Bayes Factor Delimitation of Species (*with genomic data; BFD*): A Tutorial and Worked Example

Adam Leaché
Department of Biology
University of Washington
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Huw A. Ogilvie
Research School of Biology
Australian National University
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Contents

1 Objective

This tutorial will help you become familiar with conducting species delimitation in a Bayesian framework using biallelic markers (AFLP or SNP data) using the programs SNAPP and BEAST. We will use example SNP data for geckos (genus *Hemidactylus*) and the software package BEAST version 2 (Bouckaert et al., 2014). We will work through the steps necessary for setting up the required packages on your computer, setting up the XML file, and testing species delimitation models using marginal likelihood estimation and Bayes factors.

2 Version, Author information, and Acknowledgements

This tutorial was written by Adam Leaché for BEAST version 2.1.2, then updated by Huw Ogilvie for BEAST version 2.3.3. Remco Bouckaert helped troubleshoot the tutorial. The layout of the tutorial is a modified version of a divergence time tutorial written by Jamie Oaks (`https://github.com/joaks1`), which he borrowed from Tracy Heath. A similar tutorial is provided at the BEAST website.

3 Background Information

New coalescent-based species delimitation methods are increasing the statistical rigor and objectivity of taxonomy (Fujita et al., 2012). However, expanding these methods to a genome-scale is limited by their reliance on gene trees. Combining hundreds or thousands of gene trees into a single species delimitation framework presents some serious computational challenges. A new method for estimating species trees without gene trees is available (Bryant et al., 2012), and we have leveraged this approach for species delimitation (Leaché et al., 2014). The species tree estimation method `SNAPP` (Bryant et al., 2012) estimates species trees directly from biallelic markers (e.g., SNP or AFLP data), which bypasses the necessity of having to explicitly integrate or sample the gene trees at each locus. The method works by estimating the probability of allele frequency change across ancestor/descendent nodes. The result is a posterior distribution for the species tree, species divergence times, and effective population sizes, all obtained without the estimation of gene trees.

Comparisons among candidate species delimitation models that contain different numbers of species, or different allocations of populations to species, is relatively easy in a Bayesian framework. The general approach requires marginal likelihood estimation (MLE) for each competing species delimitation model. Several different MLE approaches are available in BEAST, including path sampling (PS) or stepping-stone (SS) methods (Baele et al., 2012). Once the MLE values are obtained, the models can be ranked from highest to lowest, and Bayes factors (Kass and Raftery, 1995) can be used to compare models. This approach, called Bayes factor delimitation (BFD), was first implemented by Grummer et al. (2014) with DNA sequences in the program *BEAST. The approach was modified to work with genome-wide SNP data (BFD*) using the program SNAPP (Leaché et al., 2014).

One advantage of BFD/BFD* over other species delimitation approaches is the ability to integrate over species trees during the species delimitation procedure, which removes the constraint of specifying a guide tree that represents the true species relationships. In other words, with BFD/BFD* you can estimate the species tree and evaluate the species delimitation model at the same time. Another advantage is the ability to compare models that contain different numbers of species, or different assignments of samples to species. However, the user needs to predefine the number of species and sample assignments, and this prevents the method from searching among all possible species assignments.

4 Programs Used in This Lab

We will be using the free, open-source software package, BEAST (Bayesian Evolutionary Analysis Sampling Trees; http://beast2.org), for estimating species trees. This tutorial is intended to be used with BEAST version 2.3.3. The distribution comes with the BEAUTi, which you will use to manage package plugins (also called add-ons), including SNAPP.

BEAST comes with several other utility programs that we will use to prepare input files (BEAUTi; Bayesian Evolutionary Analysis Utility) and summarize output files TreeAnnotator, and LogCombiner). We will also be using the programs Tracer (http://tree.bio.ed.ac.uk/software/tracer) and FigTree (http://tree.bio.ed.ac.uk/software/figtree) for evaluating, summarizing, and viewing results.

5 The Data

We will be analyzing SNP data for geckos in the *Hemidactylus fasciatus* species complex. Details on how the data were collected are provided in (Leaché et al., 2014). For this tutorial, we will use a data matrix containing 129 SNPs that is also available for download on Dryad. Allopatric divergence seems to be the primary mechanism causing speciation in this group. These geckos are restricted to rainforest habitats, and their distributions match those of the major blocks of rainforest in West and Central Africa (Figure 1).

For the species delimitation example, we will test species delimitation models based on historical connections between adjacent rainforest blocks. These models differ in the number of species, and how samples are assigned to species. The base model has four species (Figure 1a). The alternative models are grouped into three classes: (1) lumping: populations are collapsed into the same species, (2) splitting: populations are partitioned into separate species, (3) reassigning: population(s) are allocated into a different species.

