# BAli-Phy User's Guide v3.3

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# 1. Introduction

BAli-Phy is a Unix command line program that is developed primarily on Linux. BAli-Phy also runs on Windows and Mac OS X, but it is not a GUI program and so you must run it in a terminal. Therefore, you might want to keep a Unix tutorial or Unix cheat sheet handy while you work.

In addition to the main **bali-phy** executable, BAli-Phy comes with a collection of small command-line utilities such as **alignment-cat**, **trees-consensus**, etc. These utilities can be used to process alignments, assemble data sets, and summarize the results of MCMC.

# 2. Installation

# 2.1. Hardware requirements

We typically run BAli-Phy on workstations with at least 8Gb of RAM and 2 cores. More cores will allow you to run more MCMC chains at once, and more RAM will allow you to run larger data sets. However, it is often easier and faster to run BAli-Phy on a (Linux) computing cluster, if you have one available.

#### 2.2. Install on MS Windows

First check that you have a 64-bit version of the Windows operation system installed. The executables for download will only run on a 64-bit installation of Windows.

#### 2.2.1. Install a Unix command line: Cygwin (recommended)

Before you can use BAli-Phy on Windows, you need to install a Unix command-line environment. We recommand installing <a href="Cygwin">Cygwin</a>. You may then access the Unix command line environment by running the Cygwin shell (not the normal windows command line). The Cygwin shell mounts the C: drive on /cygdrive/c/, so you can access the directory C:/Users/ as /cygdrive/c/Users/ from within the Cygwin shell, for example.

While running the Cygwin installer  $\underline{\mathtt{setup-x86}}$  64.exe, you will be given an opportunity to select additional packages.

- From *Science*, select *R*.
- From *Math*, select *anuplot*.
- From *Interpreters*, select *perl*.
- From *Web*, select *wget*.
- From *Editors*, select *nano*.

You can re-run the installer to add packages that you did not add during the initial install.

#### Note

BAli-Phy refers to windows files using the normal C:/ method because it is compiled as a native windows executable. The combination of native windows executables (which want C:/) and the Cygwin shell (which wants /cygdrive/c/) can be confusing. If you supply Cygwin filenames with /cygdrive/ to native windows executables like BAli-Phy, then it may complain that the files cannot be found.

#### 2.2.2. Install a Unix command line: Msys2 (alternative)

You can optionally use MSYS2 instead of Cygwin. Both MSYS2 and Cygwin can be installed at the same time. After installing MSYS2, You may access the Unix command line environment by running the MSYS2 shell (not the normal windows command line). The MSYS2 shell mounts the C: drive on /c/, so you can access the directory C:/Users/ as /c/Users/ from within the MSYS2 shell, for example.

After installing MSYS2 you will need to install a few packages before you proceed. Run the MSYS2 shell, and enter the command:

```
§ pacman -S perl tar
```

#### 2.2.3. Install BAli-Phy executables from website

First, download and extract the executables:

```
% mkdir -p ~/Applications
% cd ~/Applications
% wget http://www.bali-phy.org/files/bali-phy-3.3-win64.tar.gz
% tar -zxf bali-phy-3.3-win64.tar.gz
```

Second, check that the **bali-phy** executable runs:

```
% ~/Applications/bali-phy-3.3/bin/bali-phy --version
```

You still need to add it to your PATH as described in Section 2.5, "Add BAli-Phy to your PATH".

#### 2.3. Install on Mac OS X

#### 2.3.1. Install BAli-Phy using homebrew (recommended)

First install the **XCode** (version 6 or higher) command line tools:

```
% xcode-select --install
```

Then install **homebrew** and use homebrew to compile and install **bali-phy**:

```
% brew tap bredelings/bioinformatics
% brew install bali-phy
```

Check that the executable runs:

```
% bali-phy --version
```

If you install with homebrew, you don't need to do anything extra to put bali-phy in your PATH.

#### 2.3.2. Install BAli-Phy using executables from website (alternative)

First download and extract the executables:

```
% mkdir -p ~/Applications
% cd ~/Applications
% curl -0 http://www.bali-phy.org/files/bali-phy-3.3-mac64.tar.gz
% tar -zxf bali-phy-3.3-mac64.tar.gz
```

Check that the executable runs:

```
% ~/Applications/bali-phy-3.3/bin/bali-phy --version
```

You still need to add it to your PATH as described in Section 2.5, "Add BAli-Phy to your PATH".

#### 2.3.3. Install programs used by bp-analyze using homebrew

You can install gnuplot via homebrew:

```
% brew install gnuplot
```

You can install R via homebrew:

```
% brew tap caskroom/cask
% brew cask install xquartz
% brew install r
```

However, note that this might conflict with R installed from other places, such as MRAN.

#### 2.3.4. Install some of the programs used for viewing the results using homebrew

You can install Figtree with homebrew:

```
% brew tap caskroom/cask
% brew cask install figtree
```

However, Seaview and Tracer don't have homebrew packages at the moment.

# 2.4. Install on Linux

#### 2.4.1. Install BAli-Phy using apt-get

BAli-Phy is available on Ubuntu ("Cosmic Cuttlefish" or later), and Debian (testing and unstable).

```
sudo apt-get install bali-phy
```

Check that the executable runs:

```
% bali-phy --version
```

If you install with apt-get, you don't need to do anything extra to put bali-phy in your PATH.

#### 2.4.2. Install BAli-Phy using executables from website (alternative)

First install wget. If you have Debian or Ubuntu Linux, type:

```
§ sudo apt-get install wget
```

Then download and extract the executables:

```
% mkdir -p ~/Applications
% cd ~/Applications
% wget http://www.bali-phy.org/files/bali-phy-3.3-linux64.tar.gz
% tar -zxf bali-phy-3.3-linux64.tar.gz
```

Second, check that the executable runs:

```
<sup>№</sup> ~/Applications/bali-phy-3.3/bin/bali-phy --version
```

You still need to add it to your PATH as described in Section 2.5, "Add BAli-Phy to your PATH".

#### 2.4.3. Install programs used by bp-analyze

If you have Debian or Ubuntu Linux, you can install other recommended programs by typing:

```
% sudo apt-get install gnuplot
% sudo apt-get install r-base
```

#### 2.4.4. Install programs used to view the results

```
% sudo apt-get install seaview
% sudo apt-get install figtree
```

However, there isn't a Debian or Ubuntu package for Tracer at the moment.

#### 2.5. Add BAli-Phy to your PATH

#### 2.5.1. Is bali-phy in your PATH already?

First check if the executable is in your PATH.

```
§ bali-phy --version
```

If this shows version info, then **bali-phy** is already in your PATH and you can skip this section. This should be true if you installed **bali-phy** using a package manager such as homebrew or apt, or if you've already added it to your PATH.

If bali-phy is not in your path, then you should see:

```
% bali-phy --version
bali-phy: command not found.
```

If bali-phy is not in your PATH, then continue with this section.

#### 2.5.2. Quick version

Add **bali-phy** to your PATH, so that the shell knows where to find it. This command only affects the terminal in which it is typed, and will not affect new terminals:

```
% export PATH=~/Applications/bali-phy-3.3/bin:$PATH
```

To set the PATH automatically for new terminals, type:

```
% test -r ~/.bash_profile && echo 'export PATH=~/Applications/bali-phy-3.3/bin:$PATH' >> ~/.bash_profile
% echo 'export PATH=~/Applications/bali-phy-3.3/bin:$PATH' >> ~/.profile
```

This will affect new terminals only after you log out and log back in though.

Now check that the executable runs:

```
% bali-phy --version
```

If it does, then your PATH is set up correctly, and you can probably skip the rest of this section.

### 2.5.3. I have a path?

If you installed BAli-Phy to the directory ~/Applications, then you can run bali-phy by typing **~/Applications/bali-phy-3.3/bin/bali-phy**. However, it would be much nicer to simply type **bali-phy** and let the computer find the executable for you. This can be achieved by putting the directory that contains the BAli-Phy executables into your "path". The "path" is a colon-separated list of directories that is searched to find program names that you type. It is stored in an environment variable called PATH.

Setting your PATH is also a pre-requisite for running the **bp-analyze** script to summarize your MCMC runs.

#### 2.5.4. Examining your PATH

You can examine the current value of this environment variable by typing:

```
% echo $PATH
```

We will assume that you extracted the bali-phy archive in ~/Applications and so you want to add \$HOME/Applications/bali-phy-3.3/bin to your PATH. (If you installed to another directory, replace \$HOME/Applications/bali-phy-3.3/ with that directory.)

#### 2.5.5. Adding BAli-Phy to your PATH

The commands for doing this depend on what "shell" you are using. Type **echo \$SHELL** to find out. If your shell is **sh** or **bash** then the command looks like this:

```
PATH=$HOME/Applications/bali-phy-3.3/bin:$PATH
```

If your shell is **csh** or **tcsh**, then the command looks like this:

```
§ setenv PATH $HOME/Applications/bali-phy-3.3/bin:$PATH
```

Note that these commands will only affect the window you are typing in, and will vanish when you reboot.

