# **R** documentation

of '/Users/jeastman/Science/research/projects/software' etc.

# May 6, 2011

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# **Description**

**auteur** (Accommodating Uncertainty in Trait Evolution Using **R**) performs reversible-jump Markov chain Monte Carlo sampling to identify phylogenetically localized shifts in the process of continuous trait evolution.

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#### **Details**

Package: auteur
Type: Package
License: GPL
LazyLoad: yes

### Author(s)

Luke J Harmon, Andrew L Hipp, Michael E Alfaro, Paul Joyce, and Jonathan M Eastman < jonathan.eastman@gmail.com

auteur-internal

internal auteur functions

### **Description**

auteur-internal functions are either not typically called by the user or are currently undocumented

### **Details**

This is an internal auteur function, not intended to be called directly by the user.

### Note

The likelihood expression used in bm.lik.fn owes to Felsenstein (1973), and see also O'meara et al. (2006). That used within ou.lik.fn owes to Butler and King (2004).

# References

- BUTLER MA and AA KING. 2004. Phylogenetic comparative analysis: A modeling approach for adaptive evolution. American Naturalist 164:683-695.
- FELSENSTEIN J. 1973. Maximum likelihood estimation of evolutionary trees from continuous characters. American Journal of Human Genetics 25:471-492.
- O'MEARA BC, C ANE, MJ SANDERSON, and PC WAINWRIGHT. 2006. Testing for different rates of continuous trait evolution using likelihood. Evolution 60:922-933.

calibrate.proposalwidth 3

```
calibrate.proposalwidth

initialize proposal width
```

### Description

Generates a reasonable proposal width to initiate sampling for Markov sampling

### Usage

```
calibrate.proposalwidth(phy, dat, nsteps = 100, model, widths = NULL)
```

### **Arguments**

phy	a phylogenetic tree of class 'phylo'
dat	a named vector of continuous trait values, associated with each species in phy
nsteps	number of proposal steps over which to assess proposal widths
model	currently either model="BM" or model="OU" for Brownian motion or an Ornstein-Uhlenbeck process; see rjmcmc.bm and rjmcmc.ou for further information on fitting these models
widths	if unspecified, a series of proposal widths from 1/8 to 8 will be considered

#### **Details**

This is primarily an internal function, although may be useful for constraining subsequent runs after an adequate proposal width has been approximated by this function. This function is called internally by rjmcmc, which causes additional sampling (one-tenth total Markov chain length) to be prepended to a run. The sole purpose of this initial sampling period is to optimize the proposal width (prop.width) to ensure that the Markov chain achieves convergence. Estimates from this calibration are not stored and do not become available to the user.

### Author(s)

JM Eastman

```
n=4
phy=rescaleTree(phy=rcoal(n=n),totalDepth=100)
dat=rTraitCont(phy=phy, model="BM", sigma=sqrt(0.1))
r=paste(sample(letters,9,replace=TRUE),collapse="")

## with calibrated proposal width
rjmcmc.bm(phy=phy, dat=dat, ngen=5000, sample.freq=10, prob.mergesplit=0.05, prop.width=N
## with enforced (and large) proposal width
rjmcmc.bm(phy=phy, dat=dat, ngen=5000, sample.freq=10, prob.mergesplit=0.05, prop.width=N
## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
# unlink(dir(pattern=paste(r)),recursive=TRUE)
```

4 compare.rates

compare.rates

statistical comparison of posterior rate estimates

#### **Description**

Conducts randomization test to determine if posterior rate estimates for two groups of phylogenetic branches differ

### Usage

```
compare.rates(branches = list(A = c(NULL, NULL), B = c(NULL, NULL)), phy, poster
```

### **Arguments**

branches a list of numeric labels for branches in the phylogeny, consistent with the node

labels found in phy\$edge (see read.tree)

phy a phylogenetic tree of class 'phylo'

posterior.values

a dataframe of posterior rate estimates, where rows are sampled generations in

the Markov chain and columns distinguish branches in the phylogeny

... additional arguments to be passed to randomization.test

#### **Details**

For each generation in the Markov sample, a scaled relative rate is computed for each collection of branches (so defined by the supplied list of branches). Scaling occurs by weighting posterior rate estimates by the length of the each branch in the group. In so doing, longer branches contribute greater weight to the scaled measure of evolutionary rate in each group. Values need not be rates, but elements must be capable of being associated with each branch in the phylogeny.