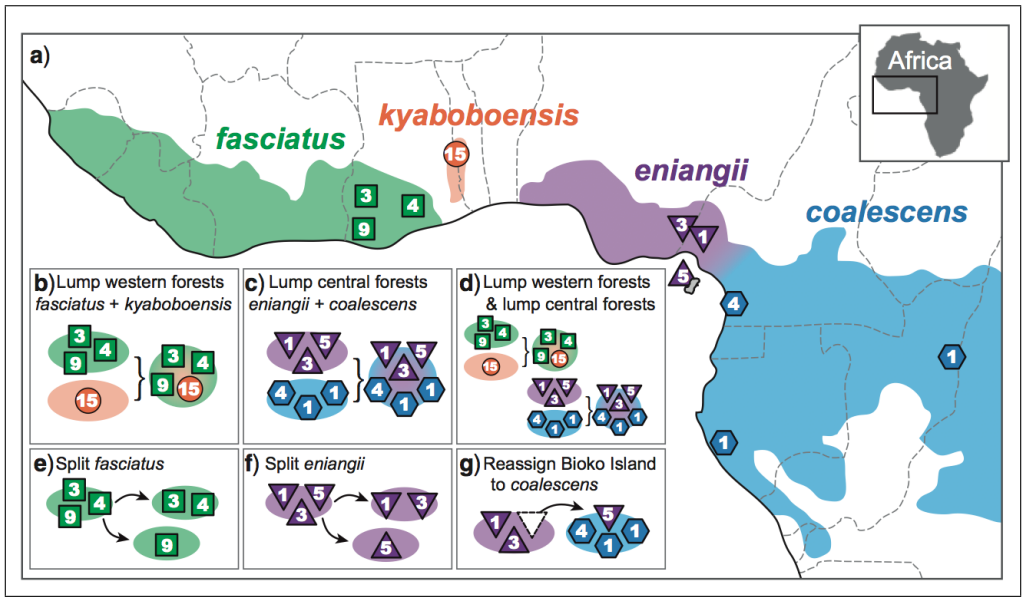


Figure 1: Geographic sampling of geckos (numbers in symbols indicate sample sizes). Starting taxonomy is shown in (a). BFD* is used to test the alternative species delimitation models outlined in (b) – (g).

6 Tutorial

6.1 Downloads and Data

Step 1: Download BEAST from http://beast2.org and install it on your computer. This tutorial is written for the Linux version of BEAST v2.3.3.

You will be using BEAST to run SNAPP, although it is possible to run SNAPP on it's own. However, we have to use BEAST in order to combine SNAPP and marginal likelihood estimation into the same analytical framework. Thus, without BEAST we would not be able to conduct Bayes factor delimitation of species with SNAPP.

Step 2: After downloading and unzipping this archive you should have a BFDstar-tutorial folder on your computer. This tutorial contains the files and folders shown in Box 1. The ***data*** folder contains the gecko SNP data in binary format (necessary for SNAPP). If you are unsure of how to convert your own SNP data from nucleotide to binary format, please read the documentation A rough guide to SNAPP (Section 4. Preparing Input File). You can find scripts for converting SNP data into SNAPP input format at our phrynomics project site at GitHub. You can also find help at the BEAST google users group. The ***xml*** folder contains seven xml files (named according to the species delimitation models in Figure 1) that are ready to run in BEAST.

- BFDstar-tutorial/
  - BFDstar-tutorial.pdf
  - data/
    - hemi129.nex
  - xml/
    - runA.xml
    - runB.xml
    - runC.xml
    - runD.xml
    - runE.xml
    - runF.xml
    - runG.xml

Box 1: The files included in this tutorial. The data folder contains the SNP data in binary format. Ready-to-run XML files are included in the xml folder.

6.2 Setting up the XML file with BEAUTi

Step 3: Begin by launching the BEAUTi program that comes with BEAST. If you are using Mac OS X or Windows, you should be able to do this by double clicking on the application. On Linux, open a terminal and `cd` into the extracted BEAST folder, then launch BEAUTi using the command `bin/beauti`. If everything is working correctly, a window should appear that looks something like Figure 2.

Step 4: We need to add functionality to BEAST in order to estimate species trees with SNP data and to perform model selection. Begin by using the drop-down menu ***File*** →***Manage Packages.*** A window should appear that looks something like Figure 3. Select and install the packages **SNAPP** and **Model_Selection**. You can then exit the window by clicking the **"Close"** button.

Step 5: We need to tell BEAUTi that we are setting up a SNAPP analysis, which will change the menu options and allow us to import SNP data. Begin by using the drop-down menu ***File*** →***Template, SNAPP*** . This should change the appearance of the BEAUTi window to look something like Figure 4.

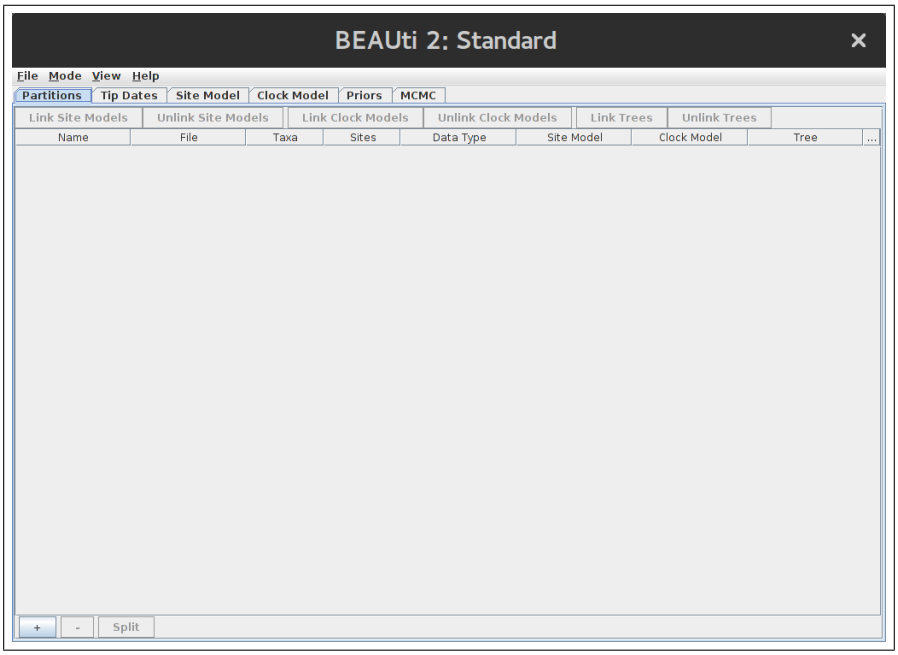


Figure 2: BEAUTi window before any data is loaded.

