# Package 'wsyn'

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|--|
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addranks

Adds rank information to a coh or wlmtest object

# Description

When a coh or wlmtets object is created, the ranks slot is NA. This function fills it in.

## Usage

```
addranks(obj)
```

## **Arguments**

obj

An object of class coh or wlmtest

## Value

addranks returns another coh or wlmtest object with ranks slot now included. If obj\$ranks was not NA, the object is returned as is.

## Note

Internal function, no error checking performed

# Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### See Also

```
coh, wlmtest, bandtest, browseVignettes("wsyn")
```

addwmfs

Adds wavelet mean field information to a clust object

# **Description**

When a clust object is created, the wmfs slot is NA. This function fills it in.

## Usage

```
addwmfs(obj)
```

## **Arguments**

obj

An object of class clust

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#### **Details**

This function uses the values of scale.min, scale.max.input, sigma and f0 stored in obj\$methodspecs. It is possible to create a clust object with bad values for these slots. This function throws an error in that case. You can use a correlation-based method for calculating the synchrony matrix and still pass values of scale.min, scale.max.input, sigma and f0 to clust (in fact, this happens by default) - they won't be used by clust, but they will be there for later use by addwmfs and addwpmfs.

#### Value

addwmfs returns another clust object with wmfs slot now included. If obj\$wmfs was not NA, the object is returned as is.

## Author(s)

Daniel Reuman, <reuman@ku.edu>

## See Also

```
clust, addwpmfs, browseVignettes("wsyn")
```

# **Examples**

```
sig<-matrix(.8,5,5)</pre>
diag(sig)<-1
lents<-50
if (requireNamespace("mvtnorm", quietly=TRUE))
  dat1<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))</pre>
  dat2<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))</pre>
}else
  dat1<-t(matrix(rep(rnorm(lents), times=5), lents, 5))</pre>
  dat2<-t(matrix(rep(rnorm(lents), times=5), lents, 5))</pre>
}
dat<-rbind(dat1,dat2)</pre>
times<-1:lents
dat<-cleandat(dat,times,clev=1)$cdat</pre>
coords < -data.frame(Y=rep(0,10),X=1:10)
method<-"coh.sig.fast"
clustobj<-clust(dat,times,coords,method,nsurrogs = 100)</pre>
res<-addwmfs(clustobj)</pre>
```

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| addwpmfs | Adds wavelet phasor mean field information to a clust object |
|----------|--|
|          |  |

## **Description**

When a clust object is created, the wpmfs slot is NA. This function fills it in, or adds to it.

## Usage

```
addwpmfs(
  obj,
  level = 1:length(obj$clusters),
  sigmethod = "quick",
  nrand = 1000
)
```

# **Arguments**

obj An object of class clust

level The clustering level(s) to use. 1 corresponds to no clustering. The default is all

levels of clustering.

sigmethod Method for significance testing the wpmf, one of quick, fft, aaft (see details

of the wpmf function)

nrand The number of randomizations to be used for significance testing

## **Details**

This function uses the values of scale.min, scale.max.input, sigma and f0 stored in obj\$methodspecs. It is possible to create a clust object with bad values for these slots. This function throws an error in that case. You can use a correlation-based method for calculating the synchrony matrix and still pass values of scale.min, scale.max.input, sigma and f0 to clust (in fact, this happens by default) - they won't be used by clust, but they will be there for later use by addwmfs and addwpmfs.

# Value

addwpmfs returns another clust object with wpmfs slot now included, or more filled in than it was previously. With values of sigmethod other than "quick", this function can be slow, particularly with large nrand. So in that case the user may want to set level equal only to one clustering level of interest. Unlike wmf, old values in obj\$wpmfs are overwritten.

#### Author(s)

Daniel Reuman, <reuman@ku.edu>

## See Also

```
clust, addwmfs, browseVignettes("wsyn")
```

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## **Examples**

```
sig<-matrix(.8,5,5)
diag(sig)<-1
lents<-50
if (requireNamespace("mvtnorm",quietly=TRUE))
{
    dat1<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))
    dat2<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))
}else
{
    dat1<-t(matrix(rep(rnorm(lents),times=5),lents,5))
    dat2<-t(matrix(rep(rnorm(lents),times=5),lents,5))
}
dat<-rbind(dat1,dat2)
times<-1:lents
dat<-cleandat(dat,times,clev=1)$cdat
coords<-data.frame(Y=rep(0,10),X=1:10)
method<-"coh.sig.fast"
clustobj<-clust(dat,times,coords,method,nsurrogs = 100)
res<-addwpmfs(clustobj)</pre>
```

bandtest

Aggregate significance across a timescale band

## **Description**

Computes the aggregate significance of coherence (coh) or of a wavelet linear model test object (wlmtest) across a timescale band, accounting for non-independence of timescales. Also gets the average phase across the band, in the case of coherence.

#### **Usage**

```
bandtest(object, ...)
## Default S3 method:
bandtest(object, ...)
## S3 method for class 'coh'
bandtest(object, band, ...)
## S3 method for class 'wlmtest'
bandtest(object, band, ...)
```

# Arguments

object An object of class coh or wlmtest, must have a non-NA signif slot

... Passed from the generic to specific methods. Not currently used.

A length-two numeric vector indicating a timescale band

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#### Value

bandtest returns an object of the same class as its first input but with a bandp slot added. Or if there was already a bandp slot, the output has a bandp slot with an additional row. For a coh object, the bandp slot is a data frame with four columns, the first two indicating the timescale band and the third an associated p-value for the test of coherence over that band. The fourth column is the average phase over the band. For a wlmtest object, the result is only the first three of the above columns.

## Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

#### See Also

```
coh, wlm, wlmtest, browseVignettes("wsyn")
```

## **Examples**

```
#Example for a coh object
times < -(-3:100)
ts1<-sin(2*pi*times/10)
ts2 < -5*sin(2*pi*times/3)
artsig_x<-matrix(NA,11,length(times)) #the driver</pre>
for (counter in 1:11)
 artsig_x[counter,]=ts1+ts2+rnorm(length(times),mean=0,sd=1.5)
times<-0:100
artsig_y<-matrix(NA,11,length(times)) #the driven</pre>
for (counter1 in 1:11)
 for (counter2 in 1:101)
    artsig_y[counter1,counter2]<-mean(artsig_x[counter1,counter2:(counter2+2)])</pre>
 }
}
artsig_y<-artsig_y+matrix(rnorm(length(times)*11,mean=0,sd=3),11,length(times))</pre>
artsig_x<-artsig_x[,4:104]
artsig_x<-cleandat(artsig_x,times,1)$cdat</pre>
artsig_y<-cleandat(artsig_y,times,1)$cdat</pre>
cohobj<-coh(dat1=artsig_x,dat2=artsig_y,times=times,norm="powall",sigmethod="fast",nrand=1000,
            f0=0.5,scale.max.input=28)
cohobj<-bandtest(cohobj,c(2,4))</pre>
#Example for a wlmtest object - see vignette
```

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bctrans

The one-parameter family of Box-Cox transformations

# Description

The one-parameter family of Box-Cox transformations

# Usage

```
bctrans(y, lambda)
```

# **Arguments**

y A numeric, positive values assumed

1ambda The Box-Cox parameter

# **Details**

Internal function. No error checking done. It is assumed the entries of y are positive.

#### Value

bctrans gives ((y^lambda)-1)/lambda for lambda not 0 or ln(y) for lambda equal to 0.

# Author(s)

Daniel Reuman, < reuman@ku.edu>

## References

Box, GEP and Cox, DR (1964) An analysis of transformations (with discussion). Journal of the Royal Statistical Society B, 26, 211–252.

Venables, WN and Ripley, BD (2002) Modern Applied Statistics with S. Fourth edition. Springer.

#### See Also

```
cleandat, browseVignettes("wsyn")
```

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| cleandat | Clean (spatio)temporal data matrices to make them ready for analyses using the wsyn package |
|----------|---|
|          |   |

#### **Description**

A data cleaning function for optimal Box-Cox transformation, detrending, standarizing variance, de-meaning

# Usage

```
cleandat(dat, times, clev, lambdas = seq(-10, 10, by = 0.01), mints = NA)
```

#### **Arguments**

| dat | A locations x time | data matrix, | or a time series | vector (for 1 location) |
|-----|--------------------|--------------|------------------|-------------------------|
|-----|--------------------|--------------|------------------|-------------------------|

times The times of measurement, spacing 1

clev The level of cleaning to do, 1 through 5. See details.

lambdas A vector of lambdas to test for optimal Box-Cox transformation, if Box-Cox is

performed. Ignored for clev<4. Defaults to seq(-10,10, by=0.01). See details.

mints If clev is 4 or 5, then time series are shifted to have this minimum value before

Box-Cox transformation. Default NA means use the smallest difference between

consecutive, distinct sorted values. NaN means perform no shift.

#### **Details**

NAs, Infs, etc. in dat trigger an error. If clev==1, time series are (individually) de-meaned. If clev==2, time series are (individually) linearly detrended and de-meaned. If clev==3, time series are (individually) linearly detrended and de-meaned, and variances are standardized to 1. If clev==4, an optimal Box-Cox normalization procedure is applied jointly to all time series (so the same Box-Cox transformation is applied to all time series after they are individually shifted depending on the value of mints). Transformed time series are then individually linearly detrended, de-meaned, and variances are standardized to 1. If clev==5, an optimal Box-Cox normalization procedure is applied to each time series individually (again after individually shifting according to mints), and transformed time series are then individually linearly detrended, de-meaned, and variances are standardized to 1. Constant time series and perfect linear trends trigger an error for clev>=3. If clev>=4 and the optimal lambda for one or more time series is a boundary case or if there is more than one optimal lambda, it triggers a warning. A wider range of lambda should be considered in the former case.

#### Value

cleandat returns a list containing the cleaned data, clev, and the optimal lambdas from the Box-Cox procedure (NA for clev<4, see details).

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#### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>; Lei Zhao, <lei.zhao@cau.edu.cn>

#### References

Box, GEP and Cox, DR (1964) An analysis of transformations (with discussion). Journal of the Royal Statistical Society B, 26, 211–252.

Venables, WN and Ripley, BD (2002) Modern Applied Statistics with S. Fourth edition. Springer.

Sheppard, LW, et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

#### See Also

```
wt, wmf, wpmf, coh, wlm, wlmtest, clust, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:100
dat<-rnorm(100)
res1<-cleandat(dat,times,1) #this removes the mean
res2<-cleandat(dat,times,2) #detrends and removes the mean
res3<-cleandat(dat,times,3) #variances also standardized
res4<-cleandat(dat,times,4) #also joint Box-Cox applied
res5<-cleandat(dat,times,5) #1-3, also indiv Box-Cox</pre>
```

cluseigen

Community structure detection in networks

# Description

Community structure detection in networks based on the leading eigenvector of the community matrix

## Usage

```
cluseigen(adj)
```

# **Arguments**

adj

An adjacency matrix. Should be symmetric with diagonal containing zeros.

## **Details**

The difference between this function and the algorithm described by Newman is that this function can be used on an adjacency matrix with negative elements, which is very common for correlation matrices and other measures of pairwise synchrony of time series.

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#### Value

cluseigen returns a list with one element for each of the splits performed by the clustering algorithm. Each element is a vector with entries corresponding to rows and columns of adj and indicating the module membership of the node, following the split. The last element of the list is the final clustering determined by the algorithm when its halting condition is satisfied. The first element is always a vector of all 1s (corresponding to before any splits are performed).

# Author(s)

Lei Zhao, <lei.zhao@cau.edu.cn>; Daniel Reuman, <reuman@ku.edu>

#### References

Gomez S., Jensen P. & Arenas A. (2009). Analysis of community structure in networks of correlated data. Phys Rev E, 80, 016114.

Newman M.E.J. (2006). Finding community structure in networks using the eigenvectors of matrices. Phys Rev E, 74, 036104.

Newman M.E.J. (2006) Modularity and community structure in networks. PNAS 103, 8577-8582.

