# Package 'rexpokit'

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Type Package

**Title** R Wrappers for EXPOKIT; Other Matrix Functions

**Version** 0.26.6.6 **Date** 2019-11-04

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**Depends** R (>= 3.0.2)

**Imports** stats, Rcpp (>= 0.11.0)

**LinkingTo** Rcpp (>= 0.11.0)

Copyright See /inst/LAPACK LICENSE.txt for code in /src.

Description Wraps some of the matrix exponentiation utilities from EXPOKIT (<a href="http://www.maths.uq.edu.au/expokit/">http://www.maths.uq.edu.au/expokit/</a>), a FORTRAN library that is widely recommended for matrix exponentiation (Sidje RB, 1998. "Expokit: A Software Package for Computing Matrix Exponentials." ACM Trans. Math. Softw. 24(1): 130-156). EXPOKIT includes functions for exponentiating both small, dense matrices, and large, sparse matrices (in sparse matrices, most of the cells have value 0). Rapid matrix exponentiation is useful in phylogenetics when we have a large number of states (as we do when we are inferring the history of transitions between the possible geographic ranges of a species), but is probably useful in other ways as well.

URL http://phylo.wikidot.com/rexpokit

**License** GPL (>= 2)

LazyLoad yes

ByteCompile yes

**NeedsCompilation** yes

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# **R** topics documented:

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## **Description**

Matrix exponentiation with EXPOKIT in R

# Details

Package: rexpokit
Type: Package
Version: 0.26.6.5
Date: 2019-10-08

This package wraps some of the matrix exponentiation utilities from EXPOKIT (http://www.maths.uq.edu.au/expokit/), a FORTRAN library that is widely recommended for fast matrix exponentiation (Sidje RB, 1998. "Expokit: A Software Package for Computing Matrix Exponentials." *ACM Trans. Math. Softw.* 24(1): 130-156).

The FORTRAN package was developed by Roger B. Sidje, see <a href="http://www.maths.uq.edu.au/expokit/">http://www.maths.uq.edu.au/expokit/</a>. Nicholas J. Matzke adapted the package for use with R and wrote the R interface. Permission to distribute the EXPOKIT source under GPL was obtained from Roger B. Sidje.

EXPOKIT includes functions for exponentiating both small, dense matrices, and large, sparse matrices (in sparse matrices, most of the cells have value 0). Rapid matrix exponentiation is useful in phylogenetics when we have a large number of states (as we do when we are inferring the history of transitions between the possible geographic ranges of a species), but is probably useful in other ways as well.

# Help

For help with rexpokit or BioGeoBEARS, see (1) the PhyloWiki websites for rexpokit and Bio-GeoBEARS (http://phylo.wikidot.com/rexpokit, http://phylo.wikidot.com/biogeobears) and (2) the BioGeoBEARS Google Group (https://groups.google.com/forum/#!forum/biogeobears). Minor updates may get posted first to the rexpokit GitHub repository (https://github.com/nmatzke/rexpokit)

## Background

Various messages on discussion boards have asked whether or not there is an R package that uses EXPOKIT. There are only two as of this writing (January 2013) – diversitree and ctarma. However, diversitree's usage is nested deeply in a series of dynamic functions and integrated with additional libraries (e.g. deSolve) and so is very difficult to extract for general usage, and ctarma implements only ZEXPM via ctarma::zexpm. Niels Richard Hansen <Niels.R.Hansen@math.ku.dk> is also working on an implementation of certain EXPOKIT functions.

(See the additional notes file in the package "inst" directory, EXPOKIT\_For\_Dummies\_notes\_v1.txt for additional notes on wrappers for EXPOKIT in Python etc.)

As it turns out, the EXPOKIT documentation and code is far from trivial to figure out, since the code as published does not run "out of the box" – in particular, the Q transition matrix ("matvec"), which is the major input into an exponentiation algorithm, is not input directly, but rather via another function, which requires the user to put together some FORTRAN code to do this and make a wrapper for the core function. I couldn't figure it out in a short amount of time, but Stephen Smith did for his "LAGRANGE" biogeography package, so I copied and modified this chunk of his code to get started.

#### **Installation hints**

Installing rexpokit from source will require a gfortran compiler to convert the FORTRAN code files in /src (\*.f) to object files (\*.o), and g++ to compile and link the C++ wrapper. rexpokit was developed on an Intel Mac running OS X 10.7. I (NJM, 2013) successfully compiled it using g++ and gfortran from (gcc version 4.2.1). (Update 2017-08-13: repeated with gccgfortran version 7.1.0.)

#### Citation

This code was developed for the following publications. Please cite if used:

Matzke, Nicholas J. (2014). "Model Selection in Historical Biogeography Reveals that Founder-event Speciation is a Crucial Process in Island Clades." *Systematic Biology*, 63(6), 951-970. http://dx.doi.org/10.1093/sysbio/syu056

Matzke, Nicholas J. (2013). "Probabilistic historical biogeography: new models for founder-event speciation, imperfect detection, and fossils allow improved accuracy and model-testing." *Frontiers of Biogeography*, 5(4), 242-248. http://escholarship.org/uc/item/44j7n141

Matzke, Nicholas J. (2012). "Founder-event speciation in BioGeoBEARS package dramatically improves likelihoods and alters parameter inference in Dispersal-Extinction-Cladogenesis (DEC) analyses." *Frontiers of Biogeography* 4(suppl. 1): 210. Link to abstract and PDF of poster: http://phylo.wikidot.com/matzke-2013-international-biogeography-society-poster. (Poster abstract published in the Conference Program and Abstracts of the International Biogeography Society 6th Biannual Meeting, Miami, Florida. Poster Session P10: Historical and Paleo-Biogeography. Poster 129B. January 11, 2013.)

Please also cite Sidje (1998).

#### Acknowledgements/sources

1. Niels Richard Hansen <Niels.R.Hansen@math.ku.dk> helped greatly with the initial setup of the package. See his expoRkit for another R implementation of EXPOKIT routines.