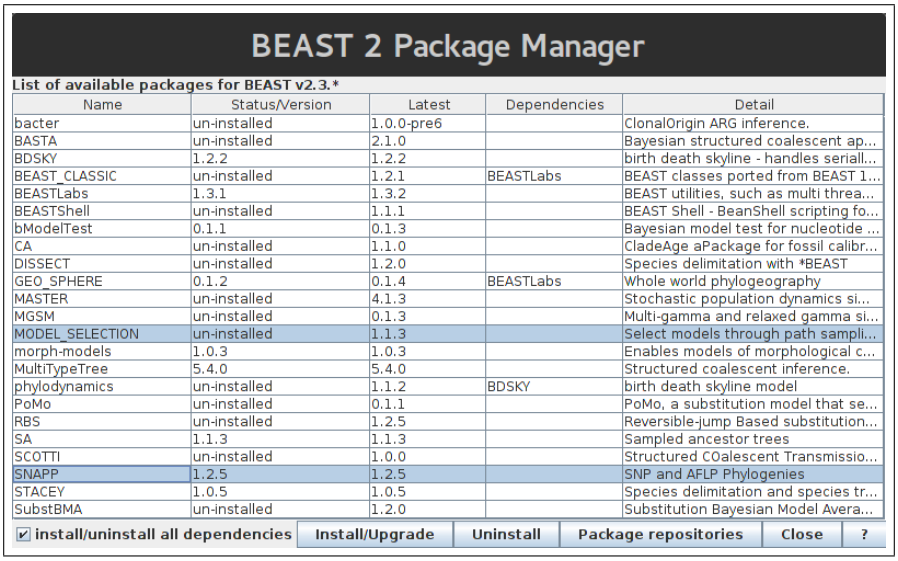


Figure 3: BEAUTi package manager for BEAST.

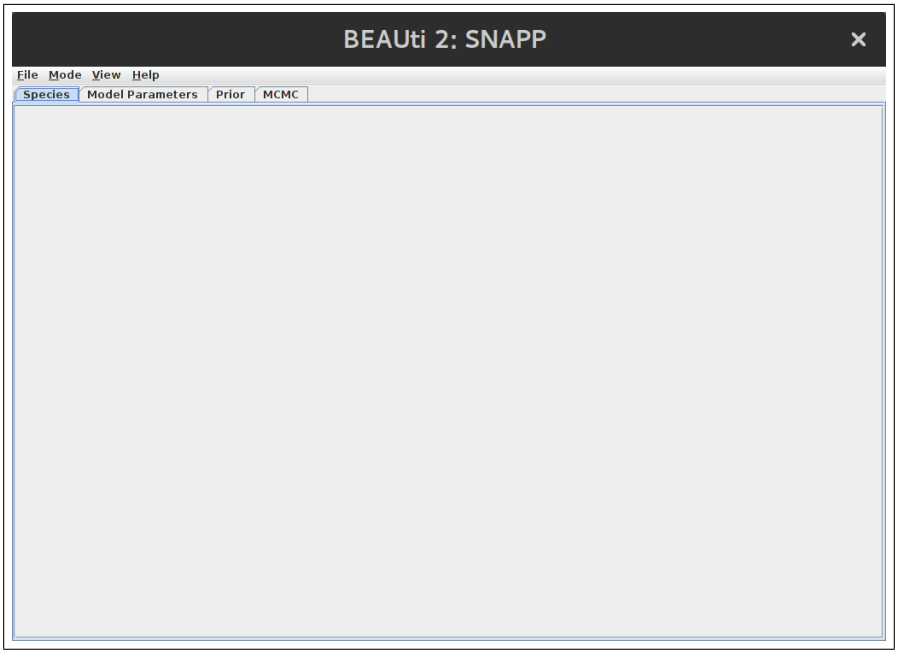


Figure 4: BEAUTi window after importing the SNAPP template. Notice that the menu tabs have changed.

Step 6: Import the SNP data (the **hemi129.nex** file) using the drop-down menu ***File*** →***Add Alignment.***

Once the data are successfully loaded into BEAUTi you should see a list of the samples included in the data file (Figure 5.)

Step 7: There are several ways to designate species assignments. We automatically designated species names using the names already present in the data files. The species names can be pre-defined this way by including a "delimiter" that allows the species name to be separated from the rest of the sequence name. The gecko data file uses an underscore "_" to separate the species name (on the left) from the rest of the sequence name (on the right) as follows:

```
eng_NG_1
coal_CA1_2
coal_CA1_3
coal_CA1_4
coal_CA1_5
coal_CG_6
kya_GH3_7
kya_GH3_8
...
```

Other options for assigning species names are available using the "Guess" button. The screen should look similar to Figure 6. The original data include 46 samples, but the XML files included in this tutorial contain a reduced number of samples to speed up the analyses.

You can import a custom mapping file that links each sample to a species using the "read from file" option. Click the "Ok" button to return to the ***Species*** window. Be sure that each Taxon has a Species/Population name.