#### 2.5.6. Making the change stick

To make this change survives when you logout or reboot, open your shell configuration file in a text editor, and add the command on a line by itself. This will ensure that it is run every time you log in.

To find the right configuration file, look in your \$HOME directory for .profile (for the Bourne shell **sh**), .bash\_profile (for BASH), or .login (for tcsh). You may have to create the file if it is not present. On Cygwin, you should put the change in the file .bashrc.

If you do not know which directory is your home directory, you can find its full name by typing:

```
% echo $HOME
```

#### 2.6. Test the installed software

In order to determine that the software has been correctly installed, and the PATH has been correctly set, run the following commands:

```
% bali-phy ~/Applications/bali-phy-3.3/share/doc/bali-phy/examples/sequences/5S-rRNA/25.fasta --iter=150
% bali-phy ~/Applications/bali-phy-3.3/share/doc/bali-phy/examples/sequences/5S-rRNA/25.fasta --iter=150
% bp-analyze 25-1 25-2
```

Furthermore, the directories 25-1 and 25-2 should contain a file called C1.log. You should be able to load these files in Tracer, although the chain will not really have converged yet.

# 2.7. Install programs used for viewing the results

• <u>Tracer</u>: MCMC parameter/diagnostic viewer.

• <u>FigTree</u>: Phylogeny Viewer

• <u>SeaView</u>: Alignment viewer.

# 3. Running the program

Here are some examples and explanations of how to run **bali-phy**. You can get an overview of command line options by running **bali-phy** --help.

We recommend running multiple chains in parallel for each command, because

- 1. You can combine the samples, leading to faster run times.
- 2. You can compare the runs to determine if the chains have converged.

This can be done simply by starting several instances of the program, and does not require using MPI or special command-line options.

#### 3.1. Quick Start

The simplest way to run **BAli-Phy** is to type all the arguments on the command line:

```
% bali-phy sequence-file
```

Here *sequence-file* is a FastA or PHYLIP file containing the sequences you wish to analyze. The filename should end in .fasta or .phy to indicate which format it is using.

In this simple example, **bali-phy** automatically detects whether *sequence-file* contains DNA, RNA, or Amino-Acids and uses default values for several command line options. Thus, if *sequence-file* contains DNA, then this is equivalent to the more verbose command line

```
% bali-phy sequence-file --alphabet DNA --smodel tn93 --imodel rs07
```

Here the substitution model is Tamura-Nei, the insertion/deletion model is rs07. If *sequence-file* contains amino acids, then the defaults will be:

```
% bali-phy sequence-file --alphabet Amino-Acids --smodel lg08 --imodel rs07
```

# 3.2. Command line options

You can specify a more complex substitution model as follows:

```
bali-phy sequence-file --smodel lg08+Rates.gamma+inv
```

You may specify an indel model of **none** to fix the alignment to its initial value, and ignore information in shared insertions or deletions.

# 3.3. Running on computing clusters

Running **bali-phy** on a computing cluster is not necessary, but can speed up the analysis dramatically. This is because a cluster allows you to run several *independent* MCMC chains simultaneously and pool the resulting samples. You can run multiple chains simultaneously simply by starting several different instances of **bali-phy**. Each instance of bali-phy runs only one chain and does not require using MPI or special command-line options.

This approach to parallel computation is sometimes more efficient than MCMCMC-based parallelism involving heated chains. It is equivalent to running MCMCMC with no temperature difference between chains, with the exception that it allows results from *all* chains to be used, instead of just results from the single "cold" chain. Thus, if you run 10 independent chains in parallel, then you may gather samples 10 times faster that a single chain.

# 3.4. Option files (Scripts)

In addition to using the command line, you may also specify options in a file. Using an option file can be more convenient if you are going to run the same analysis many times, or if the number of options is large. Furthermore, the option file may contain comments and blank lines. Option files are a good to record what options you used in an analysis, and why.

An option file is specified with the command line option --config file or -cfile. If values for an option are given both on the command line and in an option file, then the command line value overrides the value in the option file.

#### **3.4.1. Syntax**

Option files use the same option names as the command line. However, the syntax is different: each option is given on its own line using the syntax "option = value" instead of the syntax "--option value". If the option has no value then it is given using the syntax "option = option".

#### **3.4.2. Example**

For example, consider the following option file:

```
# sequence data for 3 genes/partitions
align = ITS1.fasta
align = 5.8S.fasta
align = ITS2.fasta

# linked substitution model for 1st and 3rd partition
smodel = 1,3:tn93+Rates.free[n=3]

# substitution model for 2nd partition
smodel = 2:tn93

# indel model for second partition
imodel = 2:none

# linked scale for 1st and 3rd partition
scale = 1,3:
```

The align option indicates sequence files, and has no name on the command line. Lines that begin with # are comments, and blank lines are ignored. This is thus equivalent to the rather long command line:

```
% bali-phy ITS1.fasta 5.8S.fasta ITS2.fasta --smodel=1,3:tn93+Rates.free[n=3] --smodel=2:tn93 --imodel=2:none --
scale=1,3:
```

#### 3.4.3. The configuration file

The file ~/.bali-phy is a special option file called the *configuration file*. If it exists, it is always loaded. Options given on the command line or an option file override values given in ~/.bali-phy.

# 4. Input

# 4.1. Sequence formats

BAli-Phy can read in sequences and alignments in both FastA and PHYLIP formats. Filenames for FastA files should end in .fasta, .mpfa, .fna, .fas, .fsa, or .fa. Filenames for PHYLIP files should end in .phy. If one of these extensions is not used, then BAli-Phy will attempt to guess which format is being used.

# 4.2. Is my data set too large?

Large data sets run more slowly than small data sets. We recommend a conservative starting point with few taxa and short sequence lengths. You can then increase the size of your data set until a balance between speed and size is reached. The tool <code>alignment-thin</code> described in Section 11, "Alignment utilities" can be used to construct a smaller data set.

The number of MCMC samples that you need depends on whether you are primarily interested in obtaining a point estimate or in obtaining detailed measures of confidence and uncertainty. For detailed measures of confidence and uncertainty you should obtain a minimum of 10,000 samples after the Markov chain converges. For an estimate, you don't need very many samples after convergence. (But you may need many samples to be sure that you've converged!)

See also Section 3.3, "Running on computing clusters".

### **4.2.1. Too many taxa?**

BAli-Phy is quite CPU intensive, and so we recommend using 150 or fewer taxa in order to limit the time required to accumulate enough MCMC samples.

When designing an MCMC analysis, I recommend performing an initial analysis with a much smaller number of sequences. This smaller analysis will run much faster, and allow discovering mistakes much more quickly. Then, after you are sure that you are running the program correctly and have chosen the best model, you can ramp up the number of sequences towards your desired number.

#### 4.2.2. Sequences too long?

Aligning just a pair of sequences takes  $O(L^2)$  time and memory, where L represents the sequence length. Therefore sequences longer than (say) 1000 letters become increasingly impractical. However, you might try to see how long you can make your sequences before you run out of memory, or the program becomes too slow.

For multi-gene analyses, two separate data partitions (i.e. genes) of 500 letters will be twice as fast to align as one data partition of 1000 letters. So, it may be possible to analyze several genes as long as each gene individually is not too long.

Also, note that you can sometimes speed up the analysis of protein sequences by coding them as amino acids or codons, rather than nucleotides. This is because it decreases the sequence length.

# 5. Output

# **5.1. Output directory**

BAli-Phy creates a new directory to store its output files each time it is run. By default, the directory name is the name of the sequence file, with a number added on the end to make it unique. BAli-Phy first checks if there is already a directory called file-1/, and then moves on to file-2/, etc. until it finds an unused directory name.

You can specify a different name to use instead of the sequence-file name by using the --name option.

#### 5.2. Output files

BAli-Phy writes the following output files inside the directory that it creates:

Iteration numbers, probabilities, success probabilities for transition kernels, etc..

C1.out

**C1.P**p.**fastas** Sampled alignments for partition p including ancestral sequences.

**C1.err** Log file for hopefully irrelevant error messages.

**C1.MAP** Successive estimates of the MAP alignment, tree and parameters.

C1.log Numeric parameters: indel and substitution rates, etc.
C1.trees Tree samples: one sample per line, in Newick format.

**C1.run.json** JSON file containing information about the command line, models, hostname, start time,

etc.

For the last two files, each line in these files corresponds to one iteration.

#### 5.2.1. Field names in C1.log

This section explains the meaning of the various field names in the file C1.log.

#### 5.2.1.1. Computed parameter names

**prior** The log prior probability. This includes the probability of the alignment, since the

alignment is not observed.

**prior\_An** The log of the probability  $Pr(A_n | \tau, T, \Lambda)$  of the alignment  $A_n$  of the *n*th partition, given

the topology  $\tau$ , the branch lengths T, and insertion-deletion process parameters  $\Lambda$ . This log probability is the probabilistic equivalent of a gap penalty on the alignment  $A_n$  given

the scoring parameters  $\Lambda$ .