**2.** EXPOKIT, original FORTRAN package, by Roger B. Sidje <rbs@maths.uq.edu.au>, Department of Mathematics, University of Queensland, Brisbane, QLD-4072, Australia, (c) 1996-2013 All Rights Reserved

Sidje has given permission to include EXPOKIT code in this R package under the usual GPL license for CRAN R packages. For the full EXPOKIT copyright and license, see expokit\_copyright.txt under inst/notes.

EXPOKIT was published by Sidje in: Sidje RB (1998). "Expokit. A Software Package for Computing Matrix Exponentials." *ACM-Transactions on Mathematical Software*, 24(1):130-156. http://tinyurl.com/bwa87rq

- 3. Revisions for version 0.26, which fixed many issues with warnings about obsolescence in F77 code, were aided by email help/discussions with: Kurt Hornik, Doug Nychka, Marcello Chiodi, Meabh McCurdy. Also, thanks to these incredibly helpful websites: "On-Line Fortran F77 F90 Converter" (https://www.fortran.uk/plusfortonline.php), "Building and checking R source packages for Windows" (https://win-builder.r-project.org/), "Modernizing Old Fortran" (http://fortranwiki.org/fortran/show/Modernizing+Old+Fortran), "Registering the C++ and FORTRAN calls" (https://stat.ethz.ch/pipermail/r-devel/2017-February/073755. html)
- **4.** A small amount of C++ code wrapping EXPOKIT was modified from a file in LAGRANGE, C++ version by Stephen Smith:

```
http://code.google.com/p/lagrange/
https://github.com/blackrim/lagrange
```

Specifically:

```
* RateMatrix.cpp
*
* Created on: Aug 14,2009
* Author: smitty
*
```

...and the my\_\*.f wrappers for the EXPOKIT \*.f code files.

**5.** Also copied in part (to get the .h file) from:

## Python package "Pyprop":

http://code.google.com/p/pyprop/

(old URL) pyprop.googlecode.com/svn/trunk/core/krylov/expokit/expokitpropagator.cpp (old URL) www.koders.com/python/fidCA95B5A4B2FB77455A72B8A361CF684FFE48F4DC.aspx?s=fourier+transform

## Specifically:

pyprop/core/krylov/expokit/f2c/expokit.h

**6.** The EXPOKIT FORTRAN package is available at:

http://www.maths.uq.edu.au/expokit/

#### Copyright:

http://www.maths.uq.edu.au/expokit/copyright ...or...

expokit\_copyright.txt in this install (see package "inst" directory)

- 7. EXPOKIT included some LAPACK and BLAS code for portability. This has been slightly modified to pass new CRAN checks and compilers. The original copyright is at: /inst/LAPACK\_LICENSE.txt
- **8.** itscale.f was copied from the R package "FD" in order to avoid an unnecessary dependency (and associated issues with compilation, updates, etc.). See R function "maxent" for more details, citations for package "FD":

Laliberte, E., and P. Legendre (2010) A distance-based framework for measuring functional diversity from multiple traits. *Ecology* 91:299-305.

Laliberte, E., Legendre, P., and B. Shipley. (2014). FD: measuring functional diversity from multiple traits, and other tools for functional ecology. R package version 1.0-12. https://CRAN.R-project.org/package=FD

# Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com>, Roger B. Sidje <roger.b.sidje@ua.edu>, Drew Schmidt <schmidt@math.utk.edu>

#### References

```
http://www.maths.uq.edu.au/expokit/
http://www.maths.uq.edu.au/expokit/copyright
```

Matzke, Nicholas J. (2014). "Model Selection in Historical Biogeography Reveals that Founder-event Speciation is a Crucial Process in Island Clades." *Systematic Biology*, 63(6), 951-970. http://dx.doi.org/10.1093/sysbio/syu056

Matzke, Nicholas J. (2013). "Probabilistic historical biogeography: new models for founder-event speciation, imperfect detection, and fossils allow improved accuracy and model-testing." *Frontiers of Biogeography*, 5(4), 242-248. http://escholarship.org/uc/item/44j7n141

Matzke N (2012). "Founder-event speciation in BioGeoBEARS package dramatically improves likelihoods and alters parameter inference in Dispersal-Extinction-Cladogenesis (DEC) analyses."

\_Frontiers of Biogeography\_, \*4\*(suppl. 1), pp. 210. ISSN 1948-6596, Poster abstract published in the Conference Program and Abstracts of the International Biogeography Society 6th Biannual Meeting, Miami, Florida. Poster Session P10: Historical and Paleo-Biogeography. Poster 129B. January 11, 2013, <URL: http://phylo.wikidot.com/matzke-2013-international-biogeography-society-poster

Sidje RB (1998). "Expokit. A Software Package for Computing Matrix Exponentials." \_ACM Trans. Math. Softw.\_, \*24\*(1), pp. 130-156. <URL: http://dx.doi.org/10.1145/285861.285868>, <URL: http://dl.acm.org/citation.cfm?id=285868>.

Eddelbuettel D and Francois R (2011). "Rcpp: Seamless R and C++ Integration." \_Journal of Statistical Software\_, \*40\*(8), pp. 1-18. ISSN 1548-7660, See also: <URL: http://cran.r-project.org/web/packages/Rcpp/vignettesintroduction.pdf>, <URL: http://cran.r-project.org/web/packages/Rcpp/index.html>., <URL: http://www.jstatsoft.org/v40/i08>.

Moler C and Loan CV (2003). "Nineteen dubious ways to compute the exponential of a matrix, twenty-five years later." \_SIAM review\_, \*45\*(1), pp. 3-49. <URL: http://epubs.siam.org/doi/10.1137/S00361445024180>.

Foster PG (2001). "The Idiot's Guide to the Zen of Likelihood in a Nutshell in Seven Days for Dummies, Unleashed." Online PDF, widely copied, <URL: http://www.bioinf.org/molsys/data/idiots.pdf>.