#### Value

A list of scaled relative values for each branch and the result of statistical comparison:

scl. A scaled posterior rate estimates from each Markov sample for group 'A' scl. B scaled posterior rate estimates from each Markov sample for group 'B'

r.test probability value of randomization comparison between groups for phylogenetically-

scaled values, as default under a two-tailed test

### Author(s)

JM Eastman

```
## generate tree
n=24
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
## simulate a rate shift
# find an internal edge
```

intercalate.samples 5

```
anc=get.desc.of.node(Ntip(phy)+1,phy)
 branches=phy$edge[,2]
 branches=branches[branches>Ntip(phy) & branches!=anc]
 branch=branches[sample(1:length(branches),1)]
 desc=get.descendants.of.node(branch,phy)
 rphy=phy
 rphy\$edge.length[match(desc,phy\$edge[,2])]=phy\$edge.length[match(desc,phy\$edge[,2])]*64
 e=numeric(nrow(phy$edge))
 e[match(c(branch, desc), phy$edge[,2])]=1
 cols=rev(diverge_hcl(n=2))
 dev.new()
 plot (phy, edge.col=ifelse (e==1, cols[1], cols[2]), edge.width=2)
 mtext("expected pattern of rates")
 ## simulate data on the 'rate-shifted' tree
 dat=rTraitCont(phy=rphy, model="BM", sigma=sqrt(0.1))
 ## run reversible-jump MCMC for a short chain
 r=paste(sample(letters, 9, replace=TRUE), collapse="")
 rjmcmc.bm(phy=phy, dat=dat, ngen=10000, sample.freq=10, prob.mergesplit=0.1, fileBase=r)
  # collect posterior rates
 load(paste(paste("BM",r,"parameters",sep="."),paste(r,"posteriorsamples.rda",sep="."),sep
 rates=posteriorsamples$rates
 burnin=round(0.5*nrow(rates))
 rates=rates[-c(1:burnin),]
 # compare the shifted branches to the background
 shift=desc
 branches=1:nrow(phy$edge)
 background=branches[is.na(match(branches, shift))]
 # exclude stem branch from background
 background=background[-(which(background==(n+1)))]
 comp=compare.rates(branches=list(A=shift, B=background), phy=phy, posterior.values=rates)
 # plot posterior distributions of scaled rates by group
 prates=data.frame(comp$scl.A, comp$scl.B)
 names (prates) = c ("shift", "background")
 trace.plot(obj=data.frame(comp$scl.A, comp$scl.B), col=c("red","black"), alpha=0.4, log='
 ## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
 # unlink(dir(pattern=paste(r)), recursive=TRUE)
intercalate.samples
```

pool data

#### **Description**

Combines datasets respecting indices of each

### Usage

```
intercalate.samples(list.obj)
```

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### **Arguments**

list.obj a list of vectors or dataframes

#### Value

A dataframe of pooled values, whose elements are ordered as given by the order of objects in list.obj

### Author(s)

JM Eastman

# **Examples**

```
# with character vectors
a=letters[1:10]
A=toupper(letters[1:10])
intercalate.samples(list(a,A))

# with multi-column dataframes
list.obj=lapply(1:5, function(x) {y=data.frame(matrix(data=runif(9)+x, nrow=3)); names(y)
intercalate.samples(list.obj)
```

mcmc.levy

Bayesian sampling of shifts in trait-evolutionary rates: jump-diffusion

# Description

Implements Markov chain Monte Carlo sampling to identify shifts in the process of continuous trait evolution across phylogenetic trees

# Usage

```
mcmc.levy(phy, dat, SE=0, ngen = 1000, sample.freq = 100, prob.lambda = 0.75, pr
```

# Arguments

phy	a phylogenetic tree of class 'phylo'
dat	a named vector of continuous trait values, associated with each species in phy; see ${\tt name.check}$
SE	a named vector of standard errors for each trait value; applied to all trait values if given a single value
ngen	number of sampling generations
sample.freq	frequency with which Markov samples are retained (e.g., sample.freq=10 retains every tenth sample in the chain)
prob.lambda	proportion of proposals that split or merge rates, thereby altering complexity of the evolutionary model
prob.sigsqB	proportion of proposals in which the root state is updated
prob.sigsqJ	a constraint of model complexity (e.g., constrainK=2 restricts sampling to models with two independent rates)

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prop.width if NULL, the proposal width is calibrated; otherwise, proposal width is constrained to the supplied value the shape parameter for the Poisson prior-distribution on number of distinct rates lambdaN a logical switch that determines whether any output is printed to the console summary after the analysis has finished a string used to uniquely identify the base directory to which Markov samples fileBase are written

#### **Details**

In the two primary objects that store posterior estimates of shifts and rates (see Value), branches are labeled in accordance with the numeric identifiers found in phy\$edge, which represents a table of ancestor-descendant relationship (see read.tree. In the Examples below do not expect convergence with such short chains!

#### Value

If summary=TRUE the global rate of acceptance and calibrated proposal width is returned as a list. After a run has completed, the rates of acceptance for various proposal mechanisms are printed, along with the (calibrated) proposal width used for chain sampling.