**likelihood** The log of the likelihood. Conditional on the alignment, this is determined entirely by the

substitution model, and ignores insertions and deletions. This is the probabilistic

equivalent of the mismatch penalty.

**posterior** The log of the posterior probability. The posterior probability is the product of the prior

and the likelihood.

**|A|** The total number of alignment columns across all partitions.

#indelsn The number of indel events in partition n, if we group adjacent indels that occur on the

same branch.

**#indels** The total number of indel events across all partitions, if we group adjacent indels that

occur on the same branch.

 $|indels_n|$  The length of indel events in partition n, if we group adjacent indels that occur on the

same branch.

|indels| The total length of indel events across all partitions, if we group adjacent indels that

occur on the same branch.

#substsn The unweighted parsimony score for substitutions in partition n.

**#substs** The total unweighted parsimony score for substitutions across all partitions.

**Scale**n \* |T| The branch lengths for partition group n.

#### 5.2.1.2. Model parameter names

The prefixes  $S_n$  and  $I_n$  will be dropped if not necessary to disambiguate parameters with the same name in different sub-models.

**Scale** [n] The average number of substitutions per branch in scale group n. The nth scale group applies

to the nth partition, unless multiple partitions are forced to have the same branch length

scale using --scale or --link.

**Sn/name** Parameter name in the nth substitution model.

**In/name** Parameter name in the nth insertion/deletion model.

# 5.3. Summarizing the output

This section is primarily about extracting estimates from output files. See <u>Section 10, "Convergence and Mixing: Is it done yet?"</u> for methods of determine effective sample sizes, and for checking mixing and convergence.

#### 5.3.1. Finding the majority consensus tree

To compute the majority consensus tree, do the following. (The program <u>FigTree</u> allows you to view the resulting tree file graphically.)

```
% trees-consensus dir-1/C1.trees dir-2/C1.trees > c50.PP.tree
```

By default, the first 10% of tree samples are skipped as burn-in (--skip=10% or -s 10%) and every generation is analyzed (--subsample=1 or -x 1). To discard the first 1000 tree samples and analyze every 10th sample:

```
\frac{9}{2} trees-consensus -s 1000 -x 10 dir-1/C1.trees dir-2/C1.trees > c50.PP.tree
```

By default, splits are included in the consensus tree if they have a PP greater than 0.5. You can specify a more stringent level (e.g. 0.66) by adding the option --consensus-PP=0.66 as follows:

```
½ trees-consensus -s20% -x10 --consensus-PP=0.66 dir-1/C1.trees dir-2/C1.trees > c66.PP.tree
```

You may also make the program write directly to the output file (e.g. c66.PP.tree) by using the more general form --consensus-PP=0.66:c66.PP.tree. Leaving off the ":c66.PP.tree" part (as we did above) or specifying ":-" sends the output to the standard output (e.g. the terminal, if not redirected).

```
% trees-consensus -s20% -x10 dir-1/C1.trees dir-2/C1.trees --consensus-PP=0.66:c66.PP.tree
```

You can supply multiple levels and filenames separated by commas. This is faster than running the program multiple times with different consensus levels.

```
½ trees-consensus -s20% -x10 dir-1/C1.trees dir-2/C1.trees --consensus-PP=0.5:c50.PP.tree,0.66:c66.PP.tree
```

Finally, you may use the option --consensus= instead of the option --consensus-PP= if you do not wish the resulting tree to contain embedded posterior probabilities on branches, as well as branch lengths.

```
½ trees-consensus -s20% -x10 dir-1/C1.trees dir-2/C1.trees --consensus=0.5:c50.PP.tree,0.66:c66.PP.tree
```

Both the --consensus= and --consensus-PP= options may be given simultaneously.

See trees-consensus --help for a complete list of options.

#### 5.3.2. Finding the greedy consensus tree

The greedy consensus tree may be used instead of a majority-consensus tree when a fully resolved (e.g. bifurcating) tree is required. When the topology has many tips and each topology may be sampled only once, the greedy consensus should be higher quality than the estimate of the MAP topology. To obtained a fully resolved tree, the greedy consensus strategy starts with the majority consensus and then adds the highest-supported split that does not conflict.

To compute the greedy consensus tree do:

```
% trees-consensus --skip=burnin dir-1/C1.trees dir-2/C1.trees --greedy-consensus=greedy.tree
```

#### 5.3.3. Finding the M.A.P. tree

To compute the *maximum a posteriori* tree do:

```
% trees-consensus --skip=burnin dir-1/C1.trees dir-2/C1.trees --map-tree=MAP.tree
```

When the tree has many tips, each topology may be sampled only once, leading to low quality estimates of the MAP topology. As a result, when you need a bifurcating tree you should probably use the greedy consensus instead.

#### 5.3.4. Checking topology convergence

```
% trees-bootstrap dir-1/C1.trees dir-2/C1.trees
```

This command computes the effective sample size for the posterior probability of each split. It also computes the Average Standard Deviation of Split Frequencies (ASDSF) between two or more independent runs.

See Section 10, "Convergence and Mixing: Is it done yet?" for more information.

#### 5.3.5. Summarizing numerical parameters

This command gives a median and confidence interval, ESS, and a stabilization time:

```
% statreport dir-1/C1.log dir-2/C1.log > Report
```

When multiple runs are analyzed, this command gives PSRF and joint ESS values. The program <u>Tracer</u> allows you to view the same summaries graphically.

See Section 10, "Convergence and Mixing: Is it done yet?" for more information.

#### 5.3.6. Computing an alignment using Posterior Decoding

```
% cut-range --skip=burn-in < C1.Pp.fastas | alignment-max > Pp-max.fasta
```

You can use the program <u>SeaView</u> to view the alignment graphically.

#### 5.3.7. Create an Au (Alignment Uncertainty) plot

To annotate a specific alignment alignment.fasta, choose a fully resolved tree estimate tree:

```
% cut-range --skip=burn-in < C1.Pp.fastas | alignment-gild alignment.fasta tree > alignment-AU.prob
% alignment-draw alignment.fasta --AU alignment-AU.prob > alignment-AU.html
```

The majority consensus tree is usually not fully resolved, so we recommend using the greedy consensus instead.

# 5.4. Summarizing the output - scripted

Instead of manually running each of the steps to analyze the output files, you may instead run the PERL script **bp-analyze** to execute these commands. The script will create an HTML page Results/index.html that summarizes the posterior distribution.

You may run **bp-analyze** inside the output directory, like this:

```
% bp-analyze --burnin=iterations
```

You may also run it with one or more output directories as arguments, like this:

```
\S bp-analyze --burnin=iterations directory-1/ directory-2/
```

In this case, output from multiple runs will be used to assess convergence and mixing, as well as to increase the precision of the estimates.

All the commands that are executed by **bp-analyze** will be logged to Results/bp-analyze.log. You can also see these commands as they are executed by supplying the **--verbose** option:

#### 5.4.1. Meaning of generated files

The Results/ directory will contain the following useful files:

**Report** A summary of numerical parameters: credible intervals and mixing.

**consensus** A summary of supported splits (clades).

**c-** The number of splits (clades) supported at each LOD level.

levels.plot

**c50.tree** The majority consensus topology + branch lengths (Newick format)

**c50.PP.tree** The majority consensus topology + branch lengths + Posterior Probabilities (Newick

format)

**MAP.tree** An estimate of the MAP topology + branch lengths (Newick format)

The following files will be generated to summarize alignment uncertainty, unless the analysis uses a fixed alignment.

**P**p-max.fasta An estimate of the alignment for partition p using maximum posterior decoding.

**Pp-max-AU.html** An AU plot of the maximum posterior decoding alignment for partition p (AA/DNA)

color-scheme).

The following files describe convergence and mixing:

**partitions.bs** Confidence intervals on the support for partitions, generated using a block bootstrap.

**partitions.SRQ** A collection of SRQ plots for the supported partitions.

**c50.SRQ** An SRQ plot for the majority consensus tree.

The SRQ plots can be viewed by typing "plot 'file' with lines" in gnuplot.

#### 5.4.2. Mixing/partitions.bs: partition mixing

This file reports the quality of estimates of support for each partition in terms of the posterior probability (PP) and log-10 odds (LOD). It also reports the auto-correlation time (ACT), the effective sample size (Ne), the number of samples that support (1) or do not support (0) the partition, and the number of regenerations. Only partitions with PP > 0.1 are shown by default.

# 6. Substitution models

#### 6.1. DNA and RNA models

The default substitution model for DNA and RNA is tn93.

#### 6.1.1. Substitution rates

All the DNA models are special cases of the GTR model.

Model	d.f.	Summary
jc69	0	Equal rates and equal base frequencies. (Jukes and Cantor, 1969)
k80	1	Unequal transition & transversion rates, equal base frequencies. (Kimura, 1980)

f81	3	Equal exchangabilities, unequal frequencies. (Felsenstein, 1981)
hky85	4	Unequal Transition & transversion rates, unequal base frequencies. (Hasegawa, Kishino, and Yano, 1985)
tn93	5	Unequal rates for transitions (purines), transitions (pyrimadies) and transversions, unequal base frequencies.  (Tamura and Nei, 1993)
gtr	8	Unequal exchangeabilities, unequal frequencies. (Tavare, 1986)

#### 6.1.2. Frequencies

Frequencies are estimated by default. Users can fix frequencies by setting the pi parameter to a constant value, if the model allows unequal frequencies.

