.1505146112).
- [31] Powell, R.L., Matzke, N., de Souza Jr, C., Clark, M., Numata, I., Hess, L.L. & Roberts, D.A. 2004 Sources of error in accuracy assessment of thematic land-cover maps in the Brazilian Amazon. *Remote Sensing of Environment* **90**, 221-234. (doi:http://dx.doi.org/10.1016/j.rse.2003.12.007).
- [32] Matzke, N.J. 2013 TreeRogue: R code for digitizing trees. https://stat.ethz.ch/pipermail/r-sig-phylo/2010-October/000816.html
- [33] Slater, G.J. 2015. Data from: Iterative adaptive radiations of fossil canids show no evidence for diversity-dependent trait evolution. Dryad. Accessed May 1, 2015. http://dx.doi.org/10.5061/dryad.9qd51
- [34] Nylander, J.A.A. 2014. Burntrees v.0.2.2.: Perl script for manipulating MrBayes tree and parameter files. Accessed May 1, 2015. https://github.com/nylander/Burntrees
- [35] Stadler, T. 2010 Sampling-through-time in birth-death trees. *Journal of Theoretical Biology* **267**, 396-404. (doi:10.1016/j.jtbi.2010.09.010).
- [36] Stadler, T. & Yang, Z. 2013 Dating phylogenies with sequentially sampled tips. *Systematic Biology* **62**, 674-688. (doi:10.1093/sysbio/syt030).
- [37] Lewis, P.O. 2001 A likelihood approach to estimating phylogeny from discrete morphological character data. *Systematic Biology* **50**, 913-925. (doi:10.1080/106351501753462876).
- [38] Felsenstein, J. 1992 Phylogenies from restriction sites: a maximum-likelihood approach. *Evolution* **46**, 159-173. (doi:10.2307/2409811).
- [39] Matzke, N.J. 2015 BEASTmasteR: automated conversion of NEXUS data to BEAST2 XML format, for fossil tip-dating and other uses. PhyloWiki. http://phylo.wikidot.com/beastmaster
- [40] Schliep, K.P. 2011 phangorn: phylogenetic analysis in R. *Bioinformatics* **27**, 592-593. (doi:10.1093/bioinformatics/btq706).
- [41] Matzke, N.J., Shih, P.M. & Kerfeld, C.A. 2014 Bayesian analysis of congruence of core genes in *Prochlorococcus* and *Synechococcus* and implications on horizontal gene transfer. *PLoS ONE* **9**, e85103. (doi:10.1371/journal.pone.0085103).



Supplemental Figure S1

Supplemental Table S1. Five Bayesian tip-dating runs are compared to (column 1) the conclusions of Tedford & Wang. The two Slater analyses (original, and a modification repairing some unintended issues; cols. 2-3) represent MrBayes analyses under a uniform node age prior, constrained by both tip dates and many node-date priors. The third run (col. 4) shows the effect of removing the node-age calibrations, and putting flat priors on the parameters for clock rate and variation. The fourth run (col. 5) shows the drastic effect of switching to a fossilized birth-death prior. Columns 5 and 6 shown Beast2 runs with flat clock priors and noSA-BDSS and SA-BDSS tree priors, respectively. These five runs are drawn from the 40 analyses shown in Supplemental Table 1.