Step 8: Next, we need to set up our model under the ***Mutation Model*** tab Figure 7. We will use the default options for this tutorial, but you should read the documentation A rough guide to SNAPP to learn more about the model options. Briefly, the parameters are as follows:

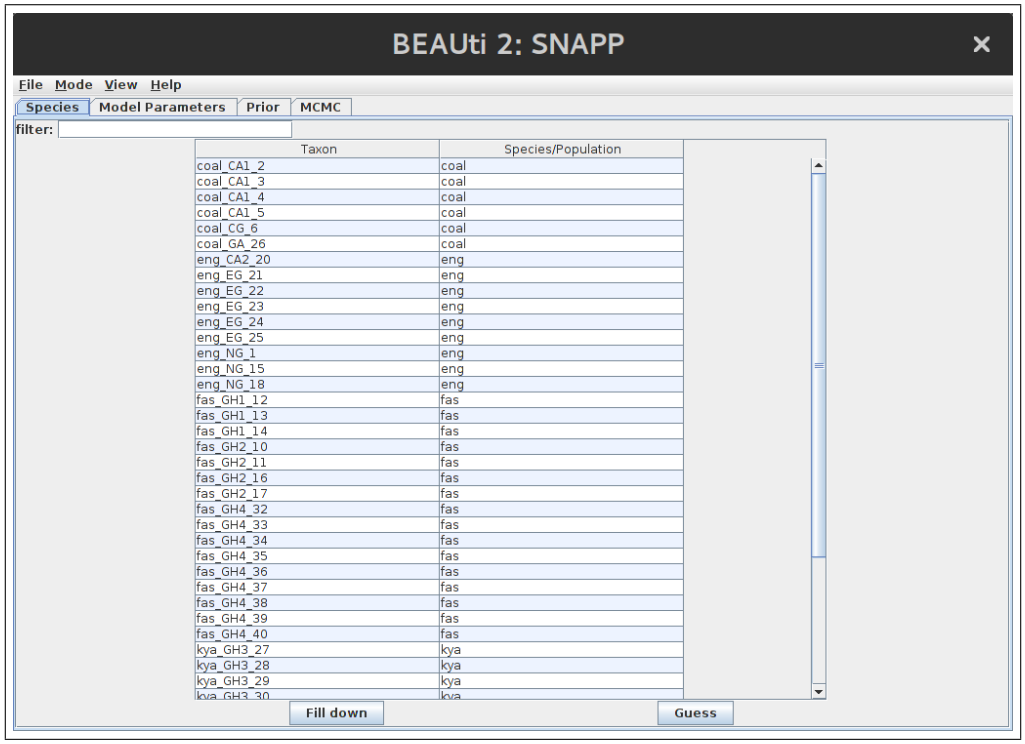


Figure 5: The data successfully loaded by BEAUTi.

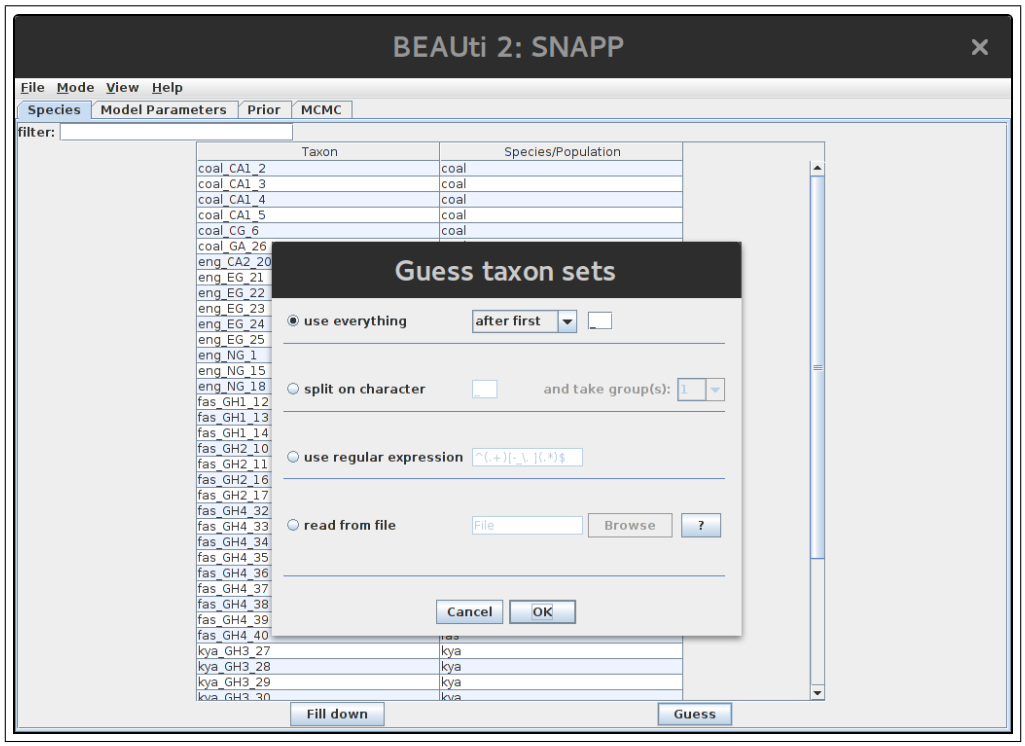


Figure 6: The species assignment options that appears after you select the "Guess" button.

```
Mutation Rate U: instantaneous rate of mutating from the 0 allele to the 1 allele.
Mutation Rate V: instantaneous rate of mutating from the 1 allele to the 0 allele.
Coalescence Rate:  population size parameter with one value for each node in the tree.
```

By default the forward and reverse mutation rates U and V are both set to equal 1.0. These can be sampled during the MCMC, or estimated directly from the alignment. For this tutorial, we will estimate the rates from the alignment. First, click the "Calc mutation rates" button to estimate both rates from the alignment. Then, untick the "Sample" checkbox next to Mutation Rate U.

Untick the "Include non-polymorphic sites" checkbox. This option is used in cases where invariant sites have been included in the data. The likelihood calculations are different if SNAPP assumes that all constant sites have been removed.

Leave the "Mutation Only At Root" checkbox unticked. This option indicates conditioning on zero mutations, except at root (default false). As a result, all gene trees will coalesce in the root only, and never in any of the branches.

Leave the "Show Pattern Likelihoods And Quit" checkbox unticked. This option is handy if you just want to print out the likelihoods for all patterns in the starting state and then quit.

Leave the "Use Log Likelihood Correction" checkbox ticked. This option calculates corrected likelihood values for Bayes factor test of different species assignments.