Posterior results are written to several files within a base directory, the contents of which are as follows:

logfile

a logfile including the following for each Markov sample; the generations at which samples were retained; the generalized model of trait evolution used for inference (e.g., Brownian motion or 'BM"); the mean treewide rate in the sampled generation; the number of independent rates; the root state; and the likelihood of the model at each sample. Do not be alarmed if it seems to take some time before values begin to appear in the logfile: samples are not saved until after the calibration period has terminated. Inspection of chain mixing can be facilitated by the R-package coda or by the Java application, Tracer (http://tree.bio.ed.ac.uk/software/tracer/).

errors

a logfile to which errors are recorded, if any are generated in the Markov chain posteriorsamples

> a compressed .rda file, storing estimates from the Markov chain for relevant parameters; contents of this file can be loaded with load ("posteriorsamples.rda"). This list object, whose referent is also posterior samples when in R-memory, includes two dataframes: rates comprises the relative-rate estimates for each branch in the phylogeny; rate. shifts stores the branches that were chosen for rate shifts in each retained sample of the Markov chain (1 signifies a shift; 0 implies a branch that was not sampled for a rate shift). Column names of both components of posteriorsamples are from the numeric vector of branch labels (see Details). For further information on .Rd and .rda files, see save and load as well as the **Examples** below.

#### Author(s)

JM Eastman

8 phenogram

### **Examples**

phenogram

trait evolution along phylogenies

### **Description**

simulating incremental phenotypic evolution by Brownian motion or Levy process along a phylogenetic tree

### Usage

```
phenogram(phy, model = c("levy", "bm"), alpha = 0, rate = 0.01, lambda = 0.5, si
```

### **Arguments**

phy	a phylogenetic tree of class phylo
model	a string (either "levy" or "bm") determining which process to use in simulating trait evolution
alpha	the ancestral phenotypic value
rate	a numeric value determining the rate of evolution; rates are not comparable between Levy and Brownian motion
lambda	mean of the Poisson distribution from which the number of trait-evolutionary saltations are drawn; applies only where model="levy"
sigma	standard deviation of the distribution from which saltation sizes are drawn; applies only where model="levy"
increments	the number of branch segments used to discretize the time-continuous process (for a root-to-tip path); if increments=NULL, only the phenotypic values at nodes are plotted
plot	a logical value determining whether a plot is generated
node.cex	plot symbol size for the phenotypic values at nodes
	additional arguments to be passed to plot

#### Value

This function generates a phenogram (if plot=TRUE) of evolutionary change in phenotype along a phylogeny and returns a table of ancestral values (phenotype) for each node in the topology (descendant). Using the ape-package format for edge identification, each ancestor and descendant is given an integer value. The split time of each node is given in this last column of the returned table.

# Author(s)

LJ Revell, LJ Harmon, and JM Eastman

pool.rjmcmcsamples 9

#### **Examples**

```
## BROWNIAN MOTION ##
phenogram(rcoal(20)->phy, model="bm", rate=0.005, increments=100, lwd=2)
phenogram(phy, model="bm", rate=0.0075, increments=100, lwd=2)
phenogram(phy, model="bm", rate=0.01, increments=100, lwd=2)
phenogram(phy, model="bm", rate=0.01, increments=NULL, lwd=2)

## LEVY MOTION ##
phenogram(phy, model="levy", rate=0.1, lambda=0.25, sigma=0.75, increments=100, lwd=2)
phenogram(phy, model="levy", rate=0.1, lambda=0.5, sigma=0.75, increments=100, lwd=2)
phenogram(phy, model="levy", rate=0.1, lambda=2, sigma=0.75, increments=100, lwd=2)
phenogram(phy, model="levy", rate=0.1, lambda=2, sigma=0.75, increments=100, lwd=2)
phenogram(phy, model="levy", rate=0.1, lambda=2, sigma=0.75, increments=NULL, lwd=2)
```

pool.rjmcmcsamples combining posterior samples from Bayesian analysis

### **Description**

Generates a pooled sample of posterior estimates from any number of independent runs

#### **Usage**

```
pool.rjmcmcsamples(base.dirs, lab = "")
```

#### **Arguments**

a vector of directory names, in which the results from rjmcmc are to be found an optional string used to name the directory to which pooled results are written

```
n=24
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
dat=rTraitCont(phy=phy, model="BM", sigma=sqrt(0.1))

## run three short reversible-jump Markov chains
r=paste(sample(letters,9,replace=TRUE),collapse="")
lapply(1:3, function(x) rjmcmc.bm(phy=phy, dat=dat, ngen=500, sample.freq=10, prob.merges

# collect directories
dirs=sapply(1:3, function(x) dir("./",pattern=paste("BM",r,x,sep=".")))
pool.rjmcmcsamples(base.dirs=dirs, lab=r)

# plot density of sampled mean rates across tree
rates=read.table(file=paste(dir(pattern=paste(r,"combined.rjmcmc",sep=".")),paste(r,"rjmctrace.plot(rates,col="maroon",alpha=0.4,xlab="rates",log="x",legend.control=list(plot=FAI

## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
# unlink(dir(pattern=paste(r)),recursive=TRUE)
```