#### See Also

```
expoRkit expokit_wrapalldmexpv_tvals
```

```
# Example code
# For background and basic principles, see rexpokit/notes/EXPOKIT_For_Dummies_notes_v1.txt
library(rexpokit)
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504,
0.168, 0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# Exponentiate each with EXPOKIT's dgpadm (good for small dense matrices)
for (t in tvals)
Pmat = expokit_dgpadm_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
```

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```
print(Pmat)
# Exponentiate each with EXPOKIT's dmexpv (should be fast for large sparse matrices)
for (t in tvals)
Pmat = expokit_dmexpv_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
print(Pmat)
\# DMEXPV and DGEXPV are designed for large, sparse Q matrices (sparse = lots of zeros).
# DMEXPV is specifically designed for Markov chains and so may be slower, but more accurate.
# DMEXPV, single t-value
expokit_wrapalldmexpv_tvals(Qmat=Qmat, tvals=tvals[1], transpose_needed=TRUE)
expokit_wrapalldmexpv_tvals(Qmat=Qmat, tvals=2)
# DGEXPV, single t-value
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=tvals[1], transpose_needed=TRUE)
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=2)
# These functions runs the for-loop itself (sadly, we could not get mapply() to work
# on a function that calls dmexpv/dgexpv), returning a list of probability matrices.
# DMEXPV functions
list_of_P_matrices_dmexpv = expokit_wrapalldmexpv_tvals(Qmat=Qmat,
tvals=tvals, transpose_needed=TRUE)
list_of_P_matrices_dmexpv
# DGEXPV functions
list_of_P_matrices_dgexpv = expokit_wrapalldgexpv_tvals(Qmat=Qmat,
tvals=tvals, transpose_needed=TRUE)
list_of_P_matrices_dgexpv
# Check if there are differences in the results (might only happen for large problems)
cat("Differences between dmexpv and dgexpv\n")
for (i in 1:length(list_of_P_matrices_dmexpv))
diffs = list_of_P_matrices_dmexpv[[i]] - list_of_P_matrices_dgexpv[[i]]
print(diffs)
cat("\n")
}
```

8 coo2mat

## **Description**

EXPOKIT's dmexp-type functions deal with sparse matrices. These have a lot of zeros, and thus can be compressed into COO (coordinated list) format, which is described here:

# Usage

```
coo2mat(coomat,
  n = max(max(coomat[, 1]), max(coomat[, 2])),
  transpose_needed = FALSE)
```

#### **Arguments**

```
coomat a 3-column matrix or data.frame (basically cbind(ia,ja,a))

n the order of the matrix
transpose_needed
```

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

#### **Details**

```
http://en.wikipedia.org/wiki/Sparse_matrix#Coordinate_list_.28C00.29
```

In EXPOKIT and its wrapper functions, a COO-formated matrix is input as 3 vectors (first two integer, the third double):

```
ia = row numberja = column numbera = value of that cell in the matrix (skipping 0 cells)
```

This function takes a 3-column matrix or data.frame (basically cbind(ia, ja, a)) and the order of the matrix, n = the order of the matrix, i.e. number of rows/columns) and converts back to standard square format.

# Value

outmat

#### Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com>

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```
a = c(-1.218, 0.126, 0.168, 0.126, 0.504, -0.882, 0.504,
0.672, 0.336, 0.252, -1.050, 0.252, 0.378, 0.504, 0.378, -1.050)
coomat = cbind(ia, ja, a)
print(coomat)
n = 4
Qmat = coo2mat(coomat, n)
print(Qmat)
```

expm

Simple Interface

# Description

A simple interface for matrix exponentiation, similar to that found in the Matrix package.

#### Usage

```
expm(x, t=1)
```

## Arguments

x A square matrix.

t Time value; see details section below. Default value is 1.

#### **Details**

This routine computes  $\exp(t^*x)$ , where t in a single numeric value, and x is a square matrix and exp refers to the matrix exponential. Formally, the matrix exponential is given by the power series:

```
expm(x) = x/1! + x^2/2! + x^3/3! + \dots
```

where the powers on the matrix correspond to matrix-matrix multiplications.

expm() directly computes the matrix exponential of a dense matrix. The implementation uses an order 6 Pade' approximation with a scaling-and-squaring technique.

## Value

The matrix exponential.

## Author(s)

Drew Schmidt < schmidt@math.utk.edu>

## References

Sidje RB (1998). "Expokit. A Software Package for Computing Matrix Exponentials." \_ACM Trans. Math. Softw.\_, \*24\*(1), pp. 130-156. <URL: http://dx.doi.org/10.1145/285861.285868>, <URL: http://dl.acm.org/citation.cfm?id=285868>.

## **Examples**

```
# Example use:
x <- matrix(1:25, nrow=5)/100
expm(x)</pre>
```

expokit\_dgexpv\_Qmat

EXPOKIT dgexpv matrix exponentiation on Q matrix

# Description

This function converts a matrix to COO format and exponentiates it via the EXPOKIT dgexpv function (designed for sparse matrices) and wrapper functions wrapalldgexpv\_ around dgexpv.

## Usage

```
expokit_dgexpv_Qmat(Qmat = NULL, t = 2.1,
  inputprobs_for_fast = NULL, transpose_needed = TRUE,
  transform_to_coo_TF = TRUE, coo_n = NULL, anorm = NULL,
  check_for_0_rows = TRUE)
```

## Arguments

Qmat an input Q transition matrix t a time value to exponentiate by

inputprobs\_for\_fast

If NULL (default), the full probability matrix (Pmat) is returned. However, the full speed of EXPOKIT on sparse matrices will be exploited if inputprobs\_for\_fast=c(starting probabilities). In this case these starting probabilities are input to myDMEXPV directly, as v, and w, the output probabilities, are returned.

transpose\_needed

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

transform\_to\_coo\_TF

Should the matrix be tranposed to COO? COO format is required for EXPOKIT's sparse-matrix functions (like dmexpv and unlike the padm-related functions. Default TRUE; if FALSE, user must put a COO-formated matrix in Qmat. Supplying the coo matrix is probably faster for repeated calculations on large matrices.

coo\_n

If a COO matrix is input, coo\_n specified the order (# rows, equals # columns) of the matrix.

anorm

dgexpv requires an initial guess at the norm of the matrix. Using the R function norm might get slow with large matrices. If so, the user can input a guess manually (Lagrange seems to just use 1 or 0, if I recall correctly).

check\_for\_0\_rows

If TRUE or a numeric value, the input Qmat is checked for all-zero rows, since these will crash the FORTRAN wrapalldmexpv function. A small nonzero value set to check\_for\_0\_rows or the default (0.000000000001) is input to off-diagonal cells in the row (and the diagonal value is normalized), which should fix the problem.