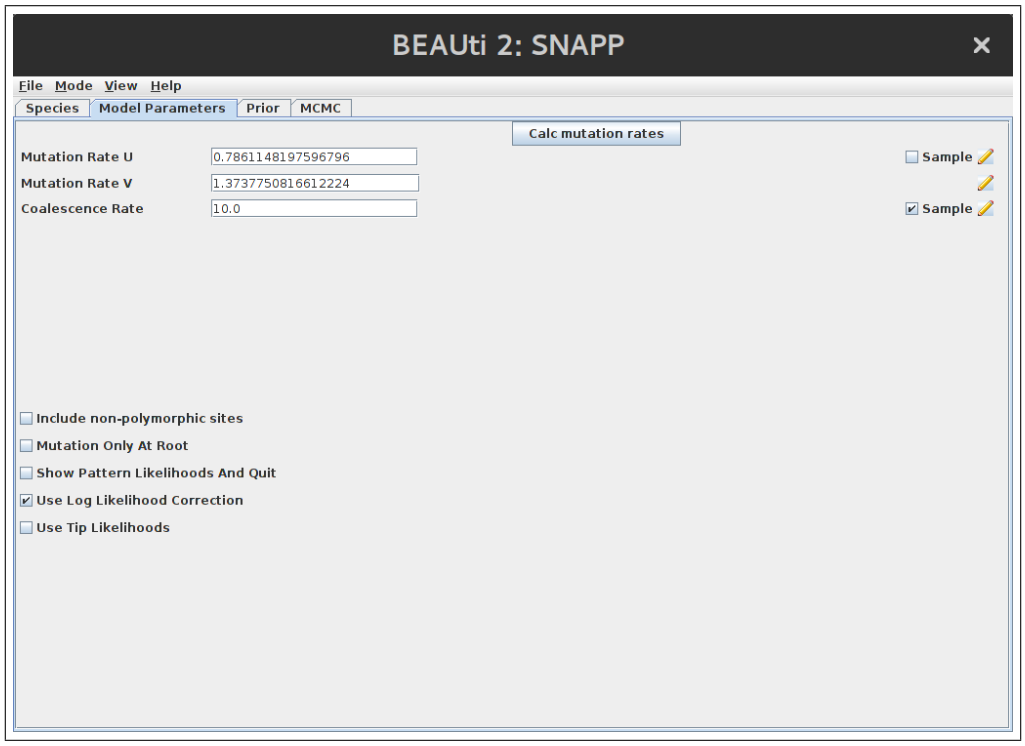


Figure 7: The Mutation Model options.

Step 9: Next, we need to move to the ***Prior*** tab and specify the priors (Figure 8.) We will use the default options for this tutorial, but you should read the documentation A rough guide to SNAPP to learn more about these options. A short description of the priors are provided below: Briefly, SNAPP uses a Yule prior for the species tree and branch lengths on the species tree. This prior has a single parameter, λ (Lambda), which governs the rate that species diverge. This rate, in turn, determines the (prior) expected height of the species tree.

```
Alpha:  shape parameter for the gamma prior on population sizes.
Beta:  scale parameter for the gamma prior on population sizes.
Kappa:  parameter used when selecting the CIR rate prior (below).
Lambda:  Birth rate for the Yule model prior on the species tree.
Rateprior:  prior on rates can be Gamma, InverseGamma, CIR, or Uniform.
```

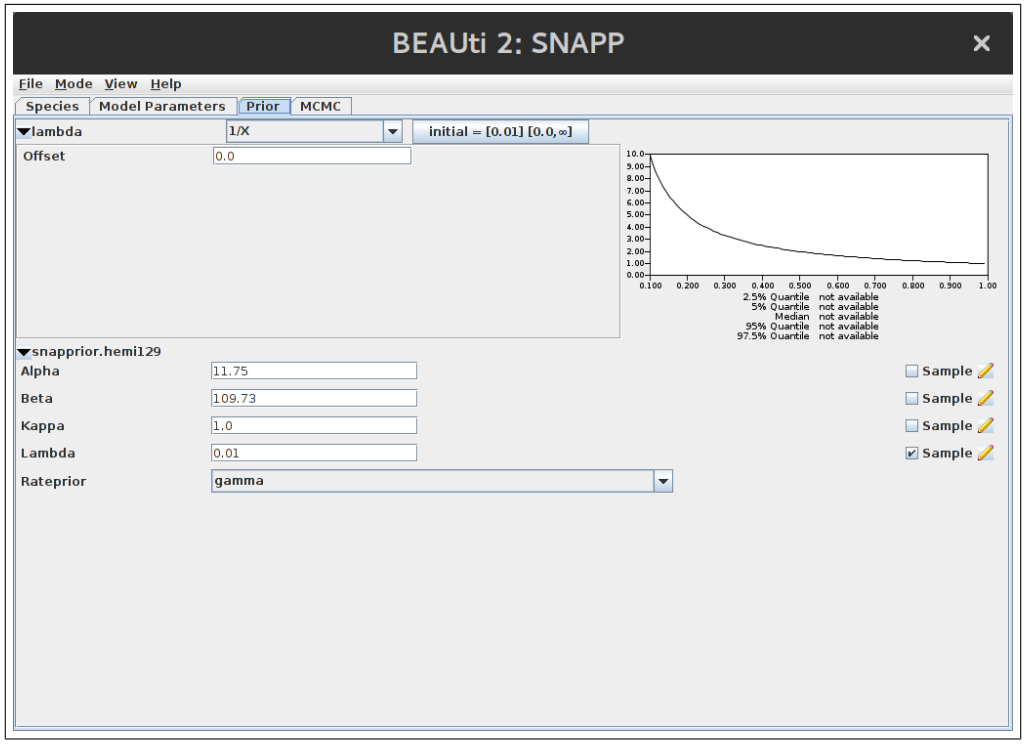


Figure 8: The prior settings.