Constant frequencies are specified as a list of pairs that associates each letter with its frequency:

```
gtr[pi=List[Pair["A",0.1],Pair["C",0.2],Pair["T",0.3],Pair["G",0.4]]
```

Frequencies can also be specified using functions:

gtr[pi=Frequencies.uniform]

Model	d.f.	Summary
Frequencies.uniform	0	Equal frequencies

# 6.2. Protein models

The default substitution model for proteins is lg08.

#### 6.2.1. Substitution rates

Model	d.f.	Summary
jc69	0	Equal rates and equal frequencies. (Jukes and Cantor, 1969)
f81	19	Equal exchangabilities, unequal frequencies. (Felsenstein, 1981)
jtt+f	19	Empirical exchange rates, all proteins. (Jones, Taylor, Thornton 1992)
wag+f	19	Empirical exchange rates, all proteins.  Whelan and Goldman (2001)
lg08+f	19	Empirical exchange rates, all proteins.  Le and Gascuel (2008)
empirical[file]+f	19	
gtr	208	Unequal exchangeabilities, unequal frequencies. (Tavare, 1986)

# 6.2.2. Frequencies

Frequencies are estimated by default. Users can fix frequencies by setting the **pi** parameter to a constant value, if the model allows unequal frequencies.

Constant frequencies are specified as a list of pairs that associates each letter with its frequency:

```
wag+f[pi=List[Pair["A",0.047],Pair["R",0.19],...]]
```

Frequencies can also be specified using functions:

wag+f[pi=Frequencies.uniform]]

Model	d.f.	Summary
Frequencies.uniform	0	Equal frequencies
wag_freq	0	The constant amino-acid frequencies from the WAG paper.
lg08_freq	0	The constant amino-acid frequencies from the LG08 paper.

The +fe model is shorthand for +f[pi=Frequencies.uniform]:

wag+fe

# **6.3. Triplet models**

The triplets alphabet is similar to the codons alphabet, except that stop codons are not removed. Unlike the codons alphabet, the triplets alphabet has no knowledge of the genetic code.

The default substitution model for triplets is tn93+x3.

#### 6.3.1. Substitution rates

Model	d.f.	Summary
nuc_model+x3_sym+f	df(nuc_model)+63	GY94-style rate matrix constructed from nucleotide exchangability matrix.
nuc_model+x3	df(nuc_model)	MG94-style rate matrix constructed from nucleotide rate matrix.
x3x3[q1,q2,q3]	df(q1)+df(q2)+df(q3)	Triplet rate matrix constructed from a nucleotide rate matrix for each codon position.

#### 6.3.2. Frequencies

Frequencies are estimated by default. Users can fix frequencies by setting the **pi** parameter to a constant value, if the model allows unequal frequencies.

Constant frequencies are specified as a list of pairs that associates each letter with its frequency.

Frequencies can also be specified using functions:

hky85\_sym+x3\_sym+f[pi=f1x4] // nucleotide frequencies are estimated

Model	d.f.	Summary
Frequencies.uniform	0	Equal frequencies
f1x4	3	Constructs triplet frequencies from independent nucleotide frequencies.
f3x4	9	Constructs triplet frequencies from independent nucleotide frequencies for each codon position.

hky85\_sym+x3\_sym+fe

BAli-Phy interprets branch lengths for codon models as 1/3 the number of substitution per triplet. Thus, they should be comparable to branch lengths under DNA/RNA models.

# 6.4. Codon models

The default substitution model for codons is gy94.

### **6.4.1. Substitution rates**

Model	d.f.	Summary
gy94	62	Model of dN/dS with a separate frequency for each codon. Rate for changing a nucleotide depends on neighboring nucleotides. (Goldman and Yang, 1994)
gy94[pi=f1x4]	5	The GY94 model with codon frequencies constructed from nucleotide frequencies. (Goldman and Yang, 1994)
gy94[pi=f3x4]	11	The GY94 model with codon frequencies constructed from nucleotide frequencies for each codon position. (Goldman and Yang, 1994)
gy94_ext[nuc_model]	df(nuc_model)+61	GY94 model extended with a generic nucleotide exchangeability matrix. (Goldman and Yang, 1994)
mg94	4	Model of dN/dS with f81 as the neutral model. Rate for changing a nucleotide depends only on that nucleotide. (Muse and Gaut, 1994)
mg94k	5	Model of dN/dS with hky85 as the neutral model. (Muse and Gaut, 1994)
mg94_ext[nuc_model]	<pre>df(nuc_model)+1</pre>	Model of dN/dS with nuc_model as the neutral model. (Muse and Gaut, 1994)
fMutSel	65	MG94-like model with fitnesses for each codon. (Yang and Nielsen, 2008)
fMutSel0	24	MG94-like model with fitnesses for each amino-acid. (Yang and Nielsen, 2008)
nuc_model+x3_sym+f	df(nuc_model)+60	GY94-style rate matrix constructed from nucleotide exchangability matrix (dN/dS = 1).
nuc_model+x3	df(nuc_model)	MG94-style rate matrix constructed from nucleotide rate matrix $(dN/dS = 1)$ .
x3x3[q1,q2,q3]	df(q1)+df(q2)+df(q3)	Triplet rate matrix constructed from a nucleotide rate matrix for each codon

		position $(dN/dS = 1)$ .
<pre>codon_model+dNdS[omega]</pre>	df(codon_model)+1	Scales non-synonymous rates by omega.

BAli-Phy interprets branch lengths for codon models as 1/3 of the number of substitutions per codon. Thus, they should be comparable to branch lengths under DNA/RNA models.

The x3, x3\_sym, x3x3, and dNdS models can be used to build up codon models piecewise:

- mg94 is equivalent to f81+x3+dNdS.
- gy94 is equivalent to hky85\_sym+x3\_sym+f+dNdS.

#### 6.4.2. Frequencies

Frequencies are estimated by default. Users can fix frequencies by setting the **pi** parameter to a constant value, if the model allows unequal frequencies.

Constant frequencies are specified as a list of pairs that associates each letter with its frequency.

```
gy94[pi=List[Pair["AAA",0.01],Pair["C",0.02],...]]
mg94[pi=List[Pair["A",0.1],Pair["C",0.2],Pair["T",0.3],Pair["G",0.4]]]
```

Frequencies can also be specified using functions:

Model	d.f.	Summary
Frequencies.uniform	0	Equal frequencies
f1x4	3	Constructs codon frequencies from independent nucleotide frequencies.
f3x4	9	Constructs codon frequencies from independent nucleotide frequencies for each codon position.

#### 6.4.3. Genetic Codes

When using a codon-based substitution model like gy94, you may select the genetic code by specifying --alphabet Codons[,genetic-code]. Available genetic codes are standard, mt-vert, mt-invert, mt-yeast, mt-protozoan.

If the genetic code is not specified, then the standard code is used:

```
% bali-phy sequence-file --smodel gy94 --alphabet Codons
% bali-phy sequence-file --smodel gy94 --alphabet Codons[RNA]
```

These examples specify the vertebrate mitochondrial code:

```
% bali-phy sequence-file --smodel gy94 --alphabet Codons[DNA,mt-vert]
% bali-phy sequence-file --smodel gy94 --alphabet Codons[,mt-vert]
```

# 6.4.4. Heterogeneous dN/dS and tests for positive selection

Model	d.f.	Summary
m1a	df(submodel)+2	A mixture of conserved and neutral sites. (Wong, et. al. 2004)
m2a	df(submodel)+4	A mixture of conserved, neutral, and positively-selected sites. (Wong, et. al. 2004)
m2a_test	df(submodel)+4	A Bayesian test for positive selection that compares

		M2a with M1a. (Wong, et. al. 2004)
m3	df(submodel)+2*n-1	An free mixture of $n$ categories of conserved dN/dS values. (Yang et. al. 2000)
m3_test	df(submodel)+2*n+1	A Bayesian test for positive selection based on the M3 model extended with an extra category of either neutral of positively-selected sites.
m7	df(submodel)+2	The M7 model places a beta distribution on dN/dS. (Yang et. al. 2000)
m8a	df(submodel)+3	The M8a model adds a category of <i>neutral</i> sites to the M7 model. (Swanson et. al. 2003)
m8	df(submodel)+4	The M8 model adds a category of <i>positively-selected</i> sites to the M7 model. (Yang et. al. 2000)
m8a_test	df(submodel)+4	A Bayesian test for positive selection that compares the M8 to the M8a model. (Swanson et. al. 2003)
branch_site	df(submodel)+4	A Bayesian test for positive selection that on some (unknown) sites and some (known) branches.  (Zhang et. al 2005)

#### 6.4.5. The branch-site substitution model

In order to use the branch-site substitution model, the user needs to specify an unrooted tree topology and disable topology changes in order to keep the topology fixed:

```
% bali-phy alignment.fasta -S branch site -T tree.tree --disable=topology
```

The tree file should be in Newick format, with foreground branches labelled using NHX attributes. The NHX attribute must be applied to the branch, not the node, so it must occur after a colon.