# See Also

```
clust, modularity, browseVignettes("wsyn")
```

# **Examples**

```
adj<-matrix(0, 10, 10) # create a fake adjacency matrix
adj[lower.tri(adj)]<-runif(10*9/2, -1, 1)
adj<-adj+t(adj)
colnames(adj)<-letters[1:10]
z<-cluseigen(adj)</pre>
```

clust

Detection and description of clusters of synchronous locations

## **Description**

Generator function for the clust S3 class, which supports tools for detecting clusters (aka, modules, sub-networks, communities, etc.) of especially synchronous locations.

# Usage

```
clust(
  dat,
  times,
  coords,
  method,
```

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```
tsrange = c(0, Inf),
  nsurrogs = 1000,
  scale.min = 2,
  scale.max.input = NULL,
  sigma = 1.05,
  f0 = 1,
 weighted = TRUE,
  sigthresh = 0.95
)
```

#### **Arguments**

dat A locations (rows) x time (columns) matrix of measurements times The times at which measurements were made, spacing 1 A data frame containing X,Y coordinates of locations in data, with column coords

names either X and Y or lon and lat or longitude and latitude. The data frame may contain other columns with additional metainformation about the sites.

Method for synchrony calculation. See details. method

tsrange A vector containing the min and max of the focal timescale range. Defaults to all

timescales that are valid given choices for scale.min, scale.max.input, f0, sigma.

Only used for wavelet-based methods.

Number of surrogates for significance test. Defaults to 1000. Only used for nsurrogs

surrogate-based methods.

scale.min The smallest scale of fluctuation that will be examined. At least 2. Used only

for wavelet-based methods.

scale.max.input

The largest scale of fluctuation guaranteed to be examined. Only used for

wavelet-based methods.

The ratio of each time scale examined relative to the next timescale. Should be sigma

greater than 1. Only used for wavelet-based methods.

f0 The ratio of the period of fluctuation to the width of the envelope. Only used for

wavelet-based methods.

weighted If TRUE, create a weighted network. If FALSE, create a binary network using

statistical significance. Binary networks are only allowed for networks based on

significance.

sigthresh Significance threshold needed, if weighted is false, for a network link to be

realized. Typically 0.95, 0.99, or 0.999, etc. Only used if weighted is FALSE.

#### **Details**

```
The following values are valid for method: "pearson", "pearson.sig.std", "pearson.sig.fft",
"pearson.sig.aaft", "spearman", "spearman.sig.std", "spearman.sig.fft", "spearman.sig.aaft",
"kendall", "kendall.sig.std", "kendall.sig.fft", "kendall.sig.aaft", "ReXWT", "ReXWT.sig.fft",
"ReXWT.sig.aaft", "ReXWT.sig.fast", "coh", "coh.sig.fft", "coh.sig.aaft", "coh.sig.fast",
```

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"phasecoh", "phasecoh.sig.fft", and "phasecoh.sig.aaft". The first portions of these identifiers correspond to the Pearson, Spearman, and Kendall correlations, the real part of the cross-wavelet transform, the wavelet coherence, and the wavelet phase coherence. The second portions of these identifiers, when present, indicates that significance of the measure specified in the first portion of the identifies is to be used for establishing the synchrony matrix. Otherwise the value itself is used. The third part of the method identifier indicates what type of significance is used.

Significance testing is performed using standard approaches (method flag containg std; for correlation coefficients, although these are inappropriate for autocorrelated data), or surrogates generated using the Fourier (method flag containing "fft") or amplitude adjusted Fourier surrogates ("aaft"). For "coh" and "ReXWT", the fast testing algorithm of Sheppard et al. (2017) is also implemented ("fast"). That method uses implicit Fourier surrogates. The choice of wavelet coherence (method flag containing "coh") or the real part of the cross-wavelet transform (method flag containing "ReXWT") depends mainly on treatment of out-of-phase relationships. The "ReXWT" is more akin to a correlation coefficient in that strong in-phase relationships approach 1 and strong antiphase relationships approach -1. Wavelet coherence allows any phase relationship and ranges from 0 to 1. Power normalization is applied for "coh" and for "ReXWT". All significance tests are one-tailed. Synchrony matrices for significance-based methods when weighted is TRUE contain 1 minus the p-values.

Clustering is performed using the the eigenvector-based modularity method of Newman (2006).

#### Value

clust returns an object of class clust. Slots are:

dat The input times The input coords The input

methodspecs A list with elements specifying the method used, and methodological parameters

that were in the input.

adj The adjacency matrix that defines the synchrony network

clusters A list with one element for each successive split of the networks into subcompo-

nents carried out by the clustering algorithm. Each element is a vector of length equal to the number of nodes in the original network, giving cluster membership of the nodes. The first element is a vector of all 1s, corresponding to before the

first clustering split was performed.

modres A list of the same length as clusters, with each element containing the results

of calling modularity on the network split to that level.

mns Mean time series for modules. A list of the same length as clusters.

wmfs Wavelet mean fields for modules. NA when clust is first called, but addwmfs

causes this entry to be added. It is a list. See documentation for the method

addwmfs.

wpmfs Wavelet phasor mean fields for modules. NA when clust is first called, but

addwpmfs causes this entry to be added. It is a list. See documentation for the

method addwpmfs.

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#### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Daniel Reuman, <reuman@ku.edu>; Lei Zhao, <1ei.zhao@cau.edu.cn>

#### References

Walter, J. A., et al. (2017) The geography of spatial synchrony. Ecology Letters. doi: 10.1111/ele.12782

Newman M.E.J. (2006). Finding community structure in networks using the eigenvectors of matrices. Phys Rev E, 74, 036104.

Newman M.E.J. (2006) Modularity and community structure in networks. PNAS 103, 8577-8582.

#### See Also

cluseigen, modularity, addwmfs, addwpmfs,clust\_methods, synmat, plotmap, browseVignettes("wsyn")

# **Examples**

```
sig < -matrix(.8,5,5)
diag(sig)<-1
lents<-50
if (requireNamespace("mvtnorm",quietly=TRUE))
  dat1<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))</pre>
  dat2<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))</pre>
}else
  dat1<-t(matrix(rep(rnorm(lents), times=5), lents, 5))</pre>
  dat2<-t(matrix(rep(rnorm(lents), times=5), lents, 5))</pre>
dat<-rbind(dat1,dat2)</pre>
times<-1:lents
dat<-cleandat(dat,times,clev=1)$cdat
coords < -data.frame(Y=rep(0,10), X=1:10)
method<-"coh.sig.fast"
res<-clust(dat,times,coords,method,nsurrogs = 50)</pre>
#nsurrogs should be much higher for a real application
```

clust\_methods

Basic methods for the clust class

## **Description**

Set, get, summary, and print methods for the clust class.

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## Usage

```
## S3 method for class 'clust'
summary(object, ...)
## S3 method for class 'clust'
print(x, ...)
## S3 method for class 'clust'
set_times(obj, newval)
## S3 method for class 'clust'
set_adj(obj, newval)
## S3 method for class 'clust'
set_clusters(obj, newval)
## S3 method for class 'clust'
set_modres(obj, newval)
## S3 method for class 'clust'
set_mns(obj, newval)
## S3 method for class 'clust'
set_dat(obj, newval)
## S3 method for class 'clust'
set_coords(obj, newval)
## S3 method for class 'clust'
set_methodspecs(obj, newval)
## S3 method for class 'clust'
set_wmfs(obj, newval)
## S3 method for class 'clust'
set_wpmfs(obj, newval)
## S3 method for class 'clust'
get_times(obj)
## S3 method for class 'clust'
get_adj(obj)
## S3 method for class 'clust'
get_clusters(obj)
## S3 method for class 'clust'
get_modres(obj)
```

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```
## S3 method for class 'clust'
get_mns(obj)

## S3 method for class 'clust'
get_dat(obj)

## S3 method for class 'clust'
get_coords(obj)

## S3 method for class 'clust'
get_methodspec(obj)

## S3 method for class 'clust'
get_wmfs(obj)

## S3 method for class 'clust'
get_wpmfs(obj)
```

## **Arguments**

object, x, obj An object of class clust

... Not currently used. Included for argument consistency with existing generics.

newval A new value, for the set\_\* methods

## Value

summary.clust produces a summary of a clust object. A print.clust method is also available. For clust objects, set\_\* and get\_\* methods are available for all slots (see the documentation for clust for a list). The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a clust object.

# Author(s)

Daniel Reuman, <reuman@ku.edu>

# See Also

clust

# **Examples**

```
sig<-matrix(.8,5,5)
diag(sig)<-1
lents<-50
if (requireNamespace("mvtnorm",quietly=TRUE))
{
   dat1<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))
   dat2<-t(mvtnorm::rmvnorm(lents,mean=rep(0,5),sigma=sig))
}else</pre>
```

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```
{
  dat1<-t(matrix(rep(rnorm(lents),times=5),lents,5))
  dat2<-t(matrix(rep(rnorm(lents),times=5),lents,5))
}
dat<-rbind(dat1,dat2)
times<-1:lents
dat<-cleandat(dat,times,clev=1)$cdat
coords<-data.frame(Y=rep(0,10),X=1:10)
method<-"coh.sig.fast"
h<-clust(dat,times,coords,method,nsurrogs = 50)
#nsurrogs should be much higher for a real application
get_times(h)
summary(h)
print(h)</pre>
```

coh

Coherence

# Description

Wavelet coherence and wavelet phase coherence, spatial or for single time series. Also the generator function for the coh class, which inherits from the list class.

# Usage

```
coh(
  dat1,
  dat2,
  times,
  norm,
  sigmethod = "none",
  nrand = 1000,
  scale.min = 2,
  scale.max.input = NULL,
  sigma = 1.05,
  f0 = 1
)
```

## **Arguments**

| dat1  | A locations (rows) x time (columns) matrix (for spatial coherence), or a single time series   |
|-------|---|
| dat2  | Same format as dat1, same locations and times   |
| times | The times at which measurements were made, spacing 1  |
| norm  | The normalization of wavelet transforms to use. Controls the version of the coherence that is performed. One of "none", "phase", "powall", "powind". See details. |

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sigmethod The method for significance testing. One of "none", "fftsurrog1", "fftsurrog2",

"fftsurrog12", "aaftsurrog1", "aaftsurrog2", "aaftsurrog12", "fast". See details.

nrand Number of surrogate randomizations to use for significance testing.

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input

The largest scale of fluctuation guaranteed to be examined

sigma The ratio of each time scale examined relative to the next timescale. Should be

greater than 1.

The ratio of the period of fluctuation to the width of the envelope

#### **Details**

If the dimensions of dat1 and dat2 are N by T (N is 1 for vector dat1 and dat2), and if the wavelet transform of the nth row of dati is denoted  $W_{i,n,\sigma}(t)$ , then the coherence is the average, over all locations n and times t for which wavelet transforms are available, of the quantity  $w_{1,n,\sigma}(t)w_{2,n,\sigma}(t)^*$ , where the \* represents complex conjugation and  $w_{i,n,\sigma}(t)$  is a normalization of the wavelet transform. The normalization used depends on norm. If norm is "none" then raw wavelet transforms are used. If norm is "phase" then  $w_{i,n,\sigma}(t) = W_{i,n,\sigma}(t)/|W_{i,n,\sigma}(t)|$ , which gives the wavelet phase coherence, or the spatial wavelet phase coherence if N>1. If norm is "powall" then the normalization is that descibed in the "Wavelet mean field" section of the Methods of Sheppard et al. (2016), giving the version of the coherence that was there called simply the wavelet coherence, or the spatial wavelet coherence if N>1. If norm is "powind", then  $w_{i,n,\sigma}(t)$  is obtained by dividing  $W_{i,n,\sigma}(t)$  by the square root of the average of  $W_{i,n,\sigma}(t)W_{i,n,\sigma}(t)^*$  over the times for which it is defined; this is done separately for each i and n.

The slot signif is NA if sigmethod is "none". Otherwise, and if sigmethod is not "fast", then signif\$coher is the same as coher, and signif\$scoher is a matrix of dimensions nrand by length(coher) with rows with magnitudes equal to coherences of surrogate datasets, computed using the normalization specified by norm. The type of surrogate used (Fourier surrogates or amplitude adjusted Fourier surrogates, see surrog), as well as which of the datasets surrogates are computed on (dat1, dat2, or both) is determined by sigmethod. The first part of the value of sigmethod specifies the type of surrogate used, and the numbers in the second part (1, 2, or 12) specify whether surrogates are applied to dat1, dat2, or both, respectively. Synchrony-preserving surrogates are used. A variety of statements of significance (or lack thereof) can be made by comparing signif\$coher with signif\$scoher (see the plotmag, plotrank, and bandtest methods for the coh class). If sigmethod is "fast", the fast algorithm of Sheppard et al. (2017) is used. In that case signif\$coher can be compared to signif\$scoher to make significance statements about the coherence in exactly the same way, but signif\$coher will no longer precisely equal coher, and coher should not be compared directly to signif\$scoher. Statements about significance of the coherence should be made using signif\$coher and signif\$scoher, whereas coher should be used whenever the actual value of the coherence is needed. No fast algorithm exists for norm equal to "phase" (the phase coherence; Sheppard et al, 2017), so if norm is "phase" and sigmethod is "fast", the function throws an error.

The slots ranks and bandp are empty on an initial call to coh. They are made to compute and hold aggregate significance results over any timescale band of choice. These are filled in when needed by other methods, see plotrank and bandtest.

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Regardless of what the variables represent, the normalized transform of dat1 is multiplied by the conjugate of the normalized transform of dat2. Thus, a positive phase of the coherence indicates dat1 would be leading dat2.

#### Value

coh returns an object of class coh. Slots are:

The input data dat1, dat2 times The times associated with the data sigmethod The method for significance testing, as inputted. The normalization of the wavelet transforms that will be used in computing the norm coherence. Different values result in different versions of the coherence. One of "none", "phase", "powall", "powind". See details. wtopt The inputted wavelet transform options scale.min, scale.max.input, sigma, f0 in timescales The timescales associated with the coherence coher The complex magnitude of this quantity is the coherence, calculated in the usual way (which depends on norm, see details), and with scalloping of the transforms. signif A list with information from the significance testing. Elements are coher and scoher. See details. ranks A list with ranking information for signif. NA until plotrank is called, see documentation for plotrank. bandp A data frame containing results of computing significances of the coherence across timescale bands. Empty on an initial call to coh, filled in by the function bandtest. See details.

# Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

## References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Sheppard, L.W., et al. (2017) Rapid surrogate testing of wavelet coherences. European Physical Journal, Nonlinear and Biomedical Physics, 5, 1. DOI: 10.1051/epjnbp/2017000

#### See Also

cleandat, coh\_methods, bandtest, plotmag, plotphase, plotrank, browseVignettes("wsyn")

coh\_methods

## **Examples**