Step 10: Next, move to the ***MCMC*** tab. Change the following settings:

```
Chain Length:  1000
  Store Every:  10
tracelog:File Name:  runA.log
  tracelog:Log Every:  10
  screenlog:Log Every:  10
treelog:File Name:  runA.trees
  treelog:Log Every:  10
```

Leave the remaining options at their default values (Figure 9). These MCMC values are way to low, and a thorough analysis requires much more computational time. The original SNP data include 46 samples, but the files included in this tutorial contain a reduced number of samples to speed up the analyses. The MCMC run times are intentionally kept short (and the data files reduced) in this tutorial. These short analyses should run in approximately 2 – 4 minutes depending on the number of processors available on your computer. Thorough analyses of the full data take 2 – 6 days, depending on the number of species in the model. A SNP matrix with 1,000 loci requires 5 – 20 days.

Next, save the file using ***File →Save.*** Another subwindow will appear for specifying the name and location for saving the XML file. Name the file "runA.xml" and place it in a folder with the name "runA". Save the file to the BFDstar-tutorial folder.

6.3 Editing the XML file for marginal likelihood estimation

Step 11: Species delimitation using SNPs requires marginal likelihood estimation. You will need to edit the XML file to prepare it for analysis in BEAST. Instructions for setting up marginal likelihood estimation using path sampling are provided at the BEAST website. The procedure involves (1) typing in some short codes in a few places, (2) replacing some words, and (3) copying and pasting some sections around.

Open your XML file in a text editor. Search and replace the opening run statement (located about half way through

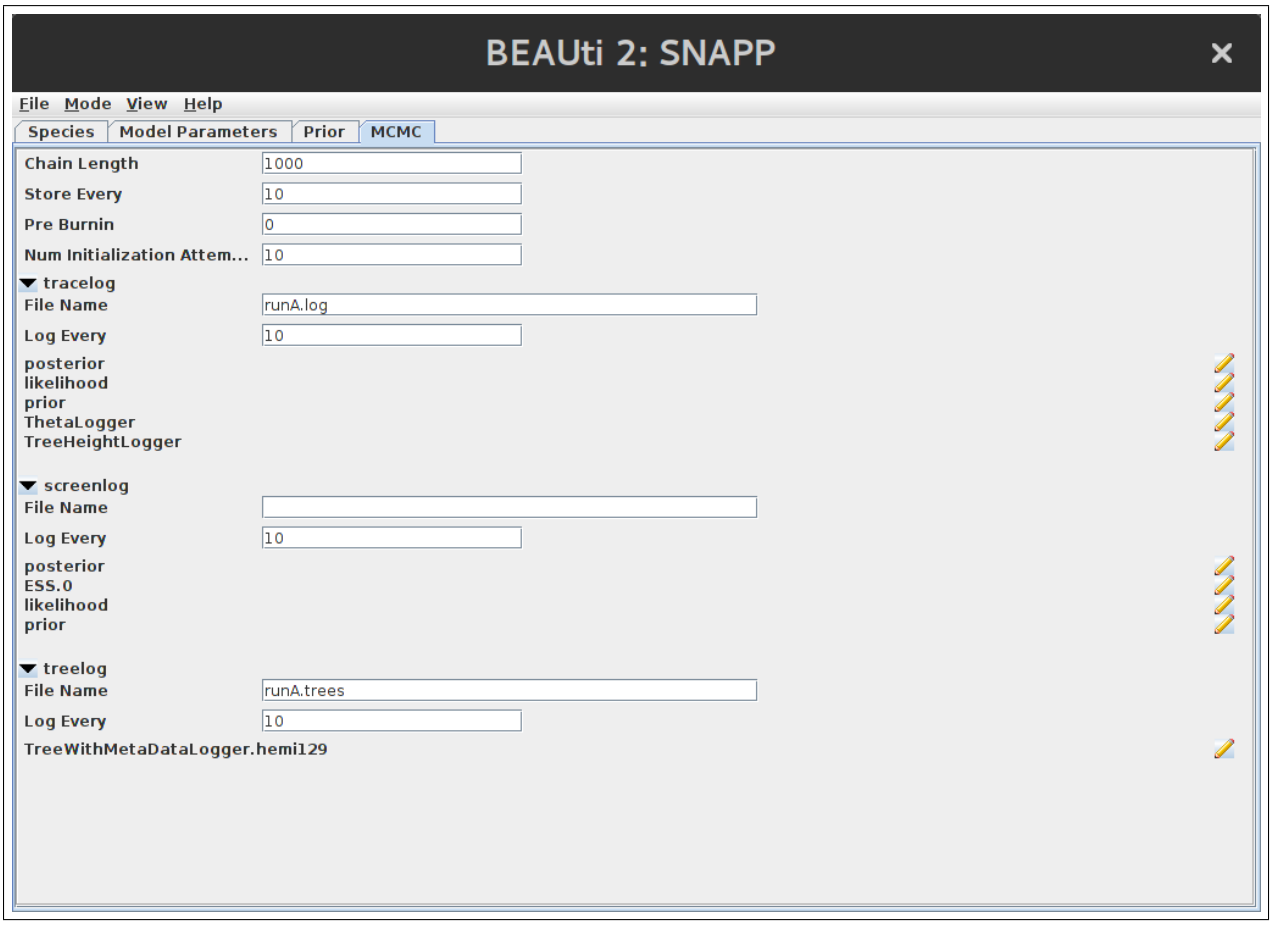


Figure 9: The MCMC settings.

the file) with an mcmc statement by changing "<**run ...**>" into "<**mcmc ...**>". Next, type a new closing mcmc statement, "</**mcmc**>", just before the closing run statement, "</**run**>", located at the end of the file.