#### Example 1. An tree with a foreground branch

(((A1, B1), (C1, D1)), ((E1:[&&NHX:foreground=1], F1:[&&NHX:foreground=1]), (G1, H1)), (((A2, B2), (C2, D2)), ((E2, F2), (G2, H2))));

The posterior probability of positive selection is the posterior mean of the posSelection parameter. This may be computed using the statreport program with the --mean option. In case this probability is extremely close to 1 or 0, you may wish to add the option --Rao-Blackwellize branch\_site:posSelection. This will report the log-probability of positive selection each iteration. The user may exponentiate the reported values and then average them (using R, for example) in order to compute a more accurate estimate of the posterior probability of positive selection.

#### 6.5. Heterogenous Rates across Sites

Complex substitution models in BAli-Phy are constructed as mixtures of reversible CTMC models that run at different rates (e.g.  $\Gamma_4 + INV$ ) or have different parameters (e.g. an M2a codon model).

Model	d.f.	Summary
submodel +	df(submodel)+1	Site rates follow a discrete approximation to the Gamma distribution

Rates.gamma		(Yang 1994)
<pre>submodel + Rates.log_normal</pre>	df(submodel)+1	Site rates follow a discrete approximation to the logNormal distribution
submodel + Rates.free	df(submodel)+2(n-1)	Sites fall in one of <i>n</i> categories. Each category has its own rate.  (Yang 1995)
<pre>submodel + multi_rate[dist]</pre>	<pre>df(submodel)+df(dist)</pre>	Sites rates follow a discrete approximation to the distribution <i>dist</i> .
submodel + inv	df(submodel)+1	Some fraction inv:p_inv of sites are invariable.

# 7. Insertion/deletion models

Each of these models is a probability distribution on pairwise alignments. The probability distribution on multiple sequence alignments  $\Pr(A \mid T, \tau, \Lambda)$  is constructed by factoring the multiple sequence alignment into pairwise alignments along each branch of the tree, as described in Redelings and Suchard (2005).

The default insertion/deletion model is rs07.

Model	d.f.	Summary	
rs05	3	A symmetric insertion-deletion model with geometrically-distributed indel lengths.  Indels occur on all branches with the same probability, regardless of branch length.  (Redelings and Suchard, 2005)	
rs07	2	A symmetric insertion-deletion model with geometrically-distributed indel lengths.  Longer branches have more indels.  (Redelings and Suchard, 2007)	
none		No indel model for the partition, indels uninformative. Fixed alignment for the partition.	

The user can specify priors and parameters for indel models (See section Section 8, "Models and Priors"):

```
rs07[log_rate~log_laplace[-4,0.707],mean_length=2]
```

# 8. Models and Priors

#### 8.1. Models and distributions are functions

Models, probability distributions, and functions are treated the same in BAli-Phy because all of them have parameters or arguments. Parameters have names in BAli-Phy. Parameter values are specified using square brackets as follows:

```
hky85[kappa=2] // model
log[x=2] // function
normal[mean=0,sigma=1] // probability distribution
```

It is possible to specify parameter values by position instead of by name:

```
hky85[2]
log[2]
normal[0,1]
```

It is even possible to mix positional and named arguments, as long as all the positional arguments come before all the named arguments:

```
normal[0,sigma=1] // OK
normal[mean=0,1] // not OK
```

The order and type of parameters for a function can be found with the help command. For example,

```
% bali-phy help hky85
```

A value must be given for each parameter, unless the parameter has a default value (See <u>Section 8.4, "Default values and default priors"</u>).

#### Note

If you are using the **csh**, **tcsh**, or **zsh** instead of the **bash** shell, then you need to put single quotes around terms with square brackets on the command-line:

```
% bali-phy file.fasta -S 'hky85[kappa=2]'
```

If you do not add quotes, you will get an error message like "bali-phy: No match." (for csh) or "zsh: no matches found: hky85[kappa=2]" (for zsh).

#### 8.2. Models and '+' notation

Models in phylogenetics literature are often combined using +. For example, the model wag+F+G4+I starts with the WAG amino-acid model, and places several modifiers, like "+G4" on the right.

BAli-Phy follows this convention by treating A+B as an abbreviation for B[submodel=A]:

```
hky85+Rates.gamma // rewritten to Rates.gamma[submodel=hky85]
hky85+inv // rewritten to inv[submodel=hky85]
wag+f // rewritten to f[submodel=wag]
wag+f+Rates.gamma+inv // rewritten to inv[submodel=Rates.gamma[submodel=f[submodel=wag]]]
```

This allows a simple method for combining models, when one model is an argument to another model.

#### 8.3. Priors

#### 8.3.1. Specifying priors

Priors on model parameters are specified by giving a random value. Random values can be obtained from distributions using the function sample. For example, this places a log-normal prior on the parameter kappa of the hky85 model:

```
hky85[kappa=sample[log_normal[1,1]]]
```

You can write ~Dist as a shorthand for sample[Dist]:

```
hky85[kappa=~log_normal[1,1]]
```

The =~ can be further shortened to just ~:

```
hky85[kappa~log_normal[1,1]]
```

#### 8.3.2. Random function arguments

It also is possible to use random values as inputs to other functions. For example:

```
add[1,~exponential[10]]
```

In such cases the parameter value should be specified with =, as in the following example:

```
rs07[mean_length=add[1,~exponential[10]]]]
```

#### 8.3.3. Distributions are not random values

Random values and distributions have different types. For example, the following is of type Distribution[Double]:

```
uniform[0,1]
```

In contrast, the following are both of type **Double**:

```
sample[uniform[0,1]]
~uniform[0,1]
```

This is important when passing distributions as arguments to other distributions and functions. For example, the distribution **iid** is used to generate a specific number of samples from another distribution. Thus, it needs to receive a distribution as an argument:

```
~iid[4,normal[0,1]]  // OK : 4 samples from the normal[0,1] distribution
~iid[4,~normal[0,1]]  // not OK: 4 samples from ... a random number?
```

(See Section 8.5, "Argument and result types".)

# 8.4. Default values and default priors

Some function arguments have default values. For example, the Rates.gamma parameter n has a default value of 4. Thus the following are equivalent:

```
hky85+Rates.gamma[n=4]+inv
hky85+Rates.gamma+inv
```

When the default value is random, then the argument has a default prior. For example, the kappa parameter of hky85 has a default value of ~log\_normal[log[2],0.25], so the following are equivalent:

```
hky85[kappa~log_normal[log[2],0.25]]
hky85
```

The help command can be used to determine the default value for a parameter, if there is one.

### 8.5. Argument and result types

Every function has a *result type*, as well as an *argument type* for each argument. The argument type specifies what kind of arguments are acceptable, and the result type specifies what kind of result the function produces. Types include **Int** for integers, **Double** for double-precision floating point numbers, and **String** for text strings. Integer arguments are implicitly converted to **Double** when the argument type is **Double**.

Some types contain parameters. For example <code>List[Int]</code> indicates a list of integers and <code>List[Double]</code> indicates a list of real numbers. In order to indicate a list of unknown type, we use a type variable <code>a</code> and write <code>List[a]</code>. Type variables always begin with a lower-case letter. They are able to match any specific type, and their value is found by pattern-matching. For example, the function <code>add[x,y]</code> takes two arguments of type <code>a</code> and has a result of type <code>a</code>. Thus:

```
add[1,2] // arguments are a=Int, so result is of type Int add[1.0,2.0] // arguments are a=Double, so result is of type Double
```

Pair[a,b] is a parameterized type that can be specialized to (for example) Pair[String, Double] and Pair[Int,Int].

Types for components of substitution models are often parameterized by type of the alphabet. For example, hky85 has a result type of RevCTMC[a], where a could be DNA or RNA. The use of alphabet types in substitution models prevents combining substitution models with mismatched alphabets.

# 9. Partitioned data sets

#### 9.1. Partitions

You should analyze multiple genes under different evolutionary models by putting each one it its own data partition. Placing different genes in different partitions means that their alignments vary independently. It also prevents sequences in one gene from being aligned against sequences in another gene.

Different partitions share the same tree topology and a common set of unscaled branch lengths. However, branch lengths are scaled by a different factor in each partition, since some genes may evolve faster than others.

To put different genes in different partitions, you should place the sequences from each partition in a different FASTA or Phylip file:

```
% bali-phy sequence-file1 sequence-file2
```

The sequence names in files for all partitions should be the same.

#### 9.2. Unlinked models

By default, each partition will have its own substitution model, insertion/deletion model, and scaled tree length. For example, even if all partitions are assigned a tn93 substitution model, their base frequencies will all be estimated independently. When parameters are estimated separately for two partitions, we say that the parameters for those partitions are "unlinked".