```
times<-1:100
dat1<-matrix(rnorm(1000),10,100)
dat2<-matrix(rnorm(1000),10,100)
dat1<-cleandat(dat1,times,1)$cdat
dat2<-cleandat(dat2,times,1)$cdat
norm<-"powall"
sigmethod<-"fast"
nrand<-10
res<-coh(dat1,dat2,times,norm,sigmethod,nrand)
#for real applications, use a much bigger nrand</pre>
```

coh\_methods

Basic methods for the coh class

# Description

Set, get, summary, and print methods for the coh class.

## Usage

```
## S3 method for class 'coh'
summary(object, ...)
## S3 method for class 'coh'
print(x, ...)
## S3 method for class 'coh'
set_times(obj, newval)
## S3 method for class 'coh'
set_timescales(obj, newval)
## S3 method for class 'coh'
set_coher(obj, newval)
## S3 method for class 'coh'
set_dat1(obj, newval)
## S3 method for class 'coh'
set_dat2(obj, newval)
## S3 method for class 'coh'
set_wtopt(obj, newval)
## S3 method for class 'coh'
```

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```
set_norm(obj, newval)
## S3 method for class 'coh'
set_sigmethod(obj, newval)
## S3 method for class 'coh'
set_signif(obj, newval)
## S3 method for class 'coh'
set_ranks(obj, newval)
## S3 method for class 'coh'
set_bandp(obj, newval)
## S3 method for class 'coh'
get_times(obj)
## S3 method for class 'coh'
get_timescales(obj)
## S3 method for class 'coh'
get_coher(obj)
## S3 method for class 'coh'
get_dat1(obj)
## S3 method for class 'coh'
get_dat2(obj)
## S3 method for class 'coh'
get_wtopt(obj)
## S3 method for class 'coh'
get_norm(obj)
## S3 method for class 'coh'
get_sigmethod(obj)
## S3 method for class 'coh'
get_signif(obj)
## S3 method for class 'coh'
get_ranks(obj)
## S3 method for class 'coh'
get_bandp(obj)
```

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# **Arguments**

```
object, x, obj An object of class coh

Not currently used. Included for argument consistency with existing generics.

A new value, for the set_* methods
```

#### Value

summary.coh produces a summary of a coh object. A print.coh method is also available. For coh objects, set\_\* and get\_\* methods are available for all slots (see the documentation for coh for a list). The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a coh object.

## Author(s)

Daniel Reuman, <reuman@ku.edu>

## See Also

coh

## **Examples**

```
times<-1:100
dat1<-matrix(rnorm(1000),10,100)
dat2<-matrix(rnorm(1000),10,100)
dat1<-cleandat(dat1,times,1)$cdat
dat2<-cleandat(dat2,times,1)$cdat
norm<-"powall"
sigmethod<-"fast"
nrand<-10
h<-coh(dat1,dat2,times,norm,sigmethod,nrand)
get_times(h)
summary(h)
print(h)</pre>
```

errcheck\_stdat

Error check for appropriate spatio-temporal data

# Description

Error checking whether a times vector and a matrix with each row a time series make a legitimate spatio-temporal data set for wavelet analysis

## Usage

```
errcheck_stdat(times, dat, callfunc)
```

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## **Arguments**

times the times of measurement, spacing 1

dat each row is a time series - must have at least two rows

callfunc the function calling this one, for error tracking

## Value

errcheck\_stdat returns nothing but throws and error if inputs not appropriate

# Author(s)

Daniel Reuman, < reuman@ku.edu>

errcheck\_times

Error check times

# **Description**

Error check whether a vector can represent times at which data suitable for wavelet transforms were measured

# Usage

```
errcheck_times(times, callfunc)
```

# **Arguments**

times Tests whether this is a numeric vector with unit-spaced increasing values

callfunc Function calling this one, for better error messaging

# Value

errcheck\_times returns nothing but throws and error if the conditions are not met

# Author(s)

Daniel Reuman, <reuman@ku.edu>

24 errcheck\_tts

## **Description**

Error checking whether a times vector and t.series vector make a legitimate time series for wavelet analysis

## Usage

```
errcheck_tsdat(times, t.series, callfunc)
```

## **Arguments**

times times of measurement, spacing 1

t.series the measurements

callfunc the function from which this one was called, for error tracking

# Value

errcheck\_tsdat returns nothing but throws and error if inputs not appropriate

# Author(s)

Daniel Reuman, <reuman@ku.edu>

errcheck\_tts

Error check whether inputs are suitable for a tts object

# **Description**

Error check whether inputs are suitable for a tts object

## Usage

```
errcheck_tts(times, timescales, values, callfunc)
```

# **Arguments**

times times of measurement, spacing 1

timescales timescales of analysis

values a times by timescales matrix

callfunc the function from which this one was called, for error tracking

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# Value

errcheck\_tts returns nothing but throws and error if inputs not appropriate

# Author(s)

Daniel Reuman, < reuman@ku.edu>

errcheck\_wavparam

Error check wavelet transform parameters

# **Description**

Error check the parameters scale.min, scale.max.input, sigma, f0

# Usage

```
errcheck_wavparam(scale.min, scale.max.input, sigma, f0, times, callfunc)
```

## **Arguments**

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input

The largest scale of fluctuation that is guaranteed to be examined

sigma The ratio of each time scale examined relative to the next timescale. Should be

greater than 1.

The ratio of the period of fluctuation to the width of the envelope. Defaults to 1.

times The times data were measured at, spacing 1

callfunc Function calling this one, for better error messaging

## Value

errcheck\_wavparam returns nothing but throws and error if the conditions are not met

#### Author(s)

Daniel Reuman, < reuman@ku.edu>

26 fastcohtest

| fastcohtest | Fast algorithm for significance testing coherence using Fourier surro- |
|-------------|--|
|             | gates  |

## **Description**

This is the algorithm of Sheppard et al. (2017) (see references).

# Usage

```
fastcohtest(
  dat1,
  dat2,
  scale.min,
  scale.max.input,
  sigma,
  f0,
  nrand,
  randnums,
  randbits,
  norm
)
```

## **Arguments**

| dat1 . | A locations (rows | s) x time (colum | ns) matrix (for spatia | l coherence), or a single |
|--------|-------------------|------------------|------------------------|---------------------------|
|--------|-------------------|------------------|------------------------|---------------------------|

time series

dat2 Same format as dat1, same locations and times

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input

The largest scale of fluctuation guaranteed to be examined

sigma The ratio of each time scale examined relative to the next timescale. Should be

greater than 1.

The ratio of the period of fluctuation to the width of the envelope

nrand Number of surrogate randomizations to use for significance testing

randnums A bunch of independent random numbers uniformly distributed on (0,1). There

must be nrand\*floor((dim(dat1)[2]-1)/2) of these.

randbits A bunch of random bits (0 or 1). There must be nrand of these if time series are

of odd length and 2\*nrand if even length. You may pass more than this, so, in

particular, you may pass 2\*nrand for even or odd length.

norm The normalization of wavelet transforms to use. Controls the version of the

coherence that is performed. One of "none", "powall", "powind". See details in

the documentation of coh.

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## Value

fastcohtest returns a list with these elements:

timescales The timescales used

coher The magnitude of this is the fast-algorithm version of the coherence between the

two datasets, for comparison with scoher

scoher A matrix with nrand rows, the magnitude of each one is the fast-algorithm ver-

sion of the coherence for a surrogate

## Note

Internal function, minimal error checking.

## Author(s)

Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2017) Rapid surrogate testing of wavelet coherences. European Physical Journal, Nonlinear and Biomedical Physics, 5, 1. DOI: 10.1051/epjnbp/2017000

| fftsurrog | Surrogate time series using Fourier surrogates |
|-----------|--|
|           |  |

# **Description**

Creates surrogate time series using Fourier surrogates

## Usage

```
fftsurrog(dat, nsurrogs, syncpres)
```

# **Arguments**

dat A locations x time matrix of observations nsurrogs The number of surrogates to produce

syncpres Logical. TRUE for "synchrony preserving" surrogates (same phase randomiza-

tions used for all time series). FALSE leads to independent phase randomiza-

tions for all time series.

## Value

fftsurrog returns a list of nsurrogs surrogate datasets

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#### Note

For internal use, no error checking

#### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, LW, et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Schreiber, T and Schmitz, A (2000) Surrogate time series. Physica D 142, 346-382.

Prichard, D and Theiler, J (1994) Generating surrogate data for time series with several simultaneously measured variables. Physical Review Letters 73, 951-954.

is.connected

Tests if a graph is connected

# **Description**

Tests if a graph represented by an adjacency matrix is connected.

## Usage

```
is.connected(adj)
```

# Arguments

adj

An adjacency matrix. Must be a numeric matrix with non-negative entries.

## **Details**

Idea by Ed Scheinerman, circa 2006. Source: http://www.ams.jhu.edu/~ers/matgraph/; routine: matgraph/@graph/isconnected.m

# Value

is.connected returns TRUE or FALSE depending on whether the graph represented in adj is a connected graph.

#### Author(s)

```
Lei Zhao, <lei.zhao@cau.edu.cn>
```

## See Also

```
cluseigen, clust, browseVignettes("wsyn")
```

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# **Examples**

```
 \begin{split} &\text{g1}<-\text{matrix}(c(\emptyset,\emptyset,0,1,1,\emptyset,\emptyset,\emptyset,0,1,\emptyset,\emptyset,\emptyset,1,\emptyset),4,4) \\ &\text{is.connected(g1)} \\ &\text{g2}<-\text{matrix}(c(\emptyset,1,\emptyset,\emptyset,1,\emptyset,\emptyset,\emptyset,0,0,0,1,\emptyset,0,1,\emptyset),4,4) \\ &\text{is.connected(g2)} \end{split}
```

makeunweighted

For converting certain synchrony matrices to unweighted versions

# Description

Convenience function for converting certain synchrony matrices to unweighted versions

# Usage

```
makeunweighted(mat, sigthresh)
```

# **Arguments**

mat A synchrony matrix based on significance testing

sigthresh Significance threshold to use

# Value

makeunweighted converts to an unweighted version of the input. Entries of mat less than sigthresh become a 1, other entries become a 0. The diagonal is NA.