Now you are ready to insert the path sampling commands. You will need to insert the following block of text into your XML file immediately above the opening "<mcmc ...>"' element:

```
<run spec='beast.inference.PathSampler'
chainLength="1000"
alpha='0.3'
rootdir='/home/desktop/BFDstar-tutorial/runA/'
burnInPercentage='0'
preBurnin="0"
deleteOldLogs='true'
nrOfSteps='24'>
cd $(dir)
java -cp $(java.class.path) beast.app.beastapp.BeastMain $(resume/overwrite) -java -seed $(seed) beast.xml
```

Important: If you copy and paste this section into your XML file, be sure to check that the symbols paste correctly. The quote symbols (", ", etc.) don't copy as they should, and these will cause problems. Also, make sure that the root directory path (rootdir) exists on your computer.

These path sampling parameters are way to low, and a thorough analysis requires much more computational time. The MCMC run times are intentionally kept short in this tutorial so that we have time to conduct analyses and discuss the results.

The path sampling parameters that you just entered into your XML file are as follows:

```
chainLength:  MCMC sample length for each path sampling step.
alpha:  parameter used to space out path sampling steps.
rootdir:  directory for storing output.  Be sure that the folder exists before starting the run.
burnInPercentage:  burn-In percentage used for analyzing the log files.
preBurnin:  number of samples that are discarded for the first step, but not the others.
deleteOldLogs:  delete existing log files from rootdir
nrOfSteps:  the number of path sampling steps to use
```

6.4 Running the XML file with BEAST

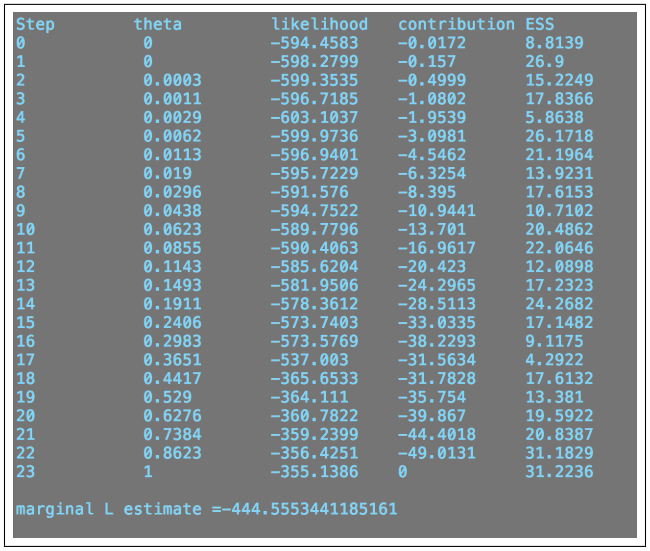
Step 12: You can execute the XML file in BEAST using the GUI or the command line. If you are using Mac OS X or Windows, you should be able to launch the BEAST GUI by double clicking on the application icon. On Linux, launch the GUI by executing `bin/beast -threads 4` inside the extracted BEAST folder. On Linux, BEAST will immediately ask you to choose the XML file to execute. Select the runA.xml file you just created. Each "step" in the path sampling analysis should take about 10 minutes. By specifying 4 threads, four steps can execute simultaneously. To complete all 24 steps should therefore take about 1 hour. You can also run BEAST from the command line. Open your computer's Terminal and navigate to the folder containing your **runA.xml** file. To execute the file, type the following at the command line:

```
/path/to/beast/bin/beast -threads 4 runA.xml
```

Set the number of `threads` to equal the number of CPU cores on your computer.

6.5 Inspecting path sampling results

Step 13: At the end of your analysis, the path sampling results will be displayed on the screen. An example is shown in Figure 10. Each row shows the results from one path sampling step. The example in Figure 10 shows the results from a path sampling analysis with 24 steps. You will use the value after "marginal L estimate" to compare models.



Step	theta	likelihood	contribution	ESS
0	0	-594.4583	-0.0172	8.8139
1	0	-598.2799	-0.157	26.9
2	0.0003	-599.3535	-0.4999	15.2249
3	0.0011	-596.7185	-1.0802	17.8366
4	0.0029	-603.1037	-1.9539	5.8638
5	0.0062	-599.9736	-3.0981	26.1718
6	0.0113	-596.9401	-4.5462	21.1964
7	0.019	-595.7229	-6.3254	13.9231
8	0.0296	-591.576	-8.395	17.6153
9	0.0438	-594.7522	-10.9441	10.7102
10	0.0623	-589.7796	-13.701	20.4862
11	0.0855	-590.4063	-16.9617	22.0646
12	0.1143	-585.6204	-20.423	12.0898
13	0.1493	-581.9506	-24.2965	17.2323
14	0.1911	-578.3612	-28.5113	24.2682
15	0.2406	-573.7403	-33.0335	17.1482
16	0.2983	-573.5769	-38.2293	9.1175
17	0.3651	-537.003	-31.5634	4.2922
18	0.4417	-365.6533	-31.7828	17.6132
19	0.529	-364.111	-35.754	13.381
20	0.6276	-360.7822	-39.867	19.5922
21	0.7384	-359.2399	-44.4018	20.8387
22	0.8623	-356.4251	-49.0131	31.1829
23	1	-355.1386	0	31.2236

marginal L estimate =-444.5553441185161

Figure 10: The path sampling output at the end of the analysis.