#### **Details**

NOTE: DGEXPV vs. DMEXPV. According to the EXPOKIT documentation, DGEXPV should be faster than DMEXPV, however DMEXPV runs an accuracy check appropriate for Markov chains, which is not done in DGEXPV.

#### From EXPOKIT:

- \* The method used is based on Krylov subspace projection
- \* techniques and the matrix under consideration interacts only
- \* via the external routine 'matvec' performing the matrix-vector
- \* product (matrix-free method).

\*

- $\star$  This [DMEXPV,not DGEXPV --NJM] is a customised version for Markov Chains. This means that a
- \* check is done within this code to ensure that the resulting vector
- \* w is a probability vector, i.e., w must have all its components
- \* in [0,1], with sum equal to 1. This check is done at some expense
- \* and the user may try DGEXPV which is cheaper since it ignores
- \* probability constraints.

I (NJM) have not noticed a difference between the outputs of these two functions, but it might occur with large matrices.

COO (coordinated list) format is a compressed format that is required for EXPOKIT's sparse-matrix functions (like dgexpv and unlike EXPOKIT's padm-related functions. COO format is described here:

http://en.wikipedia.org/wiki/Sparse\_matrix#Coordinate\_list\_.28C00.29

If Qmat is NULL (default), a default matrix is input.

# Value

tmpoutmat the output matrix. wrapalldgexpv\_ produces additional output relating to accuracy of the output matrix etc.; these can be by a direct call of dgexpv.

## Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com> and Drew Schmidt <schmidt@math.utk.edu>

#### See Also

```
mat2coo
expokit_wrapalldgexpv_tvals
```

```
# Example:
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# Exponentiate each with EXPOKIT's dgexpv (should be fast for large sparse matrices)
for (t in tvals)
Pmat = expokit_dgexpv_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
print(Pmat)
}
# DMEXPV and DGEXPV are designed for large, sparse Q matrices (sparse = lots of zeros).
# DMEXPV is specifically designed for Markov chains and so may be slower, but more accurate.
# DGEXPV, single t-value
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=tvals[1], transpose_needed=TRUE)
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=2)
# This function runs the for-loop itself (sadly, we could not get mapply() to work
# on a function that calls dmexpv/dgexpv), returning a list of probability matrices.
# DGEXPV functions
list_of_P_matrices_dgexpv = expokit_wrapalldgexpv_tvals(Qmat=Qmat,
tvals=tvals, transpose_needed=TRUE)
list_of_P_matrices_dgexpv
```

# **Description**

This function exponentiates a matrix via the EXPOKIT padm function (designed for small dense matrices) and wrapper function wrapalldgpadm\_ around dmexpv.

#### Usage

```
expokit_dgpadm_Qmat(Qmat = NULL, t = 2.1,
    transpose_needed = TRUE)
```

# Arguments

Qmat an input Q transition matrix

t one or more time values to exponentiate by

transpose\_needed

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

#### **Details**

#### From EXPOKIT:

```
* Computes exp(t*H), the matrix exponential of a general matrix in * full, using the irreducible rational Pade approximation to the * exponential function \exp(x) = r(x) = (+/-)(I + 2*(q(x)/p(x))),
```

\* combined with scaling-and-squaring.

If Qmat is NULL (default), a default matrix is input.

#### Value

tmpoutmat the output matrix. wrapalldmexpv\_ produces additional output relating to accuracy of the output matrix etc.; these can be obtained by a direct call of wrapalldmexpv\_.

# Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com> and Drew Schmidt <schmidt@math.utk.edu>

# See Also

mat2coo

## **Examples**

```
# Example:
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# Exponentiate each with EXPOKIT's dgpadm (good for small dense matrices)
for (t in tvals)
Pmat = expokit_dgpadm_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
print(Pmat)
```

 ${\tt expokit\_dmexpv\_Qmat} \qquad {\it EXPOKIT\ dmexpv\ matrix\ exponentiation\ on\ Q\ matrix}$ 

## Description

This function converts a matrix to COO format and exponentiates it via the EXPOKIT dmexpv function (designed for sparse matrices) and wrapper functions wrapalldmexpv\_ around dmexpv.

#### **Usage**

```
expokit_dmexpv_Qmat(Qmat = NULL, t = 2.1,
  inputprobs_for_fast = NULL, transpose_needed = TRUE,
  transform_to_coo_TF = TRUE, coo_n = NULL, anorm = NULL,
  check_for_0_rows = TRUE)
```

## **Arguments**

```
\begin{array}{ll} \text{Qmat} & \text{an input } Q \text{ transition matrix} \\ \text{t} & \text{one or more time values to exponentiate by} \\ \text{inputprobs\_for\_fast} \end{array}
```

If NULL (default), the full probability matrix (Pmat) is returned. However, the full speed of EXPOKIT on sparse matrices will be exploited if inputprobs\_for\_fast=c(starting probabilities). In this case these starting probabilities are input to myDMEXPV directly, as v, and w, the output probabilities, are returned.

transpose\_needed

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

transform\_to\_coo\_TF

Should the matrix be tranposed to COO? COO format is required for EXPOKIT's sparse-matrix functions (like dmexpv and unlike the padm-related functions. Default TRUE; if FALSE, user must put a COO-formated matrix in Qmat. Supplying the coo matrix is probably faster for repeated calculations on large matrices.

coo\_n

If a COO matrix is input, coo\_n specified the order (# rows, equals # columns) of the matrix.

anorm

dmexpv requires an initial guess at the norm of the matrix. Using the

check\_for\_0\_rows

If TRUE or a numeric value, the input Qmat is checked for all-zero rows, since these will crash the FORTRAN wrapalldmexpv function. A small nonzero value set to check\_for\_0\_rows or the default (0.000000000001) is input to off-diagonal cells in the row (and the diagonal value is normalized), which should fix the problem. R function norm might get slow with large matrices. If so, the user can input a guess manually (Lagrange seems to just use 1 or 0, if I recall correctly).