10 randomization.test

randomization.test statistical comparison of sets of values by randomization

#### **Description**

Compares means by bootstrap resampling of differences between empirical distributions

#### Usage

```
randomization.test(obs = obs, exp = exp, mu = 0, iter = 10000, two.tailed = FALS
```

#### **Arguments**

obs a vector of numeric values
exp a vector of numeric values
mu the true difference in means

iter number of randomization comparisons to perform

two.tailed as default, the test is performed under a one-tailed assumption; if two.tailed=FALSE,

probability values associated with either tail of the comparison distribution are

returned, otherwise, a two-tailed result is returned

#### **Details**

If a single value is supplied for obs, this test equates to finding the quantile in exp in which obs would be found (under a one-tailed test); see **Examples** and also ecdf

#### Value

A list, whose contents are determined by the above argument:

unnamed value

if two.tailed=TRUE, this is the two-tailed p-value

diffs the full resampling distribution of differences between obs and exp, given mu greater if two.tailed=FALSE, this is the p-value associated with the righthand tail lesser if two.tailed=FALSE, this is the p-value associated with the lefthand tail

### Author(s)

JM Eastman

```
# a comparison between two distributions
a=rnorm(n=1000, mean=1, sd=0.5)
b=rnorm(n=1000, mean=0, sd=1)
randomization.test(obs=a, exp=b, two.tailed=FALSE)
# a comparison of a single value to a normal distribution
a=3
b=rnorm(n=1000, mean=0, sd=1)
```

rjmcmc.bm

```
randomization.test(obs=a, exp=b, two.tailed=FALSE)

# compare above result with ecdf(), in which we compute an empirical
f=ecdf(b)
print(1-f(a)) # analogous to a one-tailed test as above
```

rjmcmc.bm

Bayesian sampling of shifts in trait-evolutionary rates: Brownian motion

# Description

Implements reversible-jump Markov chain Monte Carlo sampling to identify shifts in the process of continuous trait evolution across phylogenetic trees

### Usage

```
rjmcmc.bm(phy, dat, SE=0, ngen = 1000, sample.freq = 100, prob.mergesplit = 0.05
```

### **Arguments**

phy	a phylogenetic tree of class 'phylo'	
dat	a named vector of continuous trait values, associated with each species in phy; see ${\tt name.check}$	
SE	a named vector of standard errors for each trait value; applied to all trait values if given a single value	
ngen	number of sampling generations	
sample.freq	frequency with which Markov samples are retained (e.g., sample.freq=10 retains every tenth sample in the chain)	
prob.mergesp	lit	
	proportion of proposals that split or merge rates, thereby altering complexity of the evolutionary model	
prob.root	proportion of proposals in which the root state is updated	
lambdaK	the shape parameter for the Poisson prior-distribution on number of distinct rates	
constrainK	a constraint of model complexity (e.g., $constrainK=2$ restricts sampling to models with two independent rates)	
prop.width	if $\mathtt{NULL},$ the proposal width is calibrated; otherwise, proposal width is constrained to the supplied value	
simplestart	if FALSE, a random model complexity is chosen; if ${\tt TRUE},$ Markov sampling begins under a global-rate model	
internal.only		
	dictates whether any branch in the tree can be chosen for a rate shift or tips only (internal.only=FALSE)	
summary	a logical switch that determines whether any output is printed to the console after the analysis has finished	
fileBase	a string used to uniquely identify the base directory to which Markov samples are written	

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#### **Details**

In the two primary objects that store posterior estimates of shifts and rates (see Value), branches are labeled in accordance with the numeric identifiers found in phy\$edge, which represents a table of ancestor-descendant relationship (see read.tree. In the Examples below do not expect convergence with such short chains!

#### Value

If summary=TRUE the global rate of acceptance and calibrated proposal width is returned as a list. After a run has completed, the rates of acceptance for various proposal mechanisms are printed, along with the (calibrated) proposal width used for chain sampling.

Posterior results are written to several files within a base directory, the contents of which are as follows:

logfile

a logfile including the following for each Markov sample; the generations at which samples were retained; the generalized model of trait evolution used for inference (e.g., Brownian motion or 'BM"); the mean treewide rate in the sampled generation; the number of independent rates; the root state; and the likelihood of the model at each sample. Do not be alarmed if it seems to take some time before values begin to appear in the logfile: samples are not saved until after the calibration period has terminated. Inspection of chain mixing can be facilitated by the R-package coda or by the Java application, Tracer (http://tree.bio.ed.ac.uk/software/tracer/).

errors

a logfile to which errors are recorded, if any are generated in the Markov chain posteriorsamples

> a compressed .rda file, storing estimates from the Markov chain for relevant parameters; contents of this file can be loaded with load ("posteriorsamples.rda"). This list object, whose referent is also posterior samples when in R-memory, includes two dataframes: rates comprises the relative-rate estimates for each branch in the phylogeny; rate.shifts stores the branches that were chosen for rate shifts in each retained sample of the Markov chain (1 signifies a shift; 0 implies a branch that was not sampled for a rate shift). Column names of both components of posteriorsamples are from the numeric vector of branch labels (see **Details**). For further information on .Rd and .rda files, see save and load as well as the **Examples** below.