# Note

Internal function, no error checking

## Author(s)

Lei Zhao, <lei.zhao@cau.edu.cn>, Daniel Reuman <reuman@ku.edu>

30 modularity

mnphase

Mean phase of coherence

# **Description**

Gets the mean phase of a bunch of complex numbers

## Usage

mnphase(nums)

## **Arguments**

nums

A vector of complex numbers

#### Value

mnphase returns the mean phase

## Note

Internal funcion, no error catching

# Author(s)

Daniel Reuman, < reuman@ku.edu>

modularity

Modularity of a community structure of a graph

## **Description**

Computes the modularity of partitioning of a graph into sub-graphs. Similar to the modularity function in the igraph package, but allows negative edge weights.

## Usage

```
modularity(adj, membership, decomp = FALSE)
```

## Arguments

adj An adjacency matrix, which should be symmetric with zeros on the diagonal.

membership Vector of length equal to the number of graph nodes (columns/rows of adj)

indicating the cluster/sub-graph each nodes belongs to.

decomp Logical. If TRUE, calculate the decomposition of modularity by modules and

nodes. Default FALSE.

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#### **Details**

The difference between this function and the function modularity in the package igraph is that this function can be used with an adjacency matrix with negative elements. This is a common case for matrices arrising from a for correlation matrix or another synchrony matrix. If the matrix is non-negative, the result of this function should be exactly the same as the result from modularity in the igraph package.

#### Value

modularity returns a list containing the following:

| totQ  | The total modularity. This is the only output if decomp=FALSE |
|-------|---|
| modQ  | The contribution of each module to the total modularity       |
| node0 | The contribution of each node to the total modularity         |

## Note

Adapted from code developed by Robert J. Fletcher, Jr.

#### Author(s)

Jonathan Walter, <jonathan.walter@ku.edu>; Lei Zhao, <lei.zhao@cau.edu.cn>; Daniel Reuman, <reuman@ku.edu>

#### References

Fletcher Jr., R.J., et al. (2013) Network modularity reveals critical scales for connectivity in ecology and evolution. Nature Communications. doi: 10.1038//ncomms3572.

Gomez S., Jensen P. & Arenas A. (2009). Analysis of community structure in networks of correlated data. Phys Rev E, 80, 016114.

Newman M.E. (2006). Finding community structure in networks using the eigenvectors of matrices. Phys Rev E, 74, 036104.

#### See Also

```
clust, cluseigen, browseVignettes("wsyn")
```

# **Examples**

```
adj<-matrix(0, 10, 10) # create a fake adjacency matrix
adj[lower.tri(adj)]<-runif(10*9/2, -1, 1)
adj<-adj+t(adj)
colnames(adj)<-letters[1:10]
m<-cluseigen(adj)
z<-modularity(adj, m[[length(m)]], decomp=TRUE)</pre>
```

| normforcoh | Normalization for the coh function |
|------------|------------------------------------|
|            |                                    |

# Description

A convenience function for performing the normalization step for the coh function.

# Usage

```
normforcoh(W, norm)
```

# **Arguments**

An array of wavelet transforms, locations by times by timescales

norm The normalization of wavelet transforms to use. Controls the version of the

coherence that is performed. One of "none", "phase", "powall", "powind". See

details section of the documentation for coh.

#### Value

normforcoh returns an array the same dimensions as W of normalized transforms

## Note

Internal function, no error checking

## Author(s)

Daniel Reuman, < reuman@ku.edu>

plotmag For plotting the magnitude of values in tts, coh and wlmtest objects

# **Description**

For plotting the magnitude of values in tts objects (and derived classes) against time and timescale, and coh and wlmtest objects against timescale

# Usage

```
plotmag(object, ...)
## S3 method for class 'tts'
plotmag(
 object,
  zlims = NULL,
  neat = TRUE,
  colorfill = NULL,
  colorbar = TRUE,
  title = NULL,
  filename = NA,
)
## S3 method for class 'wt'
plotmag(
 object,
 zlims = NULL,
 neat = TRUE,
  colorfill = NULL,
  colorbar = TRUE,
  title = NULL,
  filename = NA,
)
## S3 method for class 'wmf'
plotmag(
 object,
 zlims = NULL,
 neat = TRUE,
 colorfill = NULL,
  colorbar = TRUE,
  title = NULL,
 filename = NA,
)
## S3 method for class 'wpmf'
plotmag(
  object,
  zlims = NULL,
 neat = TRUE,
  colorfill = NULL,
  sigthresh = 0.95,
  colorbar = TRUE,
  title = NULL,
```

```
filename = NA,
)
## S3 method for class 'coh'
plotmag(
 object,
  sigthresh = c(0.95, 0.99),
 bandprows = "all",
 filename = NA,
)
## S3 method for class 'wlmtest'
plotmag(
 object,
  sigthresh = c(0.95, 0.99),
 bandprows = "all",
  filename = NA,
)
## Default S3 method:
plotmag(object, ...)
```

# Arguments

bandprows

| object    | An object of class tts or some class that inherits from tts or of class coh or wlmtest   |
|-----------|--|
| •••       | Additional graphics parameters passed to image (graphics package) if colorbar==FALSE, or to image.plot (fields package) if colorbar==TRUE (for tts objects)  |
| zlims     | z axis limits. If specified, must encompass the range of Mod(get_values(object)). Default NULL uses this range.  |
| neat      | Logical. Should timescales with no values be trimmed?  |
| colorfill | Color spectrum to use, set through colorRampPalette. Default value NULL produces jet colors from Matlab.   |
| colorbar  | Logical. Should a colorbar legend be plotted?  |
| title     | Title for the top of the plot.   |
| filename  | Filename (without extension), for saving as pdf. Default value NA saves no file and uses the default graphics device.  |
| sigthresh | Significance threshold(s). Numeric vector with values between 0 and 1. Typically 0.95, 0.99, 0.999, etc. For wpmf objects, contours are plotted at these values; for coh and wlmtest objects the threshholds are plotted on coherence plots. |

The rows of object\$bandp for which to display results in coh plots

#### **Details**

For coh (respectively, wlmtest) objects, the modulus of object\$coher (respectively, object\$wlmobj\$coher) is plotted using a solid red line, and the modulus of object\$signif\$coher is plotted using a dashed red line. The two coherences agree except for sigmethod="fast", for which they are close. The dashed line is what should be compared to the distribution of surrogate coherences (black lines, which only appear for coh objects if signif is not NA). Horizontal axis ticks are labeled as timescales, but are spaced on the axis as log(1/timescale), i.e., log frequencies.

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

#### See Also

```
tts, wt, wmf, wpmf, coh, wlmtest, plotphase, bandtest, plotrank, browseVignettes("wsyn")
```

## **Examples**

```
#For a wt object
time1<-1:100
time2<-101:200
ts1p1 < -sin(2*pi*time1/15)
ts1p2 < -0 * time1
ts2p1 < -0 * time2
ts2p2 < -sin(2*pi*time2/8)
ts1<-ts1p1+ts1p2
ts2<-ts2p1+ts2p2
ts < -c(ts1, ts2)
ra<-rnorm(200, mean=0, sd=0.5)
t.series<-ts+ra
t.series<-t.series-mean(t.series)</pre>
times<-c(time1,time2)</pre>
res<-wt(t.series, times)</pre>
plotmag(res)
#For a wmf object
x1<-0:50
x2<-51:100
x < -c(x1, x2)
ts1<-c(sin(2*pi*x1/10),sin(2*pi*x2/5))+1.1
dat<-matrix(NA,11,length(x))</pre>
```

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```
for (counter in 1:dim(dat)[1])
{
   ts2<-3*sin(2*pi*x/3+2*pi*runif(1))+3.1
   ts3<-rnorm(length(x),0,1.5)
   dat[counter,]<-ts1+ts2+ts3
   dat[counter,]<-dat[counter,]-mean(dat[counter,])
}
times<-x
res<-wmf(dat,times)
plotmag(res)
#similar calls for wpmf, coh, wlm, wlmtest objects
#see documentation</pre>
```

plotmap

Map clusters from a clust object

# **Description**

Produces a map of the locations of sampling for a clust object, with colors indicating module (cluster) identity. The sizes of nodes (locations) are scaled according to the strength of membership in its module.

## Usage

```
plotmap(
  inclust,
  spltlvl = length(inclust$clusters),
  nodesize = c(1, 3),
  filename = NA
)
```

## Arguments

inclust A clust object, as created with wsyn::clust

spltlvl The split level in the clustering to use. This is the index of inclust\$clusters.

Default the final split.

nodesize A length = 2 vector giving the minimum and maximum node size for plotting.

Defaults to c(1,3).

filename a filename, possibly including path info, but without a file extension. If present,

exports the plot as a .pdf using the specified filename. Default NA uses the default

plotting device.

## Value

plotmap produces a map.

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### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>

#### References

Walter, J. A., et al. (2017) The geography of spatial synchrony. Ecology Letters. doi: 10.1111/ele.12782

### See Also

```
clust, browseVignettes("wsyn")
```

### **Examples**

```
Tmax<-500
tim<-1:Tmax
ts1 < -sin(2*pi*tim/5)
ts1s<-sin(2*pi*tim/5+pi/2)
ts2<-sin(2*pi*tim/12)
ts2s < -sin(2*pi*tim/12+pi/2)
gp1A<-1:2
gp1B<-3:4
gp2A<-5:6
gp2B<-7:8
d<-matrix(NA,Tmax,8)</pre>
d[,c(gp1A,gp1B)]<-ts1
d[,c(gp2A,gp2B)]<-ts1s
d[,c(gp1A,gp2A)] < -d[,c(gp1A,gp2A)] + matrix(ts2,Tmax,4)
d[,c(gp1B,gp2B)] < -d[,c(gp1B,gp2B)] + matrix(ts2s,Tmax,4)
d<-d+matrix(rnorm(Tmax*8,0,2),Tmax,8)</pre>
d < -t(d)
d<-cleandat(d,1:Tmax,1)$cdat</pre>
\verb|coords| < - \texttt{data.frame}(X = \texttt{c}(\texttt{rep}(1,4),\texttt{rep}(2,4)), Y = \texttt{rep}(\texttt{c}(1:2,4:5),\texttt{times} = 2))|
cl5<-clust(dat=d,times=1:Tmax,coords=coords,method="ReXWT",tsrange=c(4,6))</pre>
plotmap(cl5)
cl12<-clust(dat=d,times=1:Tmax,coords=coords,method="ReXWT",tsrange=c(11,13))</pre>
plotmap(cl12)
```

plotphase

For plotting the phases of values in tts and coh objects

### **Description**

For plotting the phases of values in tts objects (and derived classes) against time and timescale, and coh objects against timescale

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#### Usage

```
plotphase(object, ...)
## S3 method for class 'tts'
plotphase(object, filename = NA, ...)
## S3 method for class 'wt'
plotphase(object, filename = NA, ...)
## S3 method for class 'wmf'
plotphase(object, filename = NA, ...)
## S3 method for class 'wpmf'
plotphase(object, filename = NA, ...)
## S3 method for class 'coh'
plotphase(object, bandprows = "all", filename = NA, ...)
## Default S3 method:
plotphase(object, ...)
```

### **Arguments**

object A coh object.

... Passed from the generic to specific methods. The plotphase.tss method passes it

to fields::image.plot.

filename (without extension), for saving as pdf. Default value NA saves no file

and uses the default graphics device.

bandprows The rows of object\$bandp for which to display p-value results in the plot

### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

#### See Also

```
tts, wt, wmf, wpmf, coh, plotmag, plotrank, browseVignettes("wsyn")
```

# **Examples**