A substitution model or insertion-deletion model that is specified without qualification will apply to every partition. However, each partition will recieve its own copy of each model with unlinked parameter values:

```
% bali-phy sequence-file1 sequence-file2 --smodel tn93 --imodel rs07
```

You can select partition-specific values for 4 options: --smodel, --imodel, --alphabet, and --scale. For example, to specify different substitution models but the same alphabet:

```
% bali-phy sequence-file1 sequence-file2 --smodel 1:tn93 --smodel 2:gtr --alphabet DNA
```

#### 9.3. Fixing the alignment in some partitions

You can fix the alignment and ignore insertion/deletion information in one partition, while allowing the alignment to vary and using insertion/deletion information in another partition:

```
§ bali-phy sequence-file1 sequence-file2 --imodel 2:none
```

Since alignments are estimated by default, the alignment will be estimated in the first partition, but fixed in the second partition.

Specifying specify -I none fixes the alignment in all partitions:

```
% bali-phy sequence-file1 sequence-file2 -I none
```

### 9.4. Linked models

You can also specify that two partitions share a single copy of a single substitution model or indel model. For example, if two partitions both have a tn93 model, linking these models would force the partitions to have the same nucleotide frequencies and substitution rates. Linking partitions reduces the number of parameters that need to be estimated, and also pools information between the partitions:

```
🟂 bali-phy sequence-file1 sequence-file2 --smodel 1,2:tn93 --imodel 1,2:rs07
```

By default each partition has a separate scale, but you can force groups of partitions to share a scale as follows:

# 9.5. Linking models via the link command

The --link command is provided to allow specifying a model for each partition separately, and then afterwards choose which partitions to link.

```
% bali-phy sequence-file1 sequence-file2 --smodel 1:tn93 --smodel 2:tn93 --link=1,2 -t
% bali-phy sequence-file1 sequence-file2 --smodel tn93 --link=1,2 -t
```

If the linked partitions are given different models, BAli-Phy will give an error and refuse to run:

```
bali-phy sequence-file1 sequence-file2 --smodel 1:tn93 --link=1,2 -t
bali-phy: Error! Partitions 1 and 2 cannot be linked because they have differing values 'tn93' and ''
```

You can also specify which of the 3 attributes "smodel", "imodel", and "scale" are being linked:

```
% bali-phy sequence-file1 sequence-file2 --link=1,2:smodel,scale -t // Don't link the indel model
```

# 10. Convergence and Mixing: Is it done yet?

When using Markov chain Monte Carlo (MCMC) programs like MrBayes, BEAST or BAli-Phy, it is hard to determine in advance how many iterations are required to give a good estimate. The number depends on the specific data set that is being examined. As a result, BAli-Phy relies on the user to analyze the output of a running chain periodically in order to determine when enough samples have been obtained. This section describes a number of techniques to diagnose when more samples must be taken.

Some of the better diagnostics for lack of convergence rely on running at least 2 independent copies of the Markov chain (preferably 4-10) from different random starting points to see if the sampled posterior distributions for each chain are the same. Unfortunately, when the distributions all seem to be this same, this doesn't *prove* that they have all converged to the equilibrium distribution. However, if the distributions are different then you can reject either convergence or good mixing.

#### 10.1. Definition of Convergence

Convergence refers to the the tendency of a Markov chain to to "forget" its starting value and become typical of its equilibrium distribution. Note that convergence is a property of the Markov chain itself, not of individual runs of the Markov chain. Ideally a number of individual runs should be examined in order to determine how many initial iterations to discard as "burnin".

# 10.2. Definition of Mixing

In MCMC, each sample is not fully independent of previous samples. In fact, even after a Markov chain has converged, it can get "stuck" in one part of the parameter space for a long time, before jumping to an equally important part. When this happens, each new sample contributes very little new information, and we need to obtain many more samples to get good precision on our parameter estimates. In such a case, we say that the chain isn't "mixing" well.

# 10.3. Diagnostics: Variation in split frequencies across runs (ASDSF/MSDSF)

#### 10.3.1. ASDSF and MSDSF

To calculate the ASDSF and MSDSF run:

```
% trees-bootstrap dir-1/C1.trees dir-2/C1.trees ... dir-n/C1.trees > partitions.bs
```

For each split, the SDSF value is just the standard deviation across runs of the Posterior Probabilities for that split. By averaging the resulting SDSF values across splits, we may obtain the ASDSF value (Huelsenbeck and Ronquist 2001). This is commonly considered acceptable if it is < 0.01.

However, it is also useful to consider the maximum of the SDSF values (MSDSF). This represents the range of

variation in PP across the runs for the split with the most variation.

#### 10.3.2. Split-frequency comparison plot

To generate the split-frequency comparison plot, you must have R installed. Locate the script compare-runs.R. Then run:

```
\frac{1}{2} trees-bootstrap dir-1/C1.trees dir-2/C1.trees ... dir-n/C1.trees --LOD-table=LOD-table > partitions.bs \frac{1}{2} R --slave --vanilla --args LOD-table compare-SF.pdf < compare-runs.R
```

Following <u>Beiko et al (2006)</u>, this displays the variation in estimates of split frequencies across runs. Splits are arranged on the x-axis in increasing order of Posterior Probability (PP), which is obtained by averaging over runs. We then plot a vertical bar from the minimum PP to the maximum PP.

#### 10.4. Diagnostics: Potential Scale Reduction Factors (PSRF)

Potential Scale Reduction Factors check that different runs have similar posterior distributions. Only numerical variables may have a PSRF. To calculate the PSRF for each numerical parameter, you may run:

```
§ statreport dir-1/C1.log dir-2/C2.p ... dir-n/C1.log > Report
```

The PSRF is a ratio of the width of the pooled distribution to the average width of each distribution, and should ideally be 1. The PSRF is customarily considered to be small enough if it is less than 1.01.

We compare the PSRF based on the length of 80% credible intervals (Brooks and Gelman 1998) and report the result as PSRF-80%CI. For integer-valued parameters, we avoid excessively large PSRF values by subtracting 1 from the width of the pooled CI.

We also report a new PSRF that is more sensitive for integer distributions. For each individual distribution, we find the 80% credible interval. We divide the probability of that interval (which may be more than 80%) by the probability of the same interval under the pooled distribution. The average of this measure over all distributions gives us a PSRF that we report as PSRF-RCF.

This convergence diagnostic gives a criterion for detecting when a parameter value has stabilized at different values in several independent runs, indicating a lack of convergence. This situation might occur if different runs of the Markov chain were trapped in different modes and failed to adequately mix between modes.

# 10.5. Diagnostics: Effective sample sizes (ESS)

#### 10.5.1. ESS for numerical values

To calculate the split ESS values, run:

```
§ statreport dir-1/C1.log dir-2/C1.log ... dir-n/C1.log > Report
```

We calculate effective sample sizes based on integrated autocorrelation times. This method has the nice property that simply duplicating every sample does not increase the ESS.

The program Tracer also computes ESS values.

#### 10.5.2. ESS for split frequencies

To calculate the split ESS values, run:

```
\frac{8}{2} trees-bootstrap dir-1/C1.trees dir-2/C1.trees ... dir-n/C1.trees > partitions.bs
```

To compute the ESS for a split, we consider the presence or absence of a split in each iteration as a series of binary values. We compute the integrated autocorrelation time for this binary sequence, which leads to an ESS. This approach is similar to dividing the iterations into blocks and computing the ESS on the PP estimates in the blocks. It is also similar to estimating the variance reduction under a block bootstrap.

#### 10.6. Diagnostics: Stabilization

#### 10.6.1. Stabilization of numerical values

To obtain estimates of the stabilization time for each numerical parameter, you may run:

```
§ statreport C1.log > Report
```

Each series of values is counted as having stabilized after the series crosses its upper and then lower 95% confidence bounds twice (if the initial value is below the median) or crosses its lower and then upper confidence bounds twice (if the initial value is above the median). The confidence bounds are those based on its equilibrium distribution as calculated from the last third of the values in the sequence.

#### 10.6.2. Stabilization of tree topologies and tree distances

In addition to examining convergence diagnostics for continuous parameters, it is important to examine convergence diagnostics for the topology as well (<u>Beiko et al 2006</u>). In theory, we recommend the web tool <u>Are We There Yet (AWTY)</u> (Wilgenbush et al, 2004). However, AWTY gives incorrect results if you upload plain NEWICK tree samples -- which is what BAli-Phy outputs. Therefore, if you wish to use AWTY, you must convert the tree samples files to NEXUS before you upload them to AWTY in order to get correct results.

It is also be possible to assess stabilization of tree topologies using tools distributed with bali-phy by using commands like the following. Here, sub-sampling and burnin does not apply to the equilibrium tree files. Also, note that you need to manually construct the equilibrium samples, which we recommend to contain at least 500 trees; you might do this by sub-sampling using the BAli-Phy tool **sub-sample**.

1. To report the average distances within and between two tree samples:

```
% trees-distances --skip=burnin --subsample=factor compare dir-1/C1.trees dir-2/C1.trees
```

2. To compute the distance from each tree in C1.trees to all trees equilibrium.trees, as a time series:

```
% trees-distances --skip=burnin --subsample=factor convergence C1.trees equilibrium.trees
```

3. To assess when the above time series stabilizes:

```
% trees-distances --skip=burnin --subsample=factor converged C1.trees equilibrium.trees
```

The stabilization criterion is the same one described above for numerical values.