#### Author(s)

LJ Harmon, AL Hipp, and JM Eastman

```
#############
## generate tree
n = 24
while(1) {
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
phy$tip.label=paste("sp",1:n,sep="")
rphy=reorder(phy, "pruningwise")
# find an internal edge
anc=get.desc.of.node(Ntip(phy)+1,phy)
branches=phy$edge[,2]
```

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branches=branches[branches>Ntip(phy) & branches!=anc]

```
branch=branches[sample(1:length(branches),1)]
desc=get.descendants.of.node(branch,phy)
if(length(desc)>=4) break()
rphy=phy
rphy$edge.length[match(desc,phy$edge[,2])]=phy$edge.length[match(desc,phy$edge[,2])]*64
e=numeric(nrow(phy$edge))
e[match(c(branch, desc), phy$edge[,2])]=1
cols=c("red", "gray")
dev.new()
plot (phy, edge.col=ifelse(e==1, cols[1], cols[2]), edge.width=2)
mtext("expected pattern of rates")
###########
## simulate data on the 'rate-shifted' tree
dat=rTraitCont(phy=rphy, model="BM", sigma=sqrt(0.1))
## run two short reversible-jump Markov chains
r=paste(sample(letters, 9, replace=TRUE), collapse="")
lapply(1:2, function(x) rjmcmc.bm(phy=phy, dat=dat, ngen=10000, sample.freq=10, prob.merc
 # collect directories
dirs=dir("./",pattern=paste("BM",r,sep="."))
pool.rjmcmcsamples(base.dirs=dirs, lab=r)
## view contents of .rda
load(paste(paste(r, "combined.rjmcmc", sep="."), paste(r, "posteriorsamples.rda", sep="."), sep
print (head (posteriorsamples$rates))
print (head (posteriorsamples$rate.shifts))
## plot Markov sampled rates
dev.new()
shifts.plot(phy=phy, base=paste(r,"combined.rjmcmc",sep="."), burnin=0.5, legend=TRUE, po
## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
 # unlink(dir(pattern=paste(r)), recursive=TRUE)
```

rjmcmc.data

example datasets for auteur

### **Description**

Provides example body-size data and a corresponding phylogeny

### Usage

```
data(primates); data(chelonia); data(urodela)
```

#### **Details**

Each object is a list of two items, a phy object and a dat object. The phy object is a phylogenetic tree of class 'phylo' (see read.tree). The dat object is a named vector of body sizes for each group.

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#### References

Data are from the following sources:

#### PRIMATES

• REDDING DW, C DEWOLFF, and AO MOOERS. 2010. Evolutionary distinctiveness, threat status and ecological oddity in primates. Conservation Biology 24:1052-1058.

• VOS RA and AO MOOERS. 2006. A new dated supertree of the Primates. Chapter 5. In: VOS RA (Ed.) Inferring large phylogenies: the big tree problem. [Ph.D. thesis]. Burnaby BC, Canada: Simon Fraser University.

#### TURTLES

• JAFFE, G SLATER, and M ALFARO. 2011. Ecological habitat and body size evolution in turtles. Biology Letters: in press.

#### SALAMANDERS

- ADAMS DC, CM BERNS, KH KOZAK, and JJ WIENS. 2009. Are rates of species diversification correlated with rates of morphological evolution? Proceedings of the Royal Society of London B 276:2729-2738.
- BONETT RM, PT CHIPPINDALE, PE MOLER, RW VAN DEVENDER, and DB WAKE. 2009. Evolution of gigantism in amphiumid salamanders. PLoSONE 4(5):e5615.
- EASTMAN JM and A STORFER. in review, Nature Communications. Hybridism swallows salamander diversity.
- KOZAK KH, RW MENDYK, and JJ WIENS. 2009. Can Parallel Diversification Occur in Sympatry? Repeated Patterns of Body-Size Evolution in Coexisting Clades of North American Salamanders. Evolution 63:1769-1784.
- WEISROCK DW, TJ PAPENFUSS, JR MACEY, SN LITVINCHUK, R POLYMENI, IH UGURTAS, E ZHAO, H JOWKAR, and A LARSON. 2006. A molecular assessment of phylogenetic relationships and lineage accumulation rates within the family Salamandridae (Amphibia, Caudata). Molecular Phylogenetics and Evolution 41:368-383.
- WIENS JJ and JT HOVERMAN. 2008. Digit reduction, body size, and paedomorphosis in salamanders. Evolution and Development 10:449-463.
- ZHANG P, Y-Q CHEN, H ZHOU, X-L WANG, TJ PAPENFUSS, DB WAKE and L-H QU. 2006. Phylogeny, evolution, and biogeography of Asiatic salamanders (Hynobiidae). Proceedings of the National Academy of Sciences USA 103:7360-7365.
- ZHANG P and DB WAKE. 2009. Higher-level salamander relationships and divergence dates inferred from complete mitochondrial genomes. Molecular Phylogenetics and Evolution. 53:492-508.