#### **Details**

#### From EXPOKIT:

- \* The method used is based on Krylov subspace projection
- \* techniques and the matrix under consideration interacts only
- $\star$  via the external routine 'matvec' performing the matrix-vector
- \* product (matrix-free method).

\*

- \* This is a customised version for Markov Chains. This means that a
- \* check is done within this code to ensure that the resulting vector
- \* wis a probability vector, i.e., w must have all its components
- \* in [0,1], with sum equal to 1. This check is done at some expense
- \* and the user may try DGEXPV which is cheaper since it ignores
- \* probability constraints.

COO (coordinated list) format is a compressed format that is required for EXPOKIT's sparse-matrix functions (like dmexpv and unlike EXPOKIT's padm-related functions.

COO (coordinated list) format is described here:

http://en.wikipedia.org/wiki/Sparse\_matrix#Coordinate\_list\_.28C00.29

If Qmat is NULL (default), a default matrix is input.

#### Value

tmpoutmat the output matrix. wrapalldmexpv\_ produces additional output relating to accuracy of the output matrix etc.; these can be by a direct call of dmexpv.

#### Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com> and Drew Schmidt <schmidt@math.utk.edu>

#### See Also

```
mat2coo
expokit_wrapalldmexpv_tvals
```

## **Examples**

```
# Example:
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# Exponentiate each with EXPOKIT's dmexpv (should be fast for large sparse matrices)
for (t in tvals)
{
Pmat = expokit_dmexpv_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
print(Pmat)
}
```

expokit\_itscale5\_wrapper

wrapper function for FORTRAN itscale5, for FD's maxent

## Description

This function wraps the .C call to EXPOKIT for the itscale5 function.

### **Usage**

```
expokit_itscale5_wrapper(SXT, ngroups, ntraits, const, prior,
  prob, entropy, niter, tol, denom)
```

#### **Arguments**

SXT is a Groups (rows) X Traits (columns) matrix

ngroups is an integer (nb: NJM's interpretation)
ntraits is an integer (nb: NJM's interpretation)

const is a vector of the constraint values (means, variances)

prior is the prior distribution

prob is the return vector of the maximum entropy

entropy is the maximum entropy probabilities niter is the number of iterations required

tol is the convergence tolerance value; tolerance is mean square difference

denom are final moments

#### **Details**

The itscale5 function is in the "itscale5.f" FORTRAN file. itscale5 is used by the FD::maxent function.

The maxent function is used by BioGeoBEARS, merely to provide a simple method of putting flat or skewed probability distributions on the ordered categorical variable "size of smaller daughter range").

As the package FD has a number of other dependencies, some of which cause problems on some machines, I am just including maxent and itscale5 here, in order to avoid "dependency hell".

I am putting it in rexpokit rather than BioGeoBEARS, to make rexpokit the only package using FORTRAN code (which has a list of its own issues).

## Value

res A list of outputs

# Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com>

# See Also

maxent

```
# See maxent() function
test=1
```

expokit\_wrapalldgexpv\_tvals

Run EXPOKIT's dgexpv on one or more t-values

## **Description**

The function runs EXPOKIT's dgexpv function on a Q matrix and *one or more* time values. If Qmat is NULL (default), a default matrix is input.

# Usage

```
expokit_wrapalldgexpv_tvals(Qmat = NULL, tvals = c(2.1),
  inputprobs_for_fast = NULL, transpose_needed = TRUE,
  transform_to_coo_TF = TRUE, coo_n = NULL,
  force_list_if_1_tval = FALSE, check_for_0_rows = TRUE)
```

## **Arguments**

Qmat an input Q transition matrix

tvals one or more time values to exponentiate by (doesn't have to literally be a time

value, obviously)

inputprobs\_for\_fast

If NULL (default), the full probability matrix (Pmat) is returned. However, the full speed of EXPOKIT on sparse matrices will be exploited if inputprobs\_for\_fast=c(starting probabilities). In this case these starting probabilities are input to myDMEXPV directly, as v, and w, the output probabilities, are returned.

transpose\_needed

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

transform\_to\_coo\_TF

Should the matrix be tranposed to COO? COO format is required for EXPOKIT's sparse-matrix functions (like dmexpv and unlike the padm-related functions. Default TRUE; if FALSE, user must put a COO-formated matrix in Qmat. Supplying the coo matrix is probably faster for repeated calculations on large matrices.

coo\_n

If a COO matrix is input, coo\_n specified the order (# rows, equals # columns) of the matrix.

force\_list\_if\_1\_tval

Default FALSE, but set to TRUE if you want a single matrix to be returned inside a list

check\_for\_0\_rows

If TRUE or a numeric value, the input Qmat is checked for all-zero rows, since these will crash the FORTRAN wrapalldmexpv function. A small nonzero value set to check\_for\_0\_rows or the default (0.000000000001) is input to off-diagonal cells in the row (and the diagonal value is normalized), which should fix the problem.

#### **Details**

NOTE: DGEXPV vs. DMEXPV. According to the EXPOKIT documentation, DGEXPV should be faster than DMEXPV, however DMEXPV runs an accuracy check appropriate for Markov chains, which is not done in DGEXPV.