Estimates	Analysis	Tedford & Wang, manually time-scaled cladogram	mb1_orig: Slater (2015) MrBayes analysis, original	mb1_UC: Slater (2015) MrBayes analysis, corrected	mb8_UU: MrBayes analysis, unconstrained, uniform node age prior	mb10_noSA: MrBayes analysis, unconstrained, noSA-BDSS tree prior	mb9x_SA: MrBayes analysis, unconstrained, fossilized-SA-BDSS tree prior	r1_noSA: Beast2, unconstrained, noSA-BDSS tree prior	r2_SA: Beast2, unconstrained, SA-BDSS tree prior	Notes
	age(crown <i>Canis</i>)	3.2	7.3 (5.2,9.8)	7.4 (5.1,9.6)	27.5 (16.9,39.1)	4.4 (3.3,5.5)	2.8 (2.0,3.8)	3.7 (2.9,4.8)	2.7 (2.1,3.3)	4,6
	age(crown Caninae)	11.7	21.4 (17.9,25.8)	21.2 (17.8,25.5)	38.9 (29.0,54.0)	12.1 (10.7,13.7)	9.8 (8.9,10.2)	12.4 (10.9,14.1)	10.6 (10.3,12.0)	3,5
node ages	age(Canidae)	40-36	41.0 (40.4,41.8)	41.0 (40.4,43.3)	49.0 (44.4,66.8)	38.3 (36.0,41.3)	36.3 (34.6,39.0)	36.8 (35.0,39.0)	36.1 (34.2,38.0)	2
	prior on root age	-	gamma(1,1) expect: 1 (0.024, 3.6)	offsetexp(45, 50) expect: 50 (45.1,63.6)	uniform(45,100)			none		
	age(root)	41.5	43.4 (41.2,45.5)	47.1 (45.0,52.0)	49.5 (45.0,67.7)	45.3 (45.0,46.4)	45.3 (45.0,46.4)	40.6 (40.0,42.1)	40.0 (40.0,41.2)	1
topology	Percent toplogical dis mb2_undated, an u MrBayes tree (mean bet trees = 24.6%	ındated tw. undated	33.8%	32.3%	40.8%	33.1%	46.2%	36.2%	33.8%	
1000.069	crown Caninae monophyletic?	У	у	У	у	у	у	У	у	
	((Can., Boro.), Hesp.)?	У	n	n	У	У	n	у	у	
	model prior	-	IGR IGR lognorm(-6,0.1)		IGR IGR IGR truncated normal(0.0025,0.1)			ucld ucld uniform(0,10)		
	clock rate	-	expectation: 0.002 0.00309 (0.00201,0.00438)	0.0094	0.0045 (0.0025,0.006)	0.019 0.019 (0.015,0.024)	0.027	0.038 (0.025,0.053)	0.052 (0.033,0.075)	
clock	variation prior	-	exp(126.887); expectation: 0.0079 (0.00019,0.029)		uniform(0.0001,200)			uniform(0,10)		
	among-branch variation parameter	-	0.00955 (0.00479,0.0154)	0.028 (0.018,0.039)	0.034 (0.021,0.046)	0.024 (0.015,0.033)	0.035 (0.023,0.049)	1.20 (0.98,1.42)	1.24 (1.03,1.47)	7
	among-site variation gamma parameter	-	1.03 (0.19, 1.92)	1.45 (0.87,2.02)	1.44 (0.86, 2.06)	1.38 (0.87,2.0)	1.270 (0.79,1.78)	1.16 (0.66,1.70)	1.14 (0.61,1.62)	
	Canis ferox	3.5	fixed(3.5)	4.4 (0.2,9.3)	10.4 (0.2,32.8)	2.8 (0.5,5.1)	(not run)	2.9 (0.5,5.2)	2.3 (0.4,4.2)	8,9
tip dates	Epicyon haydeni	10-5.3	fixed(5.332)	3.5 (0.4,7.9)	4.7 (0.2,17.1)	4.9 (1.3,7.4)	(not run)	5.4 (1.9,8.8)	5.0 (2.1,7.9)	
·	Leptocyon gregorii	24.4-23	fixed(23)	23.3 (15.4,28.5)	32.3 (14.9,49.5)	21.8 (17.3,26.2)	(not run)	20.1 (14.3,26.7)	15.4 (12,20.4)	
	Hesperocyon gregarius		fixed(30.8)	35.7 (28,40.5)	32.2 (11.4,43.7)	33.7 (30.4,36.2)	(not run)	33.3 (30.1,35.7)	33.0 (30.3,34.8)	
	prior (all 3)	-	-	-	-	unif(0,10)	unif(0,10)	unif(0,10)	unif(0,10)	
	speciation	-	-	-	-	0.37 (0.041,0.79)	0.54 (0.44,0.64)	0.48 (0.29,0.73)	0.65 (0.36,1.08)	
tree	extinction	-	-	-	-	0.33 (0.037,0.71)	0.49 (0.44,0.53)	0.187 (0,0.53)	0.33 (0,0.90)	
	sampling	-	-	-	-	0.29 (0.033,0.63)	0.14 (0.096,0.21)	0.27 (0.16,0.38)	0.30 (0.15,0.44)	
Suppl. Table	run #	-	3	31	35	37	36x2	1	2	
	code	-	mb3.2.5, mb1_orig	mb3.2.5, mb1_UC	mb3.2.5, mb8_UU	mb3.2.5, mb10_noSA	mb3.2.5, mb9x_SA	r1_noSA	r2_SA	