rjmcmc.ou Bayesian sampling of shifts in trait optima: Ornstein-Uhlenbeck process

# **Description**

Implements reversible-jump Markov chain Monte Carlo sampling to identify shifts in the process of continuous trait evolution across phylogenetic trees

rjmcmc.ou 15

### Usage

```
rjmcmc.ou(phy, dat, SE = 0, ngen = 1000, sample.freq = 100, prob.mergesplit = 0.
```

### **Arguments**

phy	a phylogenetic tree of class 'phylo'
dat	a named vector of continuous trait values, associated with each species in phy;
	see name.check
SE	a named vector of standard errors for each trait value; applied to all trait values
	if given a single value
ngen	number of sampling generations
sample.freq	frequency with which Markov samples are retained (e.g., sample.freq=10 retains every tenth sample in the chain)
prob.mergesp	
	proportion of proposals that split or merge optima, thereby altering complexity of the evolutionary model
prob.theta	proportion of proposals in which selective regimes for branches are updated
prob.alpha	proportion of proposals in which the evolutionary constraint parameter is updated
upper.alpha	an upper bound on the evolutionary constraint parameter
lambdaK	the shape parameter for the Poisson prior-distribution on number of distinct optima
constrainK	a constraint of model complexity (e.g., constrainK=2 restricts sampling to models with two independent optima)
prop.width	if $\mathtt{NULL}$ , the proposal width is calibrated; otherwise, proposal width is constrained to the supplied value
simplestart	if FALSE, a random model complexity is chosen; if TRUE, Markov sampling begins under a global-optimum model
internal.only	
	dictates whether any branch in the tree can be chosen for a regime shift or tips only (internal.only=FALSE)
summary	a logical switch that determines whether any output is printed to the console after the analysis has finished
fileBase	a string used to uniquely identify the base directory to which Markov samples are written

### **Details**

In the two primary objects that store posterior estimates of shifts and optima (see **Value**), branches are labeled in accordance with the numeric identifiers found in phy\$edge, which represents a table of ancestor-descendant relationship (see read.tree. In the **Examples** below do **not** expect convergence with such short chains!

#### Value

If summary=TRUE the global rate of acceptance and calibrated proposal width is returned as a list. After a run has completed, the rates of acceptance for various proposal mechanisms are printed, along with the (calibrated) proposal width used for chain sampling.

Posterior results are written to several files within a base directory, the contents of which are as follows:

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logfile

a logfile including the following for each Markov sample; the generations at which samples were retained; the generalized model of trait evolution used for inference (e.g., Brownian motion or 'BM"); the mean treewide optimum trait value in the sampled generation; the number of independent optima; and the likelihood of the model at each sample. Do not be alarmed if it seems to take some time before values begin to appear in the logfile: samples are not saved until after the calibration period has terminated

errors

a logfile to which errors are recorded, if any are generated in the Markov chain posteriorsamples

> a compressed .rda file, storing estimates from the Markov chain for relevant parameters; contents of this file can be loaded with load ("posteriorsamples.rda"). This list object, whose referent is also posterior samples when in R-memory, includes two dataframes: optima comprises the inferred selective regime (trait optimum) for each branch in the phylogeny; shifts stores the branches that were chosen for shifts in selective regime for each retained sample of the Markov chain (1 signifies a shift; 0 implies a branch that was not sampled for a regime shift). Column names of both components of posteriorsamples are from the numeric vector of branch labels (see Details). For further information on .Rd and .rda files, see save and load as well as the **Examples** below.