Note that the running time is the product of the number of trees in the two files. Therefore, comparing two complete tree samples without sub-sampling will take too long.

# 11. Alignment utilities

Most of these tools will describe their options if given the "--help" argument on the command line.

# 11.1. alignment-info

Show basic information about the alignment:

```
% alignment-info file.fasta
% alignment-info file.fasta file.tree
```

# 11.2. alignment-cat

To select columns from an alignment:

```
% alignment-cat -c1-10,50-100,600- file.fasta > result.fasta
% alignment-cat -c5-250/3 file.fasta > first_codon_position.fasta
% alignment-cat -c6-250/3 file.fasta > second_codon_position.fasta
```

To concatenate two or more alignments:

```
§ alignment-cat file1.fasta file2.fasta > all.fasta
```

# 11.3. alignment-thin

Remove columns without a minimum number of letters:

```
% alignment-thin --min-letters=5 file.fasta > file-thinned.fasta
```

Remove sequences:

```
% alignment-thin --remove=seq1,seq2 file.fasta > file2.fasta
```

Remove short sequences:

```
% alignment-thin --longer-than=250 file.fasta > file-long.fasta
```

Remove sequences while preserving sequence diversity:

```
% alignment-thin --down-to=30 file.fasta > file-30taxa.fasta
% alignment-thin --down-to=30 file.fasta --keep=seq1,seq2 > file-30taxa.fasta
```

Remove sequences that are missing conserved columns:

```
% alignment-thin --remove-crazy=10 file.fasta > file2.fasta
```

# 11.4. alignment-draw

Draw an alignment to HTML, optionally coloring residues by AU.

```
% alignment-draw file.fasta --show-ruler --color-scheme=DNA+contrast > file.html
% alignment-draw file.fasta --show-ruler --AU=file-AU.prob --color-scheme=DNA+contrast+fade+fade+fade+fade > file-AU.html
```

# 11.5. alignment-find

Find the last (or first) FastA alignment in a file.

```
% alignment-find --first < file.fastas > first.fasta
% alignment-find < file.fastas > last.fasta
```

# 11.6. alignment-indices

Turn columns from a template alignment into alignment constraints:

```
% alignment-indices template.fasta > constraints.txt
% alignment-indices -c100-110,200,300- template.fasta > constraints.txt
```

Each line in this file corresponds to one alignment column.

# 11.7. alignment-chop-internal

Remove internal-node ancestral sequences from an alignment. (This probably only works for alignments output by bali-phy.)

```
§ alignment-chop-internal file.fasta > file-chopped.fasta
```

# 12. Tree utilities

#### 12.1. trees-consensus

This program analyzes the tree sample contained in file. It reports the MAP topology, the supported taxa partitions (including partial partitions), and the majority consensus topology.

# 12.2. trees-bootstrap

Usage: trees-bootstrap file1 [file2 ... ] --predicates predicate-file [OPTIONS]

This program analyzes the tree samples contained in file1, file2, etc. It gives the support of each tree sample for each predicate in *predicate-file*, and reports a confidence interval based on the block bootstrap.

Each predicate is the intersection of a set of partitions, and is specified as a list of partitions or (multifurcating) trees, one per line. Predicates are separated by blank lines.

#### 12.3. trees-to-SRQ

Usage: trees-to-SRQ predicate-file [OPTIONS] trees-file

This program analyzes the tree samples contained in trees-file. It uses them to produce an SRQ plot for each predicate in predicate-file. Plots are produced in gnuplot format, with one point per line and with plots separated by a blank line.

If --mode sum is specified, then a "sum" plot is produced instead of an SRQ plot. In this plot, the slope of the curve corresponds to the posterior probability of the event. If the --invert option is used then the slope of the curve correspond to the probability of the inverse event. This is recommended if the probability of the event is near 1.0, because the sum plot does not distinguish variation in probabilities near 1.0 well.

# 13. Compiling BAli-Phy

Compiling BAli-Phy is intended to be a relatively painless process. However, most people will want to use the pre-compiled binaries as described in the standard installation instructions at Section 2, "Installation" instead of compiling BAli-Phy themselves. You might want to compile BAli-Phy yourself if you want to

- run BAli-Phy on a non-Intel CPU (such as ARM64 or Alpha).
- run BAli-Phy on Mac OS X versions older than 10.9
- enable the draw-tree program on Windows or Mac (this requires the Cairo graphics library).
- modify the source code and submit a patch with new functionality.
- change the optimization options used to compile BAli-Phy in the pre-compiled binaries.
- compile with debugging options to find the cause of a bug, and maybe fix it.

Otherwise, the pre-compiled binaries will be fine.

# **13.1. Setup**

In order to compile BAli-Phy, you need

- a C++14 compiler
- meson (version >= 0.45)

We recommend the GNU C++ Compiler (GCC) version 5.0 (or higher) or the Clang compiler version 3.5.0 or higher. The Cairo graphics library is optional, but if it is missing, the drawtree tool that is used to draw consensus trees won't be built. See also Section 2.7, "Install programs used for viewing the results".

#### 13.1.1. Linux

On Debian and Ubuntu, you can type:

```
§ sudo apt-get install g++ git libcairo2-dev pandoc
```

If your version of Debian or Ubuntu is recent enough to contain meson version 0.45 or higher, you can install meson with apt-get:

```
% sudo apt-get install meson

⁴ dpkg -s meson | grep Version

Version: 0.45.1-2
```

Otherwise you can install meson through pip3:

```
sudo apt-get install python3 python3-pip ninja
python3 -m venv meson
source meson/bin/activate
pip3 install meson
```

#### 13.1.2. Mac

On Mac OS X, the simplest way to get a compiler is to install  $\underline{\text{XCode}}$  (version 6 or newer) command line tools, which come with clang.

```
% xcode-select --install
```

To get the other tools, first install **homebrew**, and then type:

```
№ brew install git meson cairo pandoc
```

#### 13.1.3. Windows (native)

The MSYS2 project provides an MINGW64 compiler that can create native windows executables. MSYS2 itself is actually non-native (it is derived from cygwin), and therefore the MSYS2 shell refers to drives as /c/ instead of C:/.

```
pacman --needed --noconfirm -Sy pacman-mirrors
pacman -Sy
pacman -S mingw-w64-x86_64-ninja
pacman -S mingw-w64-x86_64-toolchain
pacman -S mingw-w64-python3-pip
PATH=/c/msys64/mingw64/bin:$PATH # Put the mingw64 executables into your path
pip3 install meson
```

Keep in mind that MSYS2 keeps its (non-native) executables in C:/msys64/usr/bin, while it keeps the (native) MINGW executables in C:/msys64/mingw64/bin. If you want to use the native MINGW executables, you need to make sure that /c/msys64/mingw64/bin/ is in your PATH. If you forget to put the MINGW executables in the path, some of the installed MINGW programs (such as pip3 above) will show up as missing when you try to run them.

### 13.2. Clone, Configure, Compile

First check out the code using git:

```
git clone https://github.com/bredelings/BAli-Phy.git
cd BAli-Phy
git submodule update --init
git submodule u
```

Then run meson to configure the build process:

```
% meson build --prefix=$HOME/Applications/bali-phy-3.3/
```

In the MSYS2 environment, the command is called **meson.py** instead of **meson**:

```
% meson.py build --prefix=$HOME/Applications/bali-phy-3.3/
```

Finally, build and install the software:

```
% ninja -C build
% ninja -C build test
% ninja -C build install
```

The command bali-phy and its associated tools should then be located in ~/Applications/bali-phy-

3.3/bin/. To install to another directory *dir*, specify --prefix=*dir* to **meson**.

# 13.3. Options: compiler and linker flags

You can select the C++ compiler by setting the CXX variable. A useful example of this is to use g++-7 on systems where g++ invokes a compiler that is too old:

```
§ CXX=g++-7 meson build --prefix=$HOME/Applications/bali-phy-3.3
```

You may also set compiler and linker options using the CPPFLAGS, CXXFLAGS, and LDFLAGS variables. For example, you can instruct the compiler to use all the features of your chip, instead of producing generic code that will run anywhere:

```
CXXFLAGS="-mtune=native -march=native" meson --prefix=$HOME/Applications/bali-phy-3.3
```

For example, you can set the CPPFLAGS and LDFLAGS variables to instruct the compiler where to look for libraries, such as cairo:

```
% CPPFLAGS="-I/usr/local/include" LDFLAGS="-L/usr/local/lib" meson build --prefix=$HOME/Applications/bali-phy-3.3
```

Another useful example of this is to produce an OS X executable on that can run on older versions of OS X:

```
    CXXFLAGS="-mmacosx-version-min=10.9" LDFLAGS="-mmacosx-version-min=10.9" meson build --
    prefix=$HOME/Applications/bali-phy-3.3
```

# 14. Frequently Asked Questions (FAQ)

# 14.1. Input files

- 14.1.1. Does BAli-Phy accept the wildcard characters "N" or "X"? How does it treat them?
- 14.1.2. Does BAli-Phy accept "?" characters?
- 14.1.3. Does BAli-Phy accept the characters "R" and "Y", etc.?