 $\textbf{Notes} \hspace{0.5cm} \textbf{1} \hspace{0.1cm} \textbf{Wang \& Tedford (2008) date from Fig. 6.6, Arctoidea outgroup} \\$

40 Ma: Wang & Tedford (2008), Fig. 6.6, origin of Hesperocyoninae;

^{2 36} Ma: Tedford & Wang (2008), Fig. 7.1, divergence of Hesperocyoninae and Borophaginae+Caninae

³ Tedford et al. (2009), Fig. 66

⁴ Tedford et al. (2009), Fig. 66

⁵ For mb9, excluding Cuon/Lycaon, crown Caninae date is 11.6 (10.3,12.8)

⁶ For mb9, excluding Cuon/Lycaon, crown *Canis* date is 5.9 (5.0,7.1)

The fixed() statements in column 2 are the tip ages used by Slater (2015) for these taxa. To estimate the tip date (next 4 columns), these were changed to uniform(0,100).

⁷ The branch-rate variation parameters are not equivalent between MrBayes IGR and Beast2 ucld relaxed clocks.

⁸ The time ranges in column 1 are the stratigraphic range of each species as indicated in Fig. 65 of Wang (1994; Hesperocyon), Fig. 141 of Wang et al. (1999; Epicyon), and Figure 66 of Tedford et al. (2009; Canis and Leptocyon).

Appendix 1: Issues with the MrBayes dating analysis of Slater (2015).

In setting up variant MrBayes analyses (Supplemental Table S2), a number of issues became apparent with the NEXUS file of the original Slater (2015) analysis. These are detailed below in order to help aid future MrBayes analyses, and in some cases to suggest improvements in the MrBayes code or documentation.

We recommend that researchers engaging in MrBayes dating analyses check their own analyses for these issues, as several of them are subtle and "easy mistakes to make."

These issues do not appear to greatly alter the dating results of Slater (2015), due to the large number of tip- and node-date constraints in that analysis (compare Figure 1b: mb2.3.5_mb1_orig; and Figure 1c: mb3.2.5_mb1), but they did cause major issues for analyses without node-date constraints.

The example NEXUS file being examined is canidae.nex, downloaded May 2015, and re-downloaded (unchanged) in April 2016 from: http://datadryad.org/bitstream/handle/10255/dryad.73273/canidae.nex?sequence=1.

A file correcting the issues identified below, but otherwise maintaining the intended analysis of Slater (2015) (uniform node age prior, node date constraints, etc.) is file "canidae_all_issues_fixed.nex", located in directory mb_3.2.5b_add_ingroup/mb1/ of the Supplemental Data file "Matzke_Wright_SuppData.zip."

Issue 1: Root node date calibration

The NEXUS file includes a variety of node-date calibrations, including an offsetexp(min=45, mean=50) calibration for the root node:

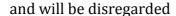
Line 433 of canidae.nex:

calibrate root=offsetexponential(45, 50); [mean = 50, median = 48.5, 95% upper = 60]

Unfortunately, this date prior on the root node appears to be ignored by MrBayes. This can be confirmed by inspecting Slater (2015)'s Figure S2, where the age of the root is approximately 42 Ma, despite the fact that the root node constraint has a hard minimum of 45 Ma.