6.6 Setting up new species delimitation models

Step 14: Now that you have one XML file up and running it is easy to make new XML files for each species delimitation model. To prepare a new file for species delimitation, we have to make a few slight modifications to the existing runA.xml file: (1) save a copy of the xml file as runB.xml and save it in a new folder with the name "runB", (2) change the file stem names in the xml file so that you don't accidentally overwrite any of your previous results, (3) edit the path sampling root directory to point to the new runB folder, 4) change the species assignments listed in the **"stateDistribution"** element. This last part requires changing the number and/or composition of taxonset features. Each taxonset begins with **"<taxonset ...>"** and ends with **"</taxonset>"** (Figure 11). To lump species, simply combine the taxon names into a single taxonset feature. To split a species, simple create a new taxonset containing the appropriate taxon names. To reassign a taxon to a different species you can cut and paste the taxon to the new taxonset. XML files containing the species assignments shown in Figure 1 are provided with this tutorial (see Box 1). The XML files included with this tutorial contain a reduced number of samples in the taxonset blocks to help speed up the analyses.

Step 15: After you run each of the alternative species delimitation models you can rank them by their marginal likelihood estimate (MLE). You can also calculate Bayes factors to compare the models. The Bayes factor (BF) is a model selection tool that is simple and well suited for the purposes of comparing species delimitation models. Calculating the BF between models is simple. To do so, simply subtract the MLE values for two models, and then multiply the difference by two (BF = 2 x (model1 - model2). A negative BF value indicates support in favor of model 1. A positive BF value indicates support in favor of model 2.

The strength of support from BF comparisons of competing models can be evaluated using the framework of Kass and Raftery (1995). The BF scale is as follows: $0 < \text{BF} < 2$ is not worth more than a bare mention, $2 < \text{BF} < 6$ is positive evidence, $6 < \text{BF} < 10$ is strong support, and $\text{BF} > 10$ is decisive.

The results for the seven gecko models are provided in Table 1. The model that splits *Hemidactylus eniangii* into two species (runF) is the top-ranked model. It has the largest MLE value, and it is supported in favor of the current taxonomy model (runA). The BF in support for model F is decisive compared to model A.

Table 1: Path sampling results for the seven species delimitation models shown in Figure 1.

6.7 Summarizing the trees using TreeAnnotator.

Step 16: TreeAnnotator will summarize the posterior distribution of species trees and identify the topology with the best posterior support, and summarize the divergence times for each node in the tree. Launch the TreeAnnotator

```
<taxa dataType="integerdata" id="snap.hemi129" spec="snap.Data">
    <data idref="hemi129" name="rawdata"/>
    <taxonset id="kya" spec="TaxonSet">
        <taxon id="kya_GH3_7" spec="Taxon"/>
        <taxon id="kya_GH3_8" spec="Taxon"/>
        <taxon id="kya_GH3_9" spec="Taxon"/>
    </taxonset>
    <taxonset id="fas" spec="TaxonSet">
        <taxon id="fas_GH2_10" spec="Taxon"/>
        <taxon id="fas_GH2_11" spec="Taxon"/>
        <taxon id="fas_GH1_12" spec="Taxon"/>
        <taxon id="fas_GH4_38" spec="Taxon"/>
        <taxon id="fas_GH4_39" spec="Taxon"/>
        <taxon id="fas_GH4_40" spec="Taxon"/>
    </taxonset>
    <taxonset id="coal" spec="TaxonSet">
        <taxon id="coal_CA1_5" spec="Taxon"/>
        <taxon id="coal_CG_6" spec="Taxon"/>
        <taxon id="coal_GA_26" spec="Taxon"/>
    </taxonset>
    <taxonset id="eng" spec="TaxonSet">
        <taxon id="eng_NG_18" spec="Taxon"/>
        <taxon id="eng_CA2_20" spec="Taxon"/>
        <taxon id="eng_EG_21" spec="Taxon"/>
        <taxon id="eng_EG_22" spec="Taxon"/>
    </taxonset>
</taxa>
```

Figure 11: Example of the taxonset features in the XML file.

Model	Species	MLE	Rank	BF
runA, current taxonomy	4	-1673.4	2	–
runB, lump western forests	3	-1724.2	5	+101.5
runC, lump central forests	3	-1788.0	6	+229.2
runD, lump western & central forests	2	-1842.9	7	+339.0
runE, split *fasciatus*	5	-1713.2	4	+79.7
runF, split *eniangii*	5	-1625.9	1	-95.1
runG, reassign Bioko Island	4	-1712.6	3	+78.4

MLE = Marginal likelihood estimate
BF = Bayes factor

program. You can also specify the burnin value if you haven't already excluded burn-in samples in LogCombiner. For the `Target tree type` field, choose **Maximum clade credibility tree**. For the `Node heights` field, choose **Median heights**. Select the `Input Tree File` button and select the file runA.trees. Select the `Output File` button and specify the `output` directory and a file name, runA-MCC.tre. Click `Run`

6.8 Visualizing the tree in FigTree

Step 17: Launch the FigTree program, and load the runA-MCC.tre file you just created with TreeAnnotator. Check the `Branch Labels` option and select **posterior** for the ***Branch labels*** →***Display*** fields. Check the `Node Bars` option and select **height_95%_HPD** for the ***Node bars*** →***Display*** field.

7 Quick Version of the Tutorial

Step 1: Download and data.

Step 2: Data included with the tutorial.

Step 3: Launch BEAUTi

Step 4: Install SNAPP and model selection packages

Step 5: Converting BEAUTi to SNAPP mode

Step 6: Import the SNP data.

Step 7: Define species.

Step 8: Set the mutation model.

Step 9: Define the priors.

Step 10: Specify MCMC settings and generate the XML file.

Step 11: Editing the XML file for marginal likelihood estimation.

Step 12: Run the XML file in BEAST.

Step 13: Inspecting path sampling results.

Step 14: Setting up new XML files for species delimitation.

Step 15: Comparing species delimitation models with Bayes factors.

Step 16: Summarize the species tree using TreeAnnotator.

Step 17: Visualize the species tree in FigTree.

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