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## 4 Appendix

- 5 Reproducible computation: A diversification rate analysis
- 6 This appendix illustrates the diversification rate analysis discussed in the main text. For completeness
- we begin by executing the code discussed in the manuscript which locates, downloads, and imports
- 8 the relevant data:
- 9 Different diversification models make different assumptions about the rate of speciation, extinction,
- and how these rates may be changing over time. The original authors consider eight different models,
- implemented in the laser package (Rabosky 2006). This code fits each of the eight models to that data:

```
library(ape)
library(laser)
models <- list(
    yule = pureBirth(bt),
    birth_death = bd(bt),
    yule.2.rate = yule2rate(bt),
    linear.diversity.dependent = DDL(bt),
    exponential.diversity.dependent = DDX(bt),
    varying.speciation_rate = fitSPVAR(bt),
    varying.extinction_rate = fitEXVAR(bt),
    varying_both = fitBOTHVAR(bt))</pre>
```

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- Each of the model estimate includes an Akaike Information Criterion (AIC) score indicating the good-
- ness of fit, penalized by model complexity (lower scores indicate better fits) We ask R to tell us which
- model has the lowest AIC score,

```
aics <- sapply(models, function(model) model$aic)
best_fit <- names(models[which.min(aics)])</pre>
```

- and confirm the result presented in E. P. Derryberry et al. (2011); that the best-fit model in the laser
- analysis was a Yule (net diversification rate) model with two separate rates.
- We can ask TreePar to see if a model with more rate shifts is favoured over this single shift, a ques-
- tion that was not possible to address using the tools provided in laser. The previous analysis also
- considers a birth-death model that allowed speciation and extinction rates to be estimated separately,
- but did not allow for a shift in the rate of such a model. In the main text we introduced a model from
- Stadler (2011) that permitted up to 3 change-points in the speciation rate of the Yule model,

```
yule_models <- bd.shifts.optim(x, sampling = c(1,1,1,1),
    grid = 5, start = 0, end = 60, yule = TRUE)[[2]]</pre>
```

- We can also compare the performance of models which allow up to three shifts while estimating
- extinction and speciation rates separately:

```
birth_death_models <- bd.shifts.optim(x, sampling = c(1,1,1,1),
    grid = 5, start = 0, end = 60, yule = FALSE)[[2]]</pre>
```

- The models output by these functions are ordered by increasing number of shifts. We can select the
- best-fitting model by AIC score, which is slightly cumbersome in TreePar syntax. First, we compute
- the AIC scores of both the yule\_models and the birth\_death\_models we fitted above,

27 Then we generate a list identifying which model has the best (lowest) AIC score among the Yule

models and which has the best AIC score among the birth-death models,

<sup>29</sup> The best model is then whichever of these has the smaller AIC value.

```
best_model <- which.min(c(min(yule_aic), min(birth_death_aic)))</pre>
```

- which still confirms that the Yule 2-rate model is still the best choice based on AIC score. Of the eight
- models in this second analysis, only three were in the original set considered (Yule 1-rate and 2-rate,
- <sub>32</sub> and birth-death without a shift), so we could by no means have been sure ahead of time that a birth
- death with a shift, or a Yule model with a greater number of shifts, would not have fitted better.

## References

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