The only hint that MrBayes is ignoring the root calibration is the following warning message:

WARNING: Constraint 'root' refers only to deleted taxa



In the screen output of the MrBayes run, this warning is easy to miss, as it is hidden amongst many other warnings of this type:

WARNING: There is one character incompatible with the specified coding bias. This character will be excluded.

The second warning is due to a character in the data matrix being invariant. Another reason that the first warning can be missed is that the warning is inaccurate (the taxa were not deleted).

It appears that, with the root node date calibration ignored, and with no tree age prior (treeagePr setting) given, the MrBayes dating analyses default to a tree height prior with a gamma(1,1) distribution. The message output to the screen at runtime is:

Tree age has a Gamma(1.00,1.00) distribution

This distribution is equivalent to an exponential(1) distribution. This suggests that the real prior being used on the age of the root is informative, and has a mean of 1 mya. This provides a ready explanation of the young date of the root node – the root node date is estimated to be just below the oldest tip (the outgroup, fixed to 40 Ma).

Issue 2: Prior on clock rate variability

The NEXUS file includes this prior for the igrvar parameter (igrvar = variance parameter for the gamma distribution on branchwise rate variability, for independent branch rates).

Line 468 of canidae.nex:

prset igrvarpr=exp(126.887); [a vague prior]

This parameter describes the expected variance given a branchlength in expected amounts of change. igrvar is multiplied by the each branchlength to give the expected variability.

The comment suggests the Exponential (126.887) prior as "a vague prior". We can see how a user could think this, given the language in the igrvar documentation:

MrBayes > help prset (in MrBayes 3.2.5) gives:

Igrvarpr -- This parameter allows you to specify a prior on the variance of the gamma distribution from which the branch lengths are drawn in the independent branch rate (IGR) relaxed clock model. Specifically, the parameter specifies the rate at which the variance increases with respect to the base rate of the clock. If you have a branch of a length corresponding to 0.4 expected changes per site according to the base rate of the clock, and the igrvar parameter has a value of 2.0, then the effective branch length will be drawn from a distribution with a variance of 0.4*2.0.

You can set the parameter to a fixed value, or specify that it is drawn from an exponential or uniform distribution:

```
prset igrvarpr = fixed(<number>)
prset igrvarpr = exponential(<number>)
prset igrvarpr = uniform(<number>,<number>)
```

For backward compatibility, 'ibrvarpr' is allowed as a synonym of 'igrvarpr'.

(This text is also found in commref_mb3.2.txt in the MrBayes 3.2.x download)

However, elsewhere in MrBayes, the exponential distribution is generally interpreted such that the input parameter for exp() is the exponential rate parameter, λ , and the expectation of the mean is $\beta = 1/\lambda$. Thus, the expectation of an Exponential(126.887) distribution is 1/126.887 = 0.00788. Thus, instead of a vague prior on branchwise rate variation, this prior essentially mandates a strict clock.

Our interpretation is confirmed by examining the inference of the estimated mean of branch rate variance parameter under MrBayes runs where the igrvar parameter has been changed (Supplemental Table S2).

Issue 3. Relative rate prior (ratepr)

In the NEXUS file, the relative rate prior (ratepr) is set to "variable":

```
Line 458 of canidae.nex:

prset applyto=(all) ratepr = variable;
```

This setting creates a parameter, m{1}, representing the relative rate of the morphology partition compared to other partitions (DNA, RNA, etc.) under a common overall clock model. However, canidae.nex is a morphology-only

dataset and only has 1 partition. MrBayes does not identify this situation and fix m{1} to "fixed". Instead, it attempts to estimate this relative rate along with the clock rate and clock variability. This creates poor mixing due to non-identifiability, and "crenelations" in the MCMC trace of parameters. Page 3 (analysis mb1_orig) of the Supplemental Data file Canidae_traceLogs.pdf shows these crenelations: the MCMC trace jumps to one value, samples around that value for a while, and then jumps to a much different value. Later in the chain, it discretely jumps towards the original value, and the cycle repeats. This behaviour leads to low ESS values and bimodal parameter estimates.