```
#For a tts object times<-1:100
```

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```
timescales<-1:100
cplx<-complex(modulus=1,argument=seq(from=-pi,to=pi,length.out=100))</pre>
values1<-matrix(cplx,length(times),length(timescales))</pre>
tts1<-tts(times,timescales,values1)
plotphase(tts1)
#For a coh oject
times < -(-3:100)
ts1<-sin(2*pi*times/10)
ts2 < -5*sin(2*pi*times/3)
artsig_x<-matrix(NA,11,length(times)) #the driver</pre>
for (counter in 1:11)
{
     artsig_x[counter,]=ts1+ts2+rnorm(length(times),mean=0,sd=1.5)
}
times<-0:100
artsig\_y < -matrix(NA, 11, length(times)) #the driven
for (counter1 in 1:11)
{
     for (counter2 in 1:101)
     {
           artsig_y[counter1,counter2]<-mean(artsig_x[counter1,counter2:(counter2+2)])</pre>
     }
}
artsig_y<-artsig_y+matrix(rnorm(length(times)*11,mean=0,sd=3),11,length(times))</pre>
artsig_x<-artsig_x[,4:104]</pre>
artsig_x<-cleandat(artsig_x,times,1)$cdat
artsig_y<-cleandat(artsig_y,times,1)$cdat</pre>
res < -coh(dat1 = artsig\_x, dat2 = artsig\_y, times = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm = "powall", sigmethod = "fast", nrand = 50, artsig_v = times, norm =
                           f0=0.5,scale.max.input=28)
res<-bandtest(res,c(2,4))</pre>
res<-bandtest(res,c(4,30))</pre>
res<-bandtest(res,c(8,12))
plotphase(res)
```

plotrank

Plots ranks slot for coh and wlmtest objects

### **Description**

Plots the ranks slot for coh and wlmtest objects to help identify statistical significance of coherence

# Usage

```
plotrank(object, ...)
## S3 method for class 'coh'
plotrank(object, sigthresh = 0.95, bandprows = "all", filename = NA, ...)
```

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```
## S3 method for class 'wlmtest'
plotrank(object, sigthresh = 0.95, bandprows = "all", filename = NA, ...)
## Default S3 method:
plotrank(object, ...)
```

#### **Arguments**

object A coh or wlmtest object. Must have a non-NA signif slot.

... Passed from the generic to specific methods. Not currently used.

sigthresh Significance threshold(s). Numeric vector with values between 0 and 1. Typ-

ically 0.95, 0.99, 0.999, etc. The threshhold(s) are plotted on the rank plot as

dashed horizontal line(s).

bandprows The rows of object\$bandp for which to display p-value results in the plot

filename Filename (without extension), for saving as pdf. Default value NA saves no file

and uses the default graphics device.

#### **Details**

The plot shows the modulus of object\$ranks\$coher versus log(1/object\$timescales). Horizontal axis ticks are labeled as timescales, but are spaced on the axis as log(1/timescale), i.e., log frequencies. p-values from object\$bandp are displayed above the rank plot.

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

#### See Also

```
coh, wlmtest, bandtest, plotphase, plotmag, browseVignettes("wsyn")
```

### **Examples**

```
#For a coh object
times<-(-3:100)
ts1<-sin(2*pi*times/10)
ts2<-5*sin(2*pi*times/3)
artsig_x<-matrix(NA,11,length(times)) #the driver
for (counter in 1:11)
{</pre>
```

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```
artsig_x[counter,]=ts1+ts2+rnorm(length(times),mean=0,sd=1.5)
}
times<-0:100
artsig_y<-matrix(NA,11,length(times)) #the driven</pre>
for (counter1 in 1:11)
 for (counter2 in 1:101)
 {
   artsig_y[counter1,counter2]<-mean(artsig_x[counter1,counter2:(counter2+2)])</pre>
}
artsig_y<-artsig_y+matrix(rnorm(length(times)*11,mean=0,sd=3),11,length(times))</pre>
artsig_x<-artsig_x[,4:104]</pre>
artsig_x<-cleandat(artsig_x,times,1)$cdat
artsig_y<-cleandat(artsig_y,times,1)$cdat</pre>
res<-coh(dat1=artsig_x,dat2=artsig_y,times=times,norm="powall",sigmethod="fast",
nrand=100,f0=0.5,scale.max.input=28)
#use larger nrand for a real application
res<-bandtest(res,c(2,4))</pre>
res<-bandtest(res,c(8,12))
plotrank(res)
#For a wlmtest object, see vignette
```

power

Power of a tts object

# **Description**

Returns the power of a tts object, i.e., the mean over time of the squared magnitude (which is a function of timescale)

### Usage

```
power(object)
## S3 method for class 'tts'
power(object)
```

# Arguments

object A tts object

#### Value

power returns a data frame with columns timescales and power

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### Author(s)

Daniel Reuman, < reuman@ku.edu>

#### See Also

```
tts, wt, wmf, wpmf, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:10
timescales<-1:10
values<-matrix(rep(complex(modulus=1,argument=2*pi*c(0:9)/10),times=10),10,10)
ttsobj<-tts(times,timescales,values)
res<-power(ttsobj)</pre>
```

predsync

Predicted synchrony of a wavelet linear model

# Description

Predicted synchrony of a wlm object. This is described in the first paragraph of Appendix S15 of Sheppard et al (2019).

# Usage

```
predsync(wlmobj)
## S3 method for class 'wlm'
predsync(wlmobj)
```

# **Arguments**

wlmobj

A wlm object

#### Value

predsync returns a tts object. Plotting the magnitude (see plotmag) displays a picture of predicted synchrony versus time and timescale that is comparable with the wavelet mean field (see wmf) of the response variable of the model. Calling the power function on that tts object should give the same results as one of the columns of output of syncexpl. Only norm="powall" implemented so far.

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

print.summary\_wsyn 43

### References

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

#### See Also

```
wlm, tts, plotmag, wmf, power, syncexpl, browseVignettes("wsyn")
```

### **Examples**

```
times < -(-3:100)
ts1 < -sin(2*pi*times/10)
ts2 < -5*sin(2*pi*times/3)
artsig_x<-matrix(NA,11,length(times)) #the driver</pre>
for (counter in 1:11)
  artsig_x[counter,]<-ts1+ts2+rnorm(length(times),mean=0,sd=.5)</pre>
times<-0:100
artsig_y<-matrix(NA,11,length(times)) #the driven</pre>
for (counter1 in 1:11)
  for (counter2 in 1:101)
    artsig_y[counter1,counter2]<-mean(artsig_x[counter1,counter2:(counter2+2)])</pre>
  }
}
artsig_y<-artsig_y+matrix(rnorm(length(times)*11, mean=0, sd=1),11,length(times))</pre>
artsig_x<-artsig_x[,4:104]</pre>
artsig_i<-matrix(rnorm(11*length(times)),11,length(times)) #the irrelevant</pre>
artsig_x<-cleandat(artsig_x,times,1)$cdat</pre>
artsig_y<-cleandat(artsig_y, times, 1)$cdat</pre>
artsig_i<-cleandat(artsig_i,times,1)$cdat</pre>
dat<-list(driven=artsig_y,driver=artsig_x,irrelevant=artsig_i)</pre>
resp<-1
pred<-2:3
norm<-"powall"
wlmobj<-wlm(dat,times,resp,pred,norm)</pre>
res<-predsync(wlmobj)</pre>
```

print.summary\_wsyn

Print method for summary\_wsyn class

### **Description**

Print method for summary\_wsyn class

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### Usage

```
## S3 method for class 'summary_wsyn'
print(x, ...)
```

### **Arguments**

x A summary\_wsyn object

... Not currently used. Included for argument consistency with existing generics.

### Value

print.summary\_wsyn is called for its effect of printing to the screen.

### Author(s)

Daniel Reuman, <reuman@ku.edu>

# See Also

tts\_methods, wt\_methods, wmf\_methods, wpmf\_methods, coh\_methods, wlm\_methods, wlmtest\_methods, clust\_methods, browseVignettes("wsyn")

### **Examples**

```
times<-1:10
timescales<-1/c(1:10)
values<-matrix(1,length(times),length(timescales))
h<-tts(times,timescales,values)
print(summary(h))</pre>
```

setmints

Shifts a vector according to the argument mints

# **Description**

Shifts a vector according to the argument mints

# Usage

```
setmints(ts, mints)
```

### **Arguments**

ts

A vector of numeric values representing a time series

mints

The time series is shifted to have this minimum value. Default NA means use the smallest difference between consecutive, distinct sorted values of the time series. NaN means perform no shift.

# Value

```
setmints returns the shifted vector.

Daniel Reuman, <reuman@ku.edu>
```

#### Note

This is an internal function, and no error checking is done.

set\_adj

Set and get methods for classes in the wsyn package

# **Description**

Set and get methods for classes in the wsyn package. There are methods for each slot of each class, named set\_\* and get\_\* for \* the slot name. Below are listed function specs for the generics and the default methods.

# Usage

```
set_adj(obj, newval)
## Default S3 method:
set_adj(obj, newval)
set_clusters(obj, newval)
## Default S3 method:
set_clusters(obj, newval)
set_modres(obj, newval)
## Default S3 method:
set_modres(obj, newval)
set_mns(obj, newval)
## Default S3 method:
set_mns(obj, newval)
set_coords(obj, newval)
## Default S3 method:
set_coords(obj, newval)
set_methodspecs(obj, newval)
```

```
## Default S3 method:
set_methodspecs(obj, newval)
set_wmfs(obj, newval)
## Default S3 method:
set_wmfs(obj, newval)
set_wpmfs(obj, newval)
## Default S3 method:
set_wpmfs(obj, newval)
get_adj(obj)
## Default S3 method:
get_adj(obj)
get_clusters(obj)
## Default S3 method:
get_clusters(obj)
get_modres(obj)
## Default S3 method:
get_modres(obj)
get_mns(obj)
## Default S3 method:
get_mns(obj)
get_coords(obj)
## Default S3 method:
get_coords(obj)
get_methodspec(obj)
## Default S3 method:
get_methodspec(obj)
get_wmfs(obj)
## Default S3 method:
get_wmfs(obj)
```

```
get_wpmfs(obj)
## Default S3 method:
get_wpmfs(obj)
set_coher(obj, newval)
## Default S3 method:
set_coher(obj, newval)
set_dat1(obj, newval)
## Default S3 method:
set_dat1(obj, newval)
set_dat2(obj, newval)
## Default S3 method:
set_dat2(obj, newval)
set_norm(obj, newval)
## Default S3 method:
set_norm(obj, newval)
set_sigmethod(obj, newval)
## Default S3 method:
set_sigmethod(obj, newval)
set_ranks(obj, newval)
## Default S3 method:
set_ranks(obj, newval)
set_bandp(obj, newval)
## Default S3 method:
set_bandp(obj, newval)
get_coher(obj)
## Default S3 method:
get_coher(obj)
get_dat1(obj)
## Default S3 method:
```

```
get_dat1(obj)
get_dat2(obj)
## Default S3 method:
get_dat2(obj)
get_norm(obj)
## Default S3 method:
get_norm(obj)
get_sigmethod(obj)
## Default S3 method:
get_sigmethod(obj)
get_ranks(obj)
## Default S3 method:
get_ranks(obj)
get_bandp(obj)
## Default S3 method:
get_bandp(obj)
set_times(obj, newval)
## Default S3 method:
set_times(obj, newval)
set_timescales(obj, newval)
## Default S3 method:
set_timescales(obj, newval)
set_values(obj, newval)
## Default S3 method:
set_values(obj, newval)
get_times(obj)
## Default S3 method:
get_times(obj)
get_timescales(obj)
```

```
## Default S3 method:
get_timescales(obj)
get_values(obj)
## Default S3 method:
get_values(obj)
set_coefs(obj, newval)
## Default S3 method:
set_coefs(obj, newval)
set_modval(obj, newval)
## Default S3 method:
set_modval(obj, newval)
set_wts(obj, newval)
## Default S3 method:
set_wts(obj, newval)
get_coefs(obj)
## Default S3 method:
get_coefs(obj)
get_modval(obj)
## Default S3 method:
get_modval(obj)
get_wts(obj)
## Default S3 method:
get_wts(obj)
set_wlmobj(obj, newval)
## Default S3 method:
set_wlmobj(obj, newval)
set_drop(obj, newval)
## Default S3 method:
set_drop(obj, newval)
```

```
get_wlmobj(obj)
## Default S3 method:
get_wlmobj(obj)
get_drop(obj)
## Default S3 method:
get_drop(obj)
set_signif(obj, newval)
## Default S3 method:
set_signif(obj, newval)
get_signif(obj)
## Default S3 method:
get_signif(obj)
set_dat(obj, newval)
## Default S3 method:
set_dat(obj, newval)
set_wtopt(obj, newval)
## Default S3 method:
set_wtopt(obj, newval)
get_dat(obj)
## Default S3 method:
get_dat(obj)
get_wtopt(obj)
## Default S3 method:
get_wtopt(obj)
```

# **Arguments**

obj An object of one of the classes defined in the package

newval A newvalue of the slot in question, for the set\_\* methods

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# **Details**

There are methods for the tts, wt, wmf, wpmf, coh, wlm, wlmtest, and clust classes. See documentation for the generator functions for these classes (which in all cases have the same name as the class) for lists of slots for each class.