#### Value

tmpoutmat the output matrix, if 1 t-value is input; list\_of\_matrices\_output, if more than 1 t-value is input; to get a single output matrix in a list, set force\_list\_if\_1\_tval=TRUE

## Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com> and Drew Schmidt <schmidt@math.utk.edu>

#### See Also

```
expokit_dgexpv_Qmat
```

```
# Example:
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# Exponentiate each with EXPOKIT's dgexpv (should be fast for large sparse matrices)
for (t in tvals)
Pmat = expokit_dgexpv_Qmat(Qmat=Qmat, t=t, transpose_needed=TRUE)
cat("\n\nTime=", t, "\n", sep="")
print(Pmat)
}
# DMEXPV and DGEXPV are designed for large, sparse Q matrices (sparse = lots of zeros).
# DMEXPV is specifically designed for Markov chains and so may be slower, but more accurate.
# DMEXPV, single t-value
# DGEXPV, single t-value
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=tvals[1], transpose_needed=TRUE)
```

```
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=2)
# These functions runs the for-loop itself (sadly, we could not get mapply() to work
# on a function that calls dmexpv/dgexpv), returning a list of probability matrices.
# DGEXPV functions
list_of_P_matrices_dgexpv = expokit_wrapalldgexpv_tvals(Qmat=Qmat,
tvals=tvals, transpose_needed=TRUE)
list_of_P_matrices_dgexpv
```

expokit\_wrapalldmexpv\_tvals

Run EXPOKIT's dmexpv on one or more t-values

# **Description**

The function runs EXPOKIT's dmexpv function on a Q matrix and one or more time values. If Qmat is NULL (default), a default matrix is input.

## Usage

```
expokit_wrapalldmexpv_tvals(Qmat = NULL, tvals = c(2.1),
 inputprobs_for_fast = NULL, transpose_needed = TRUE,
 transform_to_coo_TF = TRUE, coo_n = NULL,
 force_list_if_1_tval = FALSE, check_for_0_rows = TRUE)
```

# Arguments

Qmat an input Q transition matrix

one or more time values to exponentiate by (doesn't have to literally be a time tvals

value, obviously)

inputprobs\_for\_fast

If NULL (default), the full probability matrix (Pmat) is returned. However, the full speed of EXPOKIT on sparse matrices will be exploited if inputprobs\_for\_fast=c(starting probabilities). In this case these starting probabilities are input to myDMEXPV directly, as v, and w, the output probabilities, are returned.

transpose\_needed

If TRUE (default), matrix will be transposed (apparently EXPOKIT needs the input matrix to be transposed compared to normal)

transform\_to\_coo\_TF

Should the matrix be transposed to COO? COO format is required for EXPOKIT's sparse-matrix functions (like dmexpv and unlike the padm-related functions. Default TRUE; if FALSE, user must put a COO-formated matrix in Qmat. Supplying the coo matrix is probably faster for repeated calculations on large matri-

If a COO matrix is input, coo\_n specified the order (# rows, equals # columns) coo\_n of the matrix.

```
force_list_if_1_tval
```

Default FALSE, but set to TRUE if you want a single matrix to be returned inside a list

```
check_for_0_rows
```

If TRUE or a numeric value, the input Qmat is checked for all-zero rows, since these will crash the FORTRAN wrapalldmexpv function. A small nonzero value set to check\_for\_0\_rows or the default (0.000000000001) is input to off-diagonal cells in the row (and the diagonal value is normalized), which should fix the problem.

#### Value

tmpoutmat the output matrix, if 1 t-value is input; list\_of\_matrices\_output, if more than 1 t-value is input; to get a single output matrix in a list, set force\_list\_if\_1\_tval=TRUE

## Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com> and Drew Schmidt <schmidt@math.utk.edu>

#### See Also

```
expokit_dmexpv_Qmat
```

```
# Make a square instantaneous rate matrix (Q matrix)
# This matrix is taken from Peter Foster's (2001) "The Idiot's Guide
# to the Zen of Likelihood in a Nutshell in Seven Days for Dummies,
# Unleashed" at:
# \url{http://www.bioinf.org/molsys/data/idiots.pdf}
# The Q matrix includes the stationary base frequencies, which Pmat
# converges to as t becomes large.
Qmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Make a series of t values
tvals = c(0.001, 0.005, 0.01, 0.05, 0.1, 0.5, 1, 2, 5, 14)
# DMEXPV and DGEXPV are designed for large, sparse Q matrices (sparse = lots of zeros).
# DMEXPV is specifically designed for Markov chains and so may be slower, but more accurate.
# DGEXPV, single t-value
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=tvals[1], transpose_needed=TRUE)
expokit_wrapalldgexpv_tvals(Qmat=Qmat, tvals=2)
# This function runs the for-loop itself (sadly, we could not get mapply() to work
# on a function that calls dmexpv/dgexpv), returning a list of probability matrices.
# DGEXPV functions
list_of_P_matrices_dgexpv = expokit_wrapalldgexpv_tvals(Qmat=Qmat,
tvals=tvals, transpose_needed=TRUE)
```

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```
list_of_P_matrices_dgexpv
```

mat2coo

Convert matrix to COO format using SparseM function

## **Description**

Converts a matrix to COO format using the SparseM function, presumably this is faster than using a for-loop.

## Usage

```
mat2coo(tmpmat)
```

## **Arguments**

tmpmat

A square matrix

## **Details**

EXPOKIT's dmexp-type functions deal with sparse matrices. These have a lot of zeros, and thus can be compressed into COO (coordinated list) format, which is described here:

```
http://en.wikipedia.org/wiki/Sparse_matrix#Coordinate_list_.28C00.29
```

In EXPOKIT and its wrapper functions, a COO-formated matrix is input as 3 vectors (first two integer, the third double):

```
ia = row numberja = column numbera = value of that cell in the matrix (skipping 0 cells)
```

#### Value

```
tmpmat_in_REXPOKIT_coo_fmt A cbind of ia, ja, and a
```

#### Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com>

#### See Also

```
mat2coo_forloop
```

```
# Example use:
```

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mat2coo\_forloop

Convert matrix to COO format using nested for-loops

# Description

Converts a matrix to COO format. This version of the function uses for-loops, which is presumably less efficient than mat2coo.

# Usage

```
mat2coo_forloop(tmpmat)
```

## **Arguments**

tmpmat

A square matrix

#### Value