In Slater's highly-constrained original analysis, the effect on other inferences is not particularly noticeable and presumably makes little difference. However, it becomes a major issue for mixing and parameter estimation as node constraints are removed.

Issue 4. Rate prior on the morphological clock

In the NEXUS file, the relative rate prior (ratepr) is set to "variable":

Line 469 of canidae.nex:

prset clockratepr = lognorm(-6,0.1);

Slater set a tight prior on the morphology clock rate. The lognorm (-6, 0.1) distribution has a mean in real space of 0.0025 changes/my, and an SD of 0.00025. This is a user decision rather than a problem, and it is clearly mentioned in Slater (2015).

It may be, however, that the decision for a strongly informative prior on the clock rate was made in part in order to "make the analysis behave," due to problems caused by the uniform node age prior, and perhaps some of the other issues mentioned in this appendix. We note that tip-dating analyses with BDSS-type tree models function very well even with broad, uninformative priors on the rate of the morphological clock (Supplemental Table S2).

Issue 5. Outgroup, and specifying the outgroup

The outgroup taxon, named "outgroup" in Slater's analysis, is identified as the outgroup in canidae.nex:

Line 459 of canidae.nex:	
outgroup 1;	

Taxon 1 is the outgroup OTU. However, in MrBayes dating analyses, it appears that the outgroup setting is ignored. This highlights a fundamental difference between undated and dating analyses. In undated analyses, all trees are formally

unrooted, and rooting via an outgroup can take place during or after the phylogenetic inference. Thus, in the original, non-dating versions of MrBayes, the "outgroup" option was simply a convenience for the user, unless the outgroup consisted of multiple OTUs, in which case it serves as a topology constraint.

However, in a dating analysis, all sampled trees are always rooted, whether or not the user has decided on an outgroup. Furthermore, the mechanics of specifying an outgroup are more complex. Merely declaring an OTU an outgroup, or declaring an outgroup clade to be monophyletic, will not necessarily do the job. After all, a clade that is forced to be monophyletic could still be deeply nested inside the ingroup, unless something prevents this.

The simplest way to force the outgroup to be the earliest-branching group in a dating analysis is to set up a node constraint specifying that the ingroup is monophyletic. This could be programmed into the MrBayes outgroup command, but at the time of writing, it was not. In the case of Slater (2015)'s canidae.nex, it happens that there is a node constraint named "Canidae" and includes all living and fossil Canidae in the analysis. This constraint is used in the original Slater analysis, so the effect of the MrBayes outgroup problem is not noticed until the node constraints are removed; in this situation, some uniform clock tip-dating analyses fail to put the outgroup in the outgroup position (Supplemental Table S2). Fossilized BD analyses seem to put the outgroup in the correct position even without any constraints (Figure 1).

Issue 6. Temperature setting

The MCMC mixing temperature was set to 0.5 in the original analysis (MrBayes default temperature is 0.1), and this setting was copied to most variant MrBayes analyses in the study. This was, again, an analysis decision rather than an error. However, while in most modified analyses the temperature setting appeared to cause no unusual behavior, it may have been a factor in the unusual topology result of the mb9_SA analysis. MrBayes SA-BDSS runs with the default temperature of 0.1 (e.g., mb9x_SA) did not appear to produce unusual topologies, at least amongst the limited number of independent runs we were able to run (see Supplemental Table S2).

Issue 7. Typos in some OTU names.

Comparison with the "expert" tree manually digitized from the monographs of Tedford and Wang identified several likely typos in canidae.nex (in fairness, comparison also revealed a number of typos in the draft digitized expert tree; these are corrected in the final version). The correct spellings were double-checked via google and comparison to the monographs. These are available in the text file canidae.nex_typos.txt next to the original canidae.nex in the Supplemental Data zipfile.