### Value

set\_\* methods throw an error - setting of individual slots is not allowed, as it breaks consistency with the other slots. get\_\* just returns the value in question.

### Author(s)

Daniel Reuman, <reuman@ku.edu>

# **Examples**

```
times<-1:10
timescales<-1/c(1:10)
values<-matrix(1,length(times),length(timescales))
h<-tts(times,timescales,values)
get_times(h)</pre>
```

surrog Creates surrogate time series, either Fourier surrogates or amplitude adjusted Fourier surrogates

# Description

For significance testing wavelet coherence and other purposes

# Usage

```
surrog(dat, nsurrogs, surrtype, syncpres)
```

# Arguments

| dat      | A locations x time matrix of observations (for multiple-time series input), or a single vector   |
|----------|--|
| nsurrogs | The number of surrogates to produce  |
| surrtype | Either "fft" (for Fourier surrogates) or "aaft" (for amplitude adjusted Fourier surrogates). Fourier surrogates are appropriate for time series with normal marginals; otherwise consider aaft surrogates. |
| syncpres | Logical. TRUE for "synchrony preserving" surrogates (same phase randomizations used for all time series). FALSE leads to independent phase randomizations for all time series.                             |

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### **Details**

Fourier surrogates are somewhat faster than aaft surrogates, and may be much faster when some of the time series in the data have ties. Prenormalization (e.g., using cleandat) can make it possible to use fft surrogates.

#### Value

surrog returns a list of nsurrogs surrogate datasets

### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, LW, et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Schreiber, T and Schmitz, A (2000) Surrogate time series. Physica D 142, 346-382.

Prichard, D and Theiler, J (1994) Generating surrogate data for time series with several simultaneously measured variables. Physical Review Letters 73, 951-954.

### See Also

```
wpmf, coh, wlmtest, synmat, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:100
dat<-sin(2*pi*times/10)
nsurrogs<-10
surrtype<-"fft"
syncpres<-TRUE
res<-surrog(dat,nsurrogs,surrtype,syncpres)</pre>
```

syncexpl

Amount of synchrony explained, and related quantities

# Description

Gives amount of synchrony explained by a wavelet linear model, as a function of timescale, and related quantities (see details)

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### Usage

```
syncexpl(object)
## S3 method for class 'wlm'
syncexpl(object)
```

### **Arguments**

object

A wlm object

#### **Details**

This function only works for norm="powall" at present. See Sheppard et al (2018) for details of the meaning and computation of the columns.

#### Value

syncexpl returns a data frame with columns for timescales, sync (the time-averaged square magnitude of the wavelet mean field of the response transforms), syncexpl (synchrony explained by the model predictors), columns named for each predictor (synchrony explained by that predictor), interactions (synchrony explained by all interaction effects), columns named for each pair of predictors (synchrony explained by individual pairwise interactions). There are also columns for crossterms and resids (residuals). The cross terms must be small for a given timescale band for the other results to be meaningful. All columns are functions of timescales.

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

# References

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

#### See Also

```
wlm, predsync, wlmtest, browseVignettes("wsyn")
```

### **Examples**

```
times<-(-3:100)
ts1<-sin(2*pi*times/10)
ts2<-5*sin(2*pi*times/3)
artsig_x<-matrix(NA,11,length(times)) #the driver
for (counter in 1:11)
{
    artsig_x[counter,]=ts1+ts2+rnorm(length(times),mean=0,sd=1.5)
}</pre>
```

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```
times<-0:100
artsig_y<-matrix(NA,11,length(times)) #the driven</pre>
for (counter1 in 1:11)
  for (counter2 in 1:101)
    artsig_y[counter1,counter2]<-mean(artsig_x[counter1,counter2:(counter2+2)])</pre>
  }
}
artsig_y<-artsig_y+matrix(rnorm(length(times)*11,mean=0,sd=3),11,length(times))</pre>
artsig_x<-artsig_x[,4:104]</pre>
artsig_i < -matrix(rnorm(11*length(times)), 11, length(times)) #the irrelevant
artsig_x<-cleandat(artsig_x,times,1)$cdat</pre>
artsig_y<-cleandat(artsig_y,times,1)$cdat</pre>
artsig_i < -cleandat(artsig_i, times, 1)$cdat
dat<-list(driven=artsig_y,driver=artsig_x,irrelevant=artsig_i)</pre>
resp<-1
pred<-2:3
norm<-"powall"
wlmobj<-wlm(dat,times,resp,pred,norm)</pre>
res<-syncexpl(wlmobj)</pre>
```

synmat

Synchrony matrices

# **Description**

Calculate synchrony matrices using a variety of methods

# Usage

```
synmat(
  dat,
  times,
  method,
  tsrange = c(0, Inf),
  nsurrogs = 1000,
  scale.min = 2,
  scale.max.input = NULL,
  sigma = 1.05,
  f0 = 1,
  weighted = TRUE,
  sigthresh = 0.95
)
```

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### Arguments

dat A locations (rows) x time (columns) matrix of measurements times The times at which measurements were made, spacing 1

method Method for synchrony calculation. See details.

tsrange A vector containing the min and max of the focal timescale range. Defaults to all

timescales that are valid given choices for scale.min, scale.max.input, f0, sigma.

Only used for wavelet-based methods.

nsurrogs Number of surrogates for significance test. Defaults to 1000. Only used for

surrogate-based methods.

scale.min The smallest scale of fluctuation that will be examined. At least 2. Used only

for wavelet-based methods.

scale.max.input

The largest scale of fluctuation guaranteed to be examined. Only used for

wavelet-based methods.

sigma The ratio of each time scale examined relative to the next timescale. Should be

greater than 1. Only used for wavelet-based methods.

The ratio of the period of fluctuation to the width of the envelope. Only used for

wavelet-based methods.

weighted If TRUE, create a weighted network. If FALSE, create a binary network using

statistical significance. Binary networks are only allowed for networks based on

significance.

sigthresh Significance threshold needed, if weighted is false, for a network link to be

realized. Typically 0.95, 0.99, or 0.999, etc. Only used if weighted is FALSE.

# Details

The following values are valid for method: "pearson", "pearson.sig.std", "pearson.sig.fft", "pearson.sig.aaft", "spearman", "spearman.sig.std", "spearman.sig.fft", "spearman.sig.aaft", "kendall", "kendall.sig.std", "kendall.sig.fft", "kendall.sig.aaft", "ReXWT.sig.fft", "ReXWT.sig.fft", "ReXWT.sig.fast", "coh", "coh.sig.fft", "coh.sig.aaft", "coh.sig.fast", "phasecoh", "phasecoh.sig.fft", and "phasecoh.sig.aaft". The first portions of these identifiers correspond to the Pearson, Spearman, and Kendall correlations, the real part of the cross-wavelet transform, the wavelet coherence, and the wavelet phase coherence. The second portions of these identifiers, when present, indicates that significance of the measure specified in the first portion of the identifies is to be used for establishing the synchrony matrix. Otherwise the value itself is used. The third part of the method identifier indicates what type of significance is used.

Significance testing is performed using standard approaches (method flag containg std; for correlation coefficients, although these are inappropriate for autocorrelated data), or surrogates generated using the Fourier (method flag containing "fft") or amplitude adjusted Fourier surrogates ("aaft"). For "coh" and "ReXWT", the fast testing algorithm of Sheppard et al. (2017) is also implemented ("fast"). That method uses implicit Fourier surrogates. The choice of wavelet coherence (method flag containing "coh") or the real part of the cross-wavelet transform (method flag containing "ReXWT") depends mainly on treatment of out-of-phase relationships. The "ReXWT" is more akin to a correlation coefficient in that strong in-phase relationships approach 1 and strong antiphase relationships approach -1. Wavelet coherence allows any phase relationship and ranges

56 tts

from 0 to 1. Power normalization is applied for "coh" and for "ReXWT". All significance tests are one-tailed. Synchrony matrices for significance-based methods when weighted is TRUE contain 1 minus the p-values.

#### Value

synmat returns a synchrony matrix, of type depending on the method argument. See details. Diagonal entries are left as NA.

#### Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Daniel Reuman, <reuman@ku.edu>; Lei Zhao, <lei.zhao@cau.edu.cn>

#### References

Walter, J. A., et al. (2017) The geography of spatial synchrony. Ecology Letters. doi: 10.1111/ele.12782

#### See Also

```
clust, coh, surrog, browseVignettes("wsyn")
```

# **Examples**

tts

Creator function for the tts class

# **Description**

The tts (time/timescale) class is for matrices for which the rows correspond to times and the columns correspond to timescales. This is a general class from which other classes inherit (e.g., wt, wmf, wpmf). tts inherits from the list class.

tts\_methods 57

### Usage

```
tts(times, timescales, values)
```

# Arguments

times A numeric vector of increasing real values, spacing 1

timescales A numeric vector with positive entries

values A complex or numeric matrix of dimensions length(times) by length(timescales)

### Value

tts returns an object of class tts. Slots are:

times a numeric vector of evenly spaced times
timescales a numeric vector of positive timescales

values a complex or numeric matrix of dimensions length(times) by length(timescales)

# Author(s)

Daniel Reuman, <reuman@ku.edu>

# See Also

```
tts_methods, wt, wmf, wpmf, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:10
timescales<-1/c(1:10)
values<-matrix(1,length(times),length(timescales))
h<-tts(times,timescales,values)</pre>
```

tts\_methods Basic methods for the tts class

# **Description**

Set, get, summary, and print methods for the tts class.

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### Usage

```
## S3 method for class 'tts'
summary(object, ...)
## S3 method for class 'tts'
print(x, ...)
## S3 method for class 'tts'
set_times(obj, newval)
## S3 method for class 'tts'
set_timescales(obj, newval)
## S3 method for class 'tts'
set_values(obj, newval)
## S3 method for class 'tts'
get_times(obj)
## S3 method for class 'tts'
get_timescales(obj)
## S3 method for class 'tts'
get_values(obj)
```

# Arguments

```
object, x, obj An object of class tts
... Not currently used. Included for argument consistency with existing generics.