#### Note

This function is largely based on code from ouch-package

#### Author(s)

AA King and JM Eastman

```
#############
## generate tree
n = 24
while(1) {
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
phy$tip.label=paste("sp",1:n,sep="")
rphy=reorder(phy, "pruningwise")
# find an internal edge
anc=get.desc.of.node(Ntip(phy)+1,phy)
branches=phy$edge[,2]
branches=branches[branches>Ntip(phy) & branches!=anc]
branch=branches[sample(1:length(branches),1)]
desc=get.descendants.of.node(branch,phy)
if(length(desc)>=4) break()
rphy=phy
## build array of optima
t=numeric(nrow(phy$edge))
t[match(c(branch,desc),phy$edge[,2])]=8
cols=c("red", "gray")
dev.new()
plot(phy,edge.col=ifelse(t==8,cols[1],cols[2]), edge.width=2)
mtext("expected pattern of optima")
```

shifts.plot 17

shifts.plot

plotting of Bayesian posterior samples

#### **Description**

Plots a phylogeny with topological indication of posterior support for evolutionary shifts

#### Usage

```
shifts.plot(phy, base.dir, burnin = 0, level = 0.01, internal.only = FALSE, pair
```

#### **Arguments**

phy a phylogenetic tree of class 'phylo'

base.dir a directory name, in which the results from rjMCMC are to be found burnin proportion of the chain to be treated as burnin (e.g., from 0 to 1)

level a level of posterior support (from 0 to 1) for a branch-associated evolutionary

shifts, above which results will be compiled

internal.only

dictates whether tips are excluded from processing of evolutionary shifts (internal.only=TRUE)

paint.branches

a logical switch governing whether branches in the phylogeny are to be shaded

according to their model-averaged estimates

legend a logical switch that determines whether keys for the generated symbols and

colors are plotted

pdf a logical switch that determines whether a .pdf of the plot is written to the 're-

sults' subdirectory of the stored Bayesian output

verbose a logical switch that determines whether additional diagnositics are generated

 $for all \ branches \ receiving \ posterior \ support \ beyond \ the \ defined \ \verb|level|; if \ \verb|verbose=TRUE|,$ 

results will be stored in a 'results' subdirectory

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```
a string used to uniquely identify the .pdf if created additional arguments to be passed to plot.phylo
```

#### Value

Returns, as a side-effect, a plotted phylogenetic tree with colorized summary of posterior estimates. Colors that strongly differ from gray are lower (blue) or higher (red) than the median posterior estimate across the tree. Bubbles at branches are proportional to posterior support for a shift occurring at the indicated branch, conditioned on the underlying evolutionary process involving at least one shift

# Author(s)

JM Eastman

```
# generate tree
n = 2.4
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
#############
## simulate a rate shift
 # find an internal edge
anc=get.desc.of.node(Ntip(phy)+1,phy)
branches=phy$edge[,2]
branches=branches[branches>Ntip(phy) & branches!=anc]
branch=branches[sample(1:length(branches),1)]
desc=get.descendants.of.node(branch,phy)
rphy=phy
rphy$edge.length[match(desc,phy$edge[,2])]=phy$edge.length[match(desc,phy$edge[,2])]*64
e=numeric(nrow(phy$edge))
e[match(c(branch, desc), phy$edge[,2])]=1
cols=rev(diverge_hcl(n=2))
dev.new()
plot(phy,edge.col=ifelse(e==1,cols[1],cols[2]), edge.width=2)
mtext ("expected pattern of rates")
## simulate data on the 'rate-shifted' tree
dat=rTraitCont(phy=rphy, model="BM", sigma=sqrt(0.1))
## run two short reversible-jump Markov chains
r=paste(sample(letters, 9, replace=TRUE), collapse="")
lapply(1:2, function(x) rjmcmc.bm(phy=phy, dat=dat, ngen=10000, sample.freq=10, prob.merc
 # collect directories
dirs=sapply(1:2, function(x) dir("./",pattern=paste("BM",r,x,sep=".")))
pool.rjmcmcsamples(base.dirs=dirs, lab=r)
## plot Markov sampled rates
dev.new()
shifts.plot(phy=phy, base=paste(r,"combined.rjMCMC",sep="."), burnin=0.5, legend=TRUE, po
## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
 # unlink(dir(pattern=paste(r)), recursive=TRUE)
```

trace.plot 19

trace.plot	plotting of Bayesian posterior samples	
------------	--	--

### **Description**

Compares posterior densities of Bayesian estimates

### Usage

```
trace.plot(obj, col, alpha, lwd = 1, hpd = 0.95, bars = TRUE, legend.control = 1
```

### **Arguments**

obj	a vector or dataframe (where each column is separately plotted); names of columns are retrieved if a legend is to be generated
col	either empty or a vector of colors with one for each column in the obj
alpha	a degree of color translucence to be used for shaded densities, where 1 is opaque, 0 is clear
lwd	line width used for highest-density range and density outlines (see par)
hpd	either $\mathtt{NULL}$ or a value between 0 and 1, corresponding to the width of the highest density region to be shaded
bars	a logical specifier which, if bars=TRUE, outlines the width of the high density region
legend.control	
	if plot=TRUE, a legend is generated (see legend for details concerning this list)
truncate	if min and (or) max are defined, values below and (or) above the truncation point are removed prior to computation of the highest density region and prior to plotting
xlim	if $\min$ and (or) $\max$ are defined, values below and (or) above the $\liminf(s)$ are excluded from the plot without further corrupting the data
	further arguments to be passed to plot

### Author(s)

JM Eastman

# See Also