# 14.1.1. Does BAli-Phy accept the wildcard characters "N" or "X"? How does it treat them?

Yes, BAli-Phy accepts the wildcard characters "N" (for DNA) and "X" (for proteins). These characters indicate that some letter is present (as opposed to a gap), but that you don't know *which* letter it is.

#### **14.1.2.** Does BAli-Phy accept "?" characters?

No. "?" characters are often used to indicate either letter presence (e.g. "N", "X") or absence (e.g. "-"). BAli-phy will insist that you replace each "?" with either "N"/"X" or "-" to indicate which one you mean.

(Most programs ignore indels and consider only substitutions, and in that case "N" and "-" have the same effect on the likelihood or parsimony score. However, since BAli-Phy takes indels into account, these two alternatives are quite different.)

#### **14.1.3.** Does BAli-Phy accept the characters "R" and "Y", etc.?

Yes. BAli-Phy accepts the characters Y, R, W, S, K, M, B, D, H, and V for DNA, RNA, and Codon alphabets. BAli-Phy also accepts the characters B, Z, and J for amino acids. These characters indicate partial knowledge about a letter. For example, R indicates that a nucleotide is present, and is a puRine (A or G). J indicates that an amino acid is present and is either I or L. (Note that sequences sometimes contain such ambiguity codes because the DNA that was sequenced contains *both* values. This might occur when sequencing a heterozygote or when sequencing pooled DNA from several individuals. However, the model in BAli-Phy (and other phylogeny inference programs) is that only one letter is correct, but we do not know which one it is. This is probably not problematic when dealing with pooled sequences, but should be considered.)

# 14.2. Running bali-phy.

- 14.2.1. Can I fix the alignment and ignore indel information, like MrBayes, BEAST, PhyloBayes and other MCMC programs?
- 14.2.2. Can I fix the tree topology, while allowing the alignment to vary?
- 14.2.3. Can I fix the tree topology and relative branch lengths, while allowing the alignment to vary?
- 14.2.4. Can I fix the tree topology and absolute branch lengths in all data partitions, while allowing the alignment to vary?
- **14.2.1.** Can I fix the alignment and ignore indel information, like MrBayes, BEAST, PhyloBayes and other MCMC programs?

Yes. Add -Inone or --imodel=none on the command line.

**14.2.2.** Can I fix the tree topology, while allowing the alignment to vary?

Yes. Add --disable=topology --tree=treefile on the command line.

**14.2.3.** Can I fix the tree topology and *relative* branch lengths, while allowing the alignment to vary?

Yes. Add --disable=tree --tree=treefile on the command line.

**14.2.4.** Can I fix the tree topology and *absolute* branch lengths *in all data partitions*, while allowing the alignment to vary?

Yes. Add --disable=tree --tree=treefile --scale=1 on the command line.

### 14.3. Run-time error messages

- 14.3.1. <u>I tried to use --smodel lg08+Rates.gamma[6] and I got an error message "bali-phy: No match." What gives?</u>
- **14.3.1.** I tried to use **--smodel lg08+Rates.gamma[6]** and I got an error message "bali-phy: No match." What gives?

You are probably using the C-shell as your command line shell. It is trying to interpret <code>lg08+Rates.gamma[6]</code> as an array before running the command, and it is not succeeding. Therefore, it doesn't even run <code>bali-phy</code>.

To avoid this, put quotes around the substitution model, like this: --smodel "lg08+Rates.gamma[6]". This will keep the C-shell from interfering with your command.

### 14.4. Stopping bali-phy.

- 14.4.1. Why is bali-phy still running? How long will it take?
- 14.4.2. How do I stop a bali-phy run on my personal computer?
- 14.4.3. How do I stop a bali-phy run on a computing cluster?
- 14.4.4. So, how can I know when to stop it?
- 14.4.5. How can I tell when the chain has converged?
- 14.4.6. How can I check how many iterations the chain has finished?
- **14.4.1.** Why is **bali-phy** still running? How long will it take?

It runs until you stop it. Stop it when its done.

**14.4.2.** How do I stop a **bali-phy** run on my personal computer?

Simply kill the process -- there is no special command to stop **bali-phy**. If you are running it on your personal workstation, then you can use the command **kill**. To do that, you need to find the PID (process ID) of the running program. You can find this by examining the beginning of the file C1.out. For example:

```
% less 5d-1/C1.out
command: bali-phy 5d.fasta -I none --iter=10 --seed=0
start time: Wed Jul  4 17:13:25 2018

VERSION: 3.3-b1 [HEAD -> logging, origin/logging commit 96a43e550] (Jul 04 2018 16:25:09)
```

BUILD: Jul 4 2018 17:12:29

ARCH: linux x86\_64

COMPILER: gcc 8.1.0 x86\_64 directory: /home/bredelings/Work

subdirectory: 5d-675
hostname: telomere

PID: 18838

. 10.

Here the PID is 18838. Therefore you can type:

% kill 18838

On some operating systems you can also type:

% killall bali-phy

However, be aware that this will terminate *all* of your **bali-phy** runs on that computer.

**14.4.3.** How do I stop a **bali-phy** run on a computing cluster?

Simply terminate the submitted job. The specific command to terminate a job will depend on the queue manager that is installed on your cluster. Examine the documentation for your cluster, or ask your cluster support staff how to delete running jobs on your cluster.

As an example, if the SGE software is used to submit jobs, then the command **qstat** should list your jobs and their job ID numbers (which is different than the process ID number). You can then use the command **qdel** to delete jobs by ID number. The SGE documentation describes how to use these commands.

**14.4.4.** So, how can I know when to stop it?

You can stop when it has both converged and also run for long enough to give you >1000 effectively independent samples.

**14.4.5.** How can I tell when the chain has converged?

See section Section 10, "Convergence and Mixing: Is it done vet?".

**14.4.6.** How can I check how many iterations the chain has finished?

Run wc -l C1.log inside the output directory, and subtract 2.

# 14.5. Running bp-analyze.

- 14.5.1. Why does bp-analyze say "Program 'draw-tree' not found. Tree pictures will not be generated"?
- 14.5.2. Why does bp-analyze say "Program 'gnuplot' not found. Trace plots will not be generated"?
- 14.5.3. Why does bp-analyze say "Program 'R' not found. Some mixing graphs will not be generated"?
- 14.5.4. Why is bp-analyze stopping early, or failing to generate some files?

**14.5.1.** Why does **bp-analyze** say "Program 'draw-tree' not found. Tree pictures will not be generated"?

The program **draw-tree** was not distributed on this platform (Windows, Mac). This is not a fatal error message, it just means that a pretty picture of the tree will not be generated automatically. You can still view the tree with FigTree, for example.

**14.5.2.** Why does **bp-analyze** say "Program 'qnuplot' not found. Trace plots will not be generated"?

This is because you have not installed *gnuplot*. This is not a fatal error message, it just means that pictures of partition support, and SRQ plots will not be generated automatically.

**14.5.3.** Why does **bp-analyze** say "Program 'R' not found. Some mixing graphs will not be generated"?

This is because you have not installed R. This is not a fatal error message, it just means that a plot showing differences in clade probabilities between runs will not be generated.

**14.5.4.** Why is **bp-analyze** stopping early, or failing to generate some files?

Look in the file Results/bp-analyze.log. This should contain the actual commands that were run, along with error message from these commands. These error message should give you a hint as to what the problem might be.

# 14.6. Interpreting the results.

- 14.6.1. How do I compute the clade support?
- 14.6.2. How do I compute the split/bi-partition support?
- **14.6.1.** How do I compute the clade support?

Actually, BAli-Phy uses unrooted trees, so it only estimates bi-partition support. A bi-partition is a division of taxa into two groups, but it does not specify which group contains the root.

**14.6.2.** How do I compute the split/bi-partition support?

After you analyze the output (<u>Section 5.4, "Summarizing the output - scripted"</u>), the partition support is indicated in Results/consensus and in Results/c50.PP.tree.

#### 14.7. How do I...

- 14.7.1. How do I concatenate alignments?
- 14.7.2. How do I select columns from an alignment?
- 14.7.3. How do I create an alignment-constraint file from an alignment?
- **14.7.1.** How do I concatenate alignments?

```
% alignment-cat filename1.fasta filename2.fasta > result.fasta
```

The alignments must have the same sequence names, but the names need not be in the same order.

**14.7.2.** How do I select columns from an alignment?

```
% alignment-cat -c1-10,50-100,600- filename.fasta > result.fasta
```

The resulting alignment will contain the selected columns in the order you specified.

**14.7.3.** How do I create an alignment-constraint file from an alignment?

To constrain the alignment to match some alignment file filename. fasta in columns 100, 200-250, and 300, run:

🙎 alignment-indices -c100,200-250,300 filename.fasta > filename.constraint