A new value, for the set_* methods
```

#### Value

summary.tts produces a summary of a tts object. A print.tts method is also available. For tts objects, set\_\* and get\_\* methods are available for all slots, i.e., \* equal to times, timescales, and values. The set\_\* methods just throw an error. Although class tts is flexible enough that setting of individual slots could have been allowed, because wt and other classes are based on it and because individual slots of those classes should not be changed, for consistency the same is forced for the tts class.

# Author(s)

Daniel Reuman, < reuman@ku.edu>

#### See Also

tts

warray 59

### **Examples**

```
times<-1:10
timescales<-1/c(1:10)
values<-matrix(1,length(times),length(timescales))
h<-tts(times,timescales,values)
get_times(h)
summary(h)
print(h)</pre>
```

warray

Creates an array of wavelet transforms from input timeseries

# Description

Creates an array of wavelet transforms from input timeseries

# Usage

```
warray(dat, times, scale.min = 2, scale.max.input = NULL, sigma = 1.05, f0 = 1)
```

# Arguments

dat A locations (rows) x time (columns) matrix

times A vector of timestep values (e.g. years), spacing 1

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input

The largest scale of fluctuation that will be examined. Note that if this is set too

high relative to the length of the timeseries it will be truncated.

sigma The ratio of each time scale examined relative to the next timescale. Greater

than 1.

The ratio of the period of fluctuation to the width of the envelope

#### Value

warray returns a list containing:

wavarray locations x time x timescales array of wavelet transforms

times the time steps specified (e.g., years)

timescales the timescales (1/frequency) computed for the wavelet transforms

### Note

Important for interpreting the phase: the phases grow through time, i.e., they turn anti-clockwise. This function is internal, no error checking.

60 wavmatwork

### Author(s)

Lauren Hallett, <hallett@uoregon.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

| wavmatwork | Facilitates the computations in synmat for coherence and ReXWT methods |
|------------|--|
|            |  |

# Description

Worker/utility function serving the analysis carried out in synmat for methods based on coherence or real part of the cross-wavelet transform.

### Usage

```
wavmatwork(dat, times, scale.min, scale.max.input, sigma, f0, norm, treatment)
```

# **Arguments**

| dat             | A locations (rows) x time (columns) matrix of measurements   |
|-----------------|--|
| times           | The times at which measurements were made, spacing 1   |
| scale.min       | The smallest scale of fluctuation that will be examined. At least 2. Used only for wavelet-based methods.                            |
| scale.max.input |  |
|                 | The largest scale of fluctuation guaranteed to be examined. Only used for wavelet-based methods.                                     |
| sigma           | The ratio of each time scale examined relative to the next timescale. Should be greater than 1. Only used for wavelet-based methods. |
| f0              | The ratio of the period of fluctuation to the width of the envelope. Only used for wavelet-based methods.                            |
| norm            | The normalization of wavelet transforms to be used. One of "none", "phase", "powind".  |
| treatment       | Either "Mod" or "Re"   |

# Value

wavmatwork returns a list consisting of:

timescales The timescales of analysis

An array, locations by locations by timescales, containing either the coherences
(for treatment="Mod") or the real parts of the cross-wavelet transforms (for treatment="Re") between locations.

# Note

Internal function, no error checking done.

wlm 61

# Author(s)

Daniel Reuman, <reuman@ku.edu>

| wlm | Wavelet linear models |
|-----|-----------------------|
|     |                       |

# Description

Fits wavelet linear models. Also the generator function of the wlm class, which inherits from the list class.

# Usage

```
wlm(
   dat,
   times,
   resp,
   pred,
   norm,
   scale.min = 2,
   scale.max.input = NULL,
   sigma = 1.05,
   f0 = 1
)
```

# Arguments

| dat                                  | A list of matrices representing the data (or in the case of one location, a list of vectors). All the same dimensions (respectively, lengths)            |
|--------------------------------------|--|
| times                                | The times at which measurements were made, spacing 1   |
| resp                                 | Index in dat for the response variable of the model  |
| pred                                 | Vector of indices in dat for the predictor variables of the model; must differ from resp   |
| norm                                 | The normalization of wavelet transforms to use. One of "none", "powall", "powind". See details.  |
| <pre>scale.min scale.max.input</pre> | The smallest scale of fluctuation that will be examined. At least 2.   |
|                                      | The largest scale of fluctuation that will be examined. Note that if this is set too high relative to the length of the timeseries it will be truncated. |
| sigma                                | The ratio of each time scale examined relative to the next timescale. Greater than 1.  |
| f0                                   | The ratio of the period of fluctuation to the width of the envelope  |
|                                      |  |

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#### **Details**

Normalization is as specified in the documentation for coh, HOWEVER, only the "powal1" option is currently implemented, other choices throw an error. Details are specified in appendices S7 and S9 of Sheppard et al, 2018. The output modval is v in appendix S7, and coefs are the betas in equation 12 in that appendix.

#### Value

wlm returns an object of class wlm. Slots are:

dat The input data list, but reordered and subsetted so the response is first and only

used predictors are included

times The times associated with the data

norm The input

wtopt The inputted wavelet transform options scale.min, scale.max.input, sigma, f0 in

a list

wts List of transforms, normalized as specified in norm. Same length as the output

dat, each entry a locations x time x timescales array of transforms.

timescales The timescales associated with the wavelet transforms of the data

coefs A list (data frame, actually) of complex vectors, each of length the same as

timescales. These are the model coefficients (which depend on timescale),

and correspond to the wts.

modval The model values.

coher Appropriately normalized version of coherence of the model and response trans-

forms. See details.

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

### References

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

### See Also

```
wlm_methods, wlmtest, syncexpl, predsync, browseVignettes("wsyn")
```

### **Examples**

wlmfit 63

```
resp<-2
pred<-c(1,3,4)
norm<-"powal1"
res<-wlm(dat,times,resp,pred,norm)</pre>
```

wlmfit

Fits a wavelet linear model

# Description

Stripped down internal function for doing the fitting

### Usage

```
wlmfit(wts, norm)
```

# **Arguments**

wts List of normalized transforms, normalized as specified in norm. Each entry a

locations x time x timescales array of transforms. The first is the response vari-

able, others are the predictors.

norm The normalization that was used. One of "none", "powall", "powind". See de-

tails.

# **Details**

Only norm="powall" works now, other options throw an error.

#### Value

wlmfit returns a list with these elements:

coefs Model coefficients

modval The right had side of the model

coher Appropriately normalized coherence of the model and response variable

### Note

Internal function, no error checking done.

### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

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#### References

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

wlmtest

Statistical comparison of wavelet linear models

### **Description**

Compares a wavelet linear model with a nested model. Also the generator function for the wlmtest class.

### Usage

```
wlmtest(wlmobj, drop, sigmethod, nrand = 1000)
```

#### **Arguments**

wlmobj A wlm object

drop Either names or indices of variables in wlmobj\$dat that are being dropped to

form the simpler, nested model. The first variable in wlmobj\$dat, which is the

response, is not allowed here.

sigmethod Method for significance testing. One of "fft", "aaft", "fast". See details.

nrand The number of randomizations to do for significance

#### **Details**

The slot signif provides the core information on significance. If sigmethod is not "fast", then signif\$coher is the same as wlmobj\$coher, and signif\$scoher is a matrix of dimensions nrand by length(signif\$coher) with rows equal to coherences between refitted models and the responsevariable transforms, for datasets where the variables specified in drop have been replaced by surrogates. Normalization as specified in norm is used. The type of surrogate used (Fourier surrogates or amplitude adjusted Fourier surrogates, see surrog) is determined by sigmethod ("fft" or "aaft"). Synchrony-preserving surrogates are used. A variety of statements of significance (or lack thereof) can be made by comparing signif\$coher with signif\$scoher (see the plotmag, plotrank, and bandtest methods for the wlmtest class). If sigmethod is "fast", a fast algorithm of Lawrence Sheppard is used which is a generalization to wavelet linear models of the fast algorithm for coherence described in Sheppard et al (2017). In that case signif\$coher can be compared to signif\$scoher to make significance statements about the coherence in exactly the same way, but signif\$coher will no longer precisely equal wlmobj\$coher, and wlmobj\$coher should not be compared directly to signif\$scoher. Statements about significance of the coherence should be made using signif\$coher and signif\$scoher, whereas wlmobj\$coher should be used whenever the actual value of the coherence is needed.

The slots ranks and bandp are empty on an initial call to wlmtest. They are made to compute and hold aggregate significance results over any timescale band of choice. These are filled in when needed by other methods, see plotrank and bandtest.

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#### Value

wlmtest returns an object of class wlmtest. Slots are:

| wlmobj | The input  |
|--------|--|
| drop   | The input  |
| signif | A list with information from the significance testing. Elements are sigmethod (the input), coher and scoher. See details.  |
| ranks  | $\boldsymbol{A}$ list with ranking information for signif. NA until plotrank or bandtest is called.  |
| bandp  | A data frame containing results of computing significances across timescale bands. Empty on an initial call to wlmtest, filled in by the function bandtest. See details. |

### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

Sheppard, L.W., et al. (2017) Rapid surrogate testing of wavelet coherences. European Physical Journal, Nonlinear and Biomedical Physics, 5, 1. DOI: 10.1051/epjnbp/2017000

Sheppard, LW et al. (2019) Synchrony is more than its top-down and climatic parts: interacting Moran effects on phytoplankton in British seas. Plos Computational Biology 15, e1006744. doi: 10.1371/journal.pcbi.1006744

# See Also

```
wlm, plotrank, bandtest, coh, wlmtest_methods, browseVignettes("wsyn")
```

### **Examples**

wlmtest\_methods

wlmtest\_methods

Basic methods for the wlmtest class

### **Description**

Set, get, summary, and print methods for the wlmtest class.

# Usage

```
## S3 method for class 'wlmtest'
summary(object, ...)
## S3 method for class 'wlmtest'
print(x, ...)
## S3 method for class 'wlmtest'
set_wlmobj(obj, newval)
## S3 method for class 'wlmtest'
set_drop(obj, newval)
## S3 method for class 'wlmtest'
set_signif(obj, newval)
## S3 method for class 'wlmtest'
set_ranks(obj, newval)
## S3 method for class 'wlmtest'
set_bandp(obj, newval)
## S3 method for class 'wlmtest'
get_wlmobj(obj)
## S3 method for class 'wlmtest'
get_drop(obj)
## S3 method for class 'wlmtest'
get_signif(obj)
## S3 method for class 'wlmtest'
get_ranks(obj)
## S3 method for class 'wlmtest'
get_bandp(obj)
```

# **Arguments**

```
object, x, obj An object of class wlmtest
```

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... Not currently used. Included for argument consistency with existing generics.

newval A new value, for the set\_\* methods

#### Value

summary.wlmtest produces a summary of a wlmtest object. A print.wlmtest method is also available. For wlmtest objects, set\_\* and get\_\* methods are available for all slots (see the documentation for wlmtest for a list). The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a wlmtest object.

### Author(s)

Daniel Reuman, <reuman@ku.edu>

#### See Also

wlmtest

# **Examples**

wlm\_methods

Basic methods for the wlm class

# **Description**

Set, get, summary, and print methods for the wlm class.

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### Usage

```
## S3 method for class 'wlm'
summary(object, ...)
## S3 method for class 'wlm'
print(x, ...)
## S3 method for class 'wlm'
set_times(obj, newval)
## S3 method for class 'wlm'
set_timescales(obj, newval)
## S3 method for class 'wlm'
set_coefs(obj, newval)
## S3 method for class 'wlm'
set_modval(obj, newval)
## S3 method for class 'wlm'
set_coher(obj, newval)
## S3 method for class 'wlm'
set_dat(obj, newval)
## S3 method for class 'wlm'
set_wtopt(obj, newval)
## S3 method for class 'wlm'
set_norm(obj, newval)
## S3 method for class 'wlm'
set_wts(obj, newval)
## S3 method for class 'wlm'
get_times(obj)
## S3 method for class 'wlm'
get_timescales(obj)
## S3 method for class 'wlm'
get_coefs(obj)
## S3 method for class 'wlm'
get_modval(obj)
## S3 method for class 'wlm'
get_coher(obj)
```

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```
## S3 method for class 'wlm'
get_dat(obj)

## S3 method for class 'wlm'
get_wtopt(obj)

## S3 method for class 'wlm'
get_norm(obj)

## S3 method for class 'wlm'
get_wts(obj)
```

# **Arguments**

```
object, x, obj An object of class wlm
... Not currently used. Included for argument consistency with existing generics.

A new value, for the set_* methods
```

#### Value

summary.wlm produces a summary of a wlm object. A print.wlm method is also available. For wlm objects, set\_\* and get\_\* methods are available for all slots (see the documentation for wlm for a list). The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a wlm object.

#### Author(s)

Daniel Reuman, < reuman@ku.edu>

# See Also

wlm

### **Examples**

70 wmf

| wmf   | Computes the wavelet mean field from a matrix of spatiotemporal data. |
|-------|---|
| WIIII |   |
|       | Also the creator function for the wmf class.                          |

### **Description**

Computes the wavelet mean field from a matrix of spatiotemporal data. Also the creator function for the wmf class. The wmf class inherits from the tts class, which inherits from the list class.