```
tmpmat_in_REXPOKIT_coo_fmt A cbind of ia, ja, and a
```

# Author(s)

Nicholas J. Matzke <nickmatzke.ncse@gmail.com>

## See Also

mat2coo

```
# Example use:
# Make a Q matrix
tmpmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Convert to REXPOKIT coo format
tmpmat_in_REXPOKIT_coo_fmt = mat2coo_forloop(tmpmat)
tmpmat_in_REXPOKIT_coo_fmt
```

maxent	Estimating Probabilities via Maximum Entropy: Improved Iterative Scaling

#### **Description**

NOTE: This is a copy of the FD::maxent function, included in rexpokit to avoid the dependency on the package FD. maxent returns the probabilities that maximize the entropy conditional on a series of constraints that are linear in the features. It relies on the Improved Iterative Scaling algorithm of Della Pietra et al. (1997). It has been used to predict the relative abundances of a set of species given the trait values of each species and the community-aggregated trait values at a site (Shipley et al. 2006; Shipley 2009; Sonnier et al. 2009).

# Usage

```
maxent(constr, states, prior, tol = 1e-07, lambda = FALSE)
```

## **Arguments**

constr	vector of macroscopical constraints (e.g. community-aggregated trait values). Can also be a matrix or data frame, with constraints as columns and data sets (e.g. sites) as rows.
states	vector, matrix or data frame of states (columns) and their attributes (rows).
prior	vector, matrix or data frame of prior probabilities of states (columns). Can be missing, in which case a maximally uninformative prior is assumed (i.e. uniform distribution).
tol	tolerance threshold to determine convergence. See 'details' section.
lambda	Logical. Should $\lambda$ -values be returned?

## **Details**

This is a copy of the FD::maxent function, included in rexpokit to avoid the dependency on the package FD. Its authorship information is Authored by: Bill Shipley <br/>
shipley@usherbrooke.ca> (http://pages.usherbrooke.ca/jshipley/recherche/); Ported to FD by Etienne Laliberte. It was copied to rexpokit by Nick Matzke (just in order to avoid the dependency on package "FD").

Having BioGeoBEARS depend on package "FD" was sometimes problematic, as it had a variety of FORTRAN code and dependencies that could slow/stall installation, particularly on older Windows machines or machines without appropriate compilers. The maxent function uses only the FORTRAN file itscale5.f, so that code was included in rexpokit, in order to include all of the FORTRAN code in a single package (greatly simplifying the compilation and code-review process for BioGeoBEARS, which is pure R.)

The function maxent is used in BioGeoBEARS only for the simple purpose of putting a probability distribution on the ordered variable "number of areas in the smaller daughter range" at cladogenesis. For example, if mx01v = 0.0001 (the DEC model default), then the smaller daughter range will have a 100 percent probability of being of size 1 area during a vicariance event (thus, the "v" in

"mx01v"). If mx01v = 0.5 (the DIVALIKE model default), then the smaller daughter range will have an equal chance of being any range of size less than the parent range. If mx01y = 0.9999 (the BAYAREALIKE default), then the "smaller" daughter at sympatry (mx01y, y is sYmpatry) will have 100 percent probability of being the same size as its sister (i.e., the same range as the sister, i.e. "perfect sympatry" or "sympatry across all areas").

Original description from FD::maxent follows for completeness, but is not relevant for rexpokit/BioGeoBEARS.

The biological model of community assembly through trait-based habitat filtering (Keddy 1992) has been translated mathematically via a maximum entropy (maxent) model by Shipley et al. (2006) and Shipley (2009). A maxent model contains three components: (i) a set of possible states and their attributes, (ii) a set of macroscopic empirical constraints, and (iii) a prior probability distribution  $\mathbf{q} = [q_i]$ .

In the context of community assembly, states are species, macroscopic empirical constraints are community-aggregated traits, and prior probabilities **q** are the relative abundances of species of the regional pool (Shipley et al. 2006, Shipley 2009). By default, these prior probabilities **q** are maximally uninformative (i.e. a uniform distribution), but can be specificied otherwise (Shipley 2009, Sonnier et al. 2009).

To facilitate the link between the biological model and the mathematical model, in the following description of the algorithm states are species and constraints are traits.

Note that if constr is a matrix or data frame containing several sets (rows), a maxent model is run on each individual set. In this case if prior is a vector, the same prior is used for each set. A different prior can also be specified for each set. In this case, the number of rows in prior must be equal to the number of rows in constr.

If q is not specified, set  $p_j = 1/S$  for each of the S species (i.e. a uniform distribution), where  $p_j$  is the probability of species j, otherwise  $p_j = q_j$ .

Calculate a vector  $\mathbf{c} = [c_i] = \{c_1, c_2, \dots, c_T\}$ , where  $c_i = \sum_{j=1}^{S} t_{ij}$ ; i.e. each  $c_i$  is the sum of the

values of trait i over all species, and T is the number of traits.

Repeat for each iteration k until convergence:

1. For each trait  $t_i$  (i.e. row of the constraint matrix) calculate:

$$\gamma_i(k) = \ln \left( \frac{\bar{t}_i}{\sum_{j=1}^{S} (p_j(k) \ t_{ij})} \right) \left( \frac{1}{c_i} \right)$$

This is simply the natural log of the known community-aggregated trait value to the calculated community-aggregated trait value at this step in the iteration, given the current values of the probabilities. The whole thing is divided by the sum of the known values of the trait over all species.

2. Calculate the normalization term Z:

$$Z(k) = \left(\sum_{j=1}^{S} p_j(k) e^{\left(\sum_{i=1}^{T} \gamma_i(k) t_{ij}\right)}\right)$$

3. Calculate the new probabilities  $p_i$  of each species at iteration k+1:

$$p_j(k+1) = \frac{p_j(k) e^{\left(\sum_{i=1}^T \gamma_i(k) t_{ij}\right)}}{Z(k)}$$

4. If  $\left| max\left( p\left( k+1\right) -p\left( k\right) \right) \right| \leq$  tolerance threshold (i.e. argument tol) then stop, else repeat steps 1 to 3.

When convergence is achieved then the resulting probabilities  $(\hat{p}_j)$  are those that are as close as possible to  $q_j$  while simultaneously maximize the entropy conditional on the community-aggregated traits. The solution to this problem is the Gibbs distribution:

$$\hat{p}_{j} = \frac{q_{j}e^{\left(-\sum_{i=1}^{T}\lambda_{i}t_{ij}\right)}}{\sum_{i=1}^{S}q_{j}e^{\left(-\sum_{i=1}^{T}\lambda_{i}t_{ij}\right)}} = \frac{q_{j}e^{\left(-\sum_{i=1}^{T}\lambda_{i}t_{ij}\right)}}{Z}$$

This means that one can solve for the Langrange multipliers (i.e. weights on the traits,  $\lambda_i$ ) by solving the linear system of equations:

$$\begin{pmatrix} \ln(\hat{p}_{1}) \\ \ln(\hat{p}_{2}) \\ \vdots \\ \ln(\hat{p}_{S}) \end{pmatrix} = (\lambda_{1}, \ \lambda_{2}, \ \dots, \ \lambda_{T}) \begin{bmatrix} t_{11} & t_{12} & \dots & t_{1S} - \ln(Z) \\ t_{21} & t_{22} & \vdots & t_{2S} - \ln(Z) \\ \vdots & \vdots & \vdots & \vdots \\ t_{T1} & t_{T2} & \dots & t_{TS} - \ln(Z) \end{bmatrix} - \ln(Z)$$

This system of linear equations has T+1 unknowns (the T values of  $\lambda$  plus ln(Z)) and S equations. So long as the number of traits is less than S-1, this system is soluble. In fact, the solution is the well-known least squares regression: simply regress the values  $ln(\hat{p}_j)$  of each species on the trait values of each species in a multiple regression.

The intercept is the value of ln(Z) and the slopes are the values of  $\lambda_i$  and these slopes (Lagrange multipliers) measure by how much the  $ln(\hat{p}_j)$ , i.e. the ln(relative abundances), changes as the value of the trait changes.

FD::maxent.test provides permutation tests for maxent models (Shipley 2010).

#### Value

prob	vector of predicted probabilities
moments	vector of final moments
entropy	Shannon entropy of prob
iter	number of iterations required to reach convergence
lambda	$\lambda$ -values, only returned if lambda = T
constr	macroscopical constraints
states	states and their attributes
prior	prior probabilities

#### Author(s)

Bill Shipley <bill.shipley@usherbrooke.ca>, original URL: pages.usherbrooke.ca/jshipley/recherche/Ported to **FD** by Etienne Laliberte.

#### References

Della Pietra, S., V. Della Pietra, and J. Lafferty (1997) Inducing features of random fields. *IEEE Transactions Pattern Analysis and Machine Intelligence* **19**:1-13.

Keddy, P. A. (1992) Assembly and response rules: two goals for predictive community ecology. *Journal of Vegetation Science* **3**:157-164.

Shipley, B., D. Vile, and E. Garnier (2006) From plant traits to plant communities: a statistical mechanistic approach to biodiversity. *Science* **314**: 812–814.

Shipley, B. (2009) From Plant Traits to Vegetation Structure: Chance and Selection in the Assembly of Ecological Communities. Cambridge University Press, Cambridge, UK. 290 pages.

Shipley, B. (2010) Inferential permutation tests for maximum entropy models in ecology. *Ecology* in press.

Sonnier, G., Shipley, B., and M. L. Navas. 2009. Plant traits, species pools and the prediction of relative abundance in plant communities: a maximum entropy approach. *Journal of Vegetation Science* in press.

## See Also

FD::functcomp to compute community-aggregated traits, and FD::maxent.test for the permutation tests proposed by Shipley (2010).

Another faster version of maxent for multicore processors called maxentMC is available from Etienne Laliberte (<etiennelaliberte@gmail.com>). It's exactly the same as maxent but makes use of the **multicore**, **doMC**, and **foreach** packages. Because of this, maxentMC only works on POSIX-compliant OS's (essentially anything but Windows).