```
profiles.plot, upon which this function is largely based
```

```
# construct and plot a dataframe of three 'traces', excluding the largest values
d=data.frame(list(rnorm(n=1000,mean=9,sd=5)),list(rnorm(n=1000,mean=1.5,sd=2)),list(rnorm
names(d)=letters[1:3]
trace.plot(obj=d, xlim=list(max=10), col=c("maroon","gray","purple"), alpha=0.3, lwd=2)
dev.new()
```

20 tracer

```
# construct and plot a dataframe of two 'traces' using a log scale
d=data.frame(list(rlnorm(n=1000, meanlog=1, sdlog=0.5)), list(rlnorm(n=1000, meanlog=1.5, sdlognames(d)=letters[1:2]
trace.plot(obj=d, col=c("maroon", "purple"), alpha=0.3, log="x")
```

tracer

plotting of Bayesian posterior samples

### **Description**

Generates diagnostics for reversible-jump Markov sampling densities

### Usage

```
tracer(base.log, lambdaK = log(2), Bayes.factor = NULL, burnin = 0.25, col.line
```

### **Arguments**

base.log	a path to the stored summary logfile of the Markov sample
lambdaK	the shape parameter for the Poisson distribution used as a prior on the number of distinct evolutionary parameters in the tree
Bayes.factor	a vector of two numbers, specifying a Bayes factor comparison between $ \mbox{\it j-}$ and $ \mbox{\it k-parameter models}$
burnin	proportion of the chain to be treated as burnin (e.g., from 0 to 1); burnin is used for all plots but the trace of the log-likelihoods
col.line	a color to be used for density plots (both for a Bayes.factor comparison and for the density of mean rates across the Markov sample) $\ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \$
pdf	a logical switch that determines whether plots are written to .pdf
factor	a character ${\tt k}$ , ${\tt M}$ or NULL, determining whether the lnL-trace axis is in thousands (k) or millions (M) of generations
	further arguments to be passed to plot

# Value

if pdf=TRUE, a .pdf will be generated that includes the trace of log-likelihoods, the density of sampled mean rates, the correspondence between prior and posterior weights for k-rate models, and a Bayes factor comparison. The argument for Bayes.factor can be Bayes.factor=c(1, "multi") in which a comparison between a global-parameter and multiple-parameter model is made

### Author(s)

JM Eastman

vmat 21

#### **Examples**

```
# generate tree
n=24
phy=prunelastsplit(birthdeath.tree(b=1,d=0,taxa.stop=n+1))
# simulate data
dat=rTraitCont(phy=phy, model="BM", sigma=sqrt(0.1))
# run reversible-jump MCMC for a short chain
r=paste(sample(letters,9,replace=TRUE),collapse="")
rjmcmc.bm(phy=phy, dat=dat, ngen=5000, sample.freq=10, prob.mergesplit=0.1, fileBase=r)
# plot Markov sampled rates and other traces
tracer(base.log=paste(paste("BM",r,"parameters",sep="."),paste("BM",r,"rjmcmc.log",sep=".")
## PASTE UNCOMMENTED FOLLOWING LINE TO DROP DIRECTORIES CREATED BY RJMCMC
# unlink(dir(pattern=paste(r)),recursive=TRUE)
```

vmat

computation of phylogenetic variance-covariance matrix

### **Description**

Calculates the VCV matrix for a phylogenetic tree

#### Usage

```
vmat (phy)
```

### **Arguments**

phy

a phylogenetic tree of class 'phylo'

#### **Details**

This function is a conversion of vcv.phylo into compiled C++ for rapid generation of the expected trait-variances and trait covariances among species under Brownian motion evolution. This function is highly memory intensive; for a machine with 2 Gb RAM, vmat is efficient for trees with fewer than ca. 5000 tips; for trees with 20,000 tips, sufficient memory (> 8 Gb RAM) may be required.

#### Value

A variance-covariance matrix for all tips within the supplied tree.

#### Author(s)

JM Eastman, based on vcv.phylo by Emmanuel Paradis

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```
## generate tree
n = 250
phy=rescaleTree(phy=rcoal(n=n),totalDepth=100)
## compare function times for vcv.phylo() and vmat()
print(system.time(vcv.phylo(phy)))
print(system.time(vmat(phy)))
## generate some smaller matrices
n=4
phy=rescaleTree(phy=rcoal(n=n),totalDepth=100)
\#\# compute the variance-covariance matrix with ape and \texttt{rjmcmc}
vcv.phylo(phy)->vAPE
vmat (phy) ->vRJ
## print the matrices
print(vAPE)
print(vRJ)
\#\# verify that both packages return identical results
print(all(vAPE==vRJ))
```

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