```
# an unbiased 6-sided dice, with mean = 3.5
# what is the probability associated with each side,
# given this constraint?
maxent(3.5, 1:6)
# a biased 6-sided dice, with mean = 4
maxent(4, 1:6)
```

```
SparseM_coo_to_REXPOKIT_coo
```

Convert a SparseM COO matrix to a plain matrix

# Description

```
Converts a SparseM COO-formatted matrix (an S4 object) to a plain matrix, with column \#1 = ia = i index column \#2 = ja = j index column \#3 = a = nonzero values of the matrix
```

# Usage

```
SparseM_coo_to_REXPOKIT_coo(tmpmat_in_SparseMcoo_fmt)
```

# **Arguments**

```
tmpmat_in_SparseMcoo_fmt
```

A square matrix S4 object derived from SparseM's as.matrix.coo

## **Details**

Background: COO (coordinated list) format, is described here:

```
http://en.wikipedia.org/wiki/Sparse_matrix#Coordinate_list_.28C00.29
```

In EXPOKIT and its wrapper functions, a COO-formated matrix is input as 3 vectors (first two integer, the third double):

```
ia = row numberja = column numbera = value of that cell in the matrix (skipping 0 cells)
```

## Value

```
tmpmat_in_REXPOKIT_coo_fmt A cbind of ia, ja, and a
```

# Author(s)

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## See Also

```
mat2coo_forloop
```

```
# Example use:
# Make a Q matrix
tmpmat = matrix(c(-1.218, 0.504, 0.336, 0.378, 0.126, -0.882, 0.252, 0.504, 0.168,
0.504, -1.05, 0.378, 0.126, 0.672, 0.252, -1.05), nrow=4, byrow=TRUE)
# Covert to SparseM coo format
tmpmat_in_REXPOKIT_coo_fmt <- mat2coo(tmpmat)</pre>
```

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