# Usage

```
wmf(dat, times, scale.min = 2, scale.max.input = NULL, sigma = 1.05, f0 = 1)
```

# **Arguments**

dat A locations (rows) x time (columns) matrix

times A vector of time step values (e.g., years), spacing 1

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input The largest scale of fluctuation that will be examined. Note that if this is set too high relative to the length of the timeseries it will be truncated.

sigma The ratio of each time scale examined relative to the next timescale. Greater than 1

The ratio of the period of fluctuation to the width of the envelope

#### Value

f0

wmf returns an object of class wmf. Slots are:

A matrix of complex numbers containing the wavelet mean field, of dimensions length(times) by the number of timescales. Entries not considered reliable (longer timescales, near the edges of the time span) are set to NA.

times

The time steps specified (e.g., years)

timescales

The timescales (1/frequency) computed for the wavelet transforms

The data matrix (locations by time) from which the wmf was computed

wtopt

The inputted wavelet transform options scale.min, scale.max.input, sigma, f0 in

a list

# Author(s)

Jonathan Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

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### See Also

```
wmf_methods, tts, wpmf, plotmag, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:30 #generate time steps
#generate fake count data for 20 locations
dat<-matrix(rpois(20*length(times),20),nrow=20,ncol=length(times))
dat<-cleandat(dat=dat,times=times,clev=2)$cdat #detrend and demean
wmf<-wmf(dat,times)</pre>
```

wmf\_methods

Basic methods for the wmf class

# **Description**

Set, get, summary, and print methods for the wmf class.

# Usage

```
## S3 method for class 'wmf'
summary(object, ...)
## S3 method for class 'wmf'
print(x, ...)
## S3 method for class 'wmf'
set_times(obj, newval)
## S3 method for class 'wmf'
set_timescales(obj, newval)
## S3 method for class 'wmf'
set_values(obj, newval)
## S3 method for class 'wmf'
set_dat(obj, newval)
## S3 method for class 'wmf'
set_wtopt(obj, newval)
## S3 method for class 'wmf'
get_times(obj)
## S3 method for class 'wmf'
get_timescales(obj)
```

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```
## S3 method for class 'wmf'
get_values(obj)

## S3 method for class 'wmf'
get_dat(obj)

## S3 method for class 'wmf'
get_wtopt(obj)
```

# Arguments

object, x, obj An object of class wmf

... Not currently used. Included for argument consistency with existing generics.

newval A new value, for the set\_\* methods

### Value

summary.wmf produces a summary of a wmf object. A print.wmf method is also available. For wmf objects, set\_\* and get\_\* methods are available for all slots, i.e., \* equal to times, timescales, wtopt, values, and dat. The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a wmf object.

# Author(s)

Daniel Reuman, <reuman@ku.edu>

### See Also

wmf

# **Examples**

```
times<-1:30 #generate time steps
#generate fake count data for 20 locations
dat<-matrix(rpois(20*length(times),20),nrow=20,ncol=length(times))
dat<-cleandat(dat=dat,times=times,clev=2)$cdat #detrend and demean
h<-wmf(dat,times)
get_times(h)
summary(h)
print(h)</pre>
```

wpmf 73

wpmf

Wavelet phasor mean field

### Description

Computes the wavelet phasor mean field from a matrix of spatiotemporal data. Also the creator function for the wpmf class. The wpmf class inherits from the tts class, which inherits from the list class.

### Usage

```
wpmf(
  dat,
  times,
  scale.min = 2,
  scale.max.input = NULL,
  sigma = 1.05,
  f0 = 1,
   sigmethod = "none",
  nrand = 1000
)
```

### **Arguments**

dat A locations (rows) x time (columns) matrix A vector of time step values, spacing 1 times The smallest scale of fluctuation that will be examined. At least 2. scale.min scale.max.input The largest scale of fluctuation guaranteed to be examined The ratio of each time scale examined relative to the next timescale. Should be sigma greater than 1. f0 The ratio of the period of fluctuation to the width of the envelop Method for significance testing the wmpf, one of quick, fft, aaft (see details) sigmethod The number of randomizations to be used for significance testing nrand

# Details

For sigmethod equal to quick, the empirical wpmf is compared to a distribution of magnitudes of sums of random phasors, using the same number of phasors as there are time series. The signif output is a list with first element "quick" and second element a vector of nrand magnitudes of sums of random phasors. For sigmethod equal to fft, the empirical wpmf is compared to wmpfs of Fourier surrogate datasets. The signif output is a list with first element "fft", second element equal to nrand, and third element the fraction of surrogate-based wpmf magnitudes that the empirical wpmf magnitude is greater than (times by timescales matrix). For sigmethod equal to aaft, aaft surrogates are used instead. Output has similar format to the fft case. Values other than quick, fft, and aaft for sigmethod result in no significance testing.

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#### Value

wpmf returns an object of class wpmf. Slots are:

values A matrix of complex numbers containing the wavelet phasor mean field, of di-

mensions length(times) by the number of timescales. Entries not considered reliable (longer timescales, near the edges of the time span) are set to NA.

times The times associated with the data and the wpmf

timescales The timescales associated with the wpmf

signif A list with information from the significance testing. Format depends on sigmethod

(see details).

dat The data matrix (locations by time) from which the wpmf was computed

wtopt The inputted wavelet transform options scale.min, scale.max.input, sigma, f0 in

a list

#### Author(s)

Thomas Anderson, <anderstl@gmail.com>, Jon Walter, <jaw3es@virginia.edu>; Lawrence Sheppard, <lwsheppard@ku.edu>; Daniel Reuman, <reuman@ku.edu>

#### References

Sheppard, L.W., et al. (2016) Changes in large-scale climate alter spatial synchrony of aphid pests. Nature Climate Change. DOI: 10.1038/nclimate2881

#### See Also

```
wpmf_methods, wmf, tts, plotmag, browseVignettes("wsyn")
```

# **Examples**

```
times<-1:30 #generate time steps
#generate fake count data for 20 locations
dat<-matrix(rpois(20*length(times),20),nrow=20,ncol=length(times))
dat<-cleandat(dat=dat,times=times,clev=2)$cdat #detrend and demean
res<-wpmf(dat,times)</pre>
```

wpmf\_methods Basic methods for the wpmf class

### Description

Set, get, summary, and print methods for the wpmf class.

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# Usage

```
## S3 method for class 'wpmf'
summary(object, ...)
## S3 method for class 'wpmf'
print(x, ...)
## S3 method for class 'wpmf'
set_times(obj, newval)
## S3 method for class 'wpmf'
set_timescales(obj, newval)
## S3 method for class 'wpmf'
set_values(obj, newval)
## S3 method for class 'wpmf'
set_dat(obj, newval)
## S3 method for class 'wpmf'
set_wtopt(obj, newval)
## S3 method for class 'wpmf'
set_signif(obj, newval)
## S3 method for class 'wpmf'
get_times(obj)
## S3 method for class 'wpmf'
get_timescales(obj)
## S3 method for class 'wpmf'
get_values(obj)
## S3 method for class 'wpmf'
get_dat(obj)
## S3 method for class 'wpmf'
get_wtopt(obj)
## S3 method for class 'wpmf'
get_signif(obj)
```

#### **Arguments**

```
object, x, obj An object of class wpmf
... Not currently used. Included for argument consistency with existing generics.

newval A new value, for the set_* methods
```

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### Value

summary.wpmf produces a summary of a wpmf object. A print.wpmf method is also available. For wpmf objects, set\_\* and get\_\* methods are available for all slots, i.e., \* equal to times, timescales, wtopt, values, dat, and signif. The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a wpmf object.

### Author(s)

Daniel Reuman, <reuman@ku.edu>

#### See Also

wpmf

### **Examples**

```
times<-1:30 #generate time steps
#generate fake count data for 20 locations
dat<-matrix(rpois(20*length(times),20),nrow=20,ncol=length(times))
dat<-cleandat(dat=dat,times=times,clev=2)$cdat #detrend and demean
h<-wpmf(dat,times)
get_times(h)
summary(h)
print(h)</pre>
```

wt

Computes the wavelet transform of a timeseries. Also the creator function for the wt class.

# Description

Computes the wavelet transform of a timeseries. Also the creator function for the wt class. The wt class inherits from the tts class, which inherits from the list class.

# Usage

```
wt(
   t.series,
   times,
   scale.min = 2,
   scale.max.input = NULL,
   sigma = 1.05,
   f0 = 1
)
```

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#### **Arguments**

t.series A timeseries of real values

times A vector of time step values (e.g., years), spacing 1

scale.min The smallest scale of fluctuation that will be examined. At least 2.

scale.max.input

The largest scale of fluctuation that is guaranteed to be examined

sigma The ratio of each time scale examined relative to the next timescale. Should be

greater than 1.

The ratio of the period of fluctuation to the width of the envelope. Defaults to 1.

#### Value

wt returns an object of class wt. Slots are:

values A matrix of complex numbers, of dimensions length(t.series) by the num-

ber of timescales. Entries not considered reliable (longer timescales, near the

edges of the time span) are set to NA.

times The time steps specified (e.g. years)

wtopt The inputted wavelet transform options scale.min, scale.max.input, sigma, f0 in

a list

timescales The timescales (1/frequency) computed for the wavelet transform

dat The data vector from which the transform was computed

# Note

Important for interpreting the phase: the phases grow through time, i.e., they turn anti-clockwise.

### Author(s)

Lawrence Sheppard <lwsheppard@ku.edu>, Jonathan Walter <jaw3es@virginia.edu>, Daniel Reuman <reuman@ku.edu>

### See Also

```
wt_methods, tts, plotmag, plotphase, browseVignettes("wsyn")
```

# **Examples**

```
time1<-1:100
time2<-101:200
ts1p1<-sin(2*pi*time1/15)
ts1p2<-0*time1
ts2p1<-0*time2
ts2p2<-sin(2*pi*time2/8)
ts1<-ts1p1+ts1p2
ts2<-ts2p1+ts2p2
ts<-c(ts1,ts2)
ra<-rnorm(200,mean=0,sd=0.5)</pre>
```

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```
t.series<-ts+ra
t.series<-t.series-mean(t.series)
times<-c(time1,time2)
res<-wt(t.series, times)</pre>
```

wt\_methods

Basic methods for the wt class

# Description

Set, get, summary, and print methods for the wt class.

# Usage

```
## S3 method for class 'wt'
summary(object, ...)
## S3 method for class 'wt'
print(x, ...)
## S3 method for class 'wt'
set_times(obj, newval)
## S3 method for class 'wt'
set_timescales(obj, newval)
## S3 method for class 'wt'
set_values(obj, newval)
## S3 method for class 'wt'
set_dat(obj, newval)
## S3 method for class 'wt'
set_wtopt(obj, newval)
## S3 method for class 'wt'
get_times(obj)
## S3 method for class 'wt'
get_timescales(obj)
## S3 method for class 'wt'
get_values(obj)
## S3 method for class 'wt'
get_dat(obj)
```

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```
## S3 method for class 'wt'
get_wtopt(obj)
```

# Arguments

object, x, obj An object of class wt

... Not currently used. Included for argument consistency with existing generics.

newval A new value, for the set\_\* methods

#### Value

summary.wt produces a summary of a wt object. A print.wt method is also available. For wt objects, set\_\* and get\_\* methods are available for all slots, i.e., \* equal to times, timescales, wtopt, values, and dat. The set\_\* methods just throw an error, to prevent breaking the consistency between the slots of a wt object.

### Author(s)

Daniel Reuman, <reuman@ku.edu>

#### See Also

wt

# **Examples**

```
time1<-1:100
time2<-101:200
ts1p1<-sin(2*pi*time1/15)
ts1p2<-0*time1
ts2p1<-0*time2
ts2p2 < -sin(2*pi*time2/8)
ts1<-ts1p1+ts1p2
ts2<-ts2p1+ts2p2
ts<-c(ts1,ts2)
ra<-rnorm(200,mean=0,sd=0.5)
t.series<-ts+ra
t.series<-t.series-mean(t.series)</pre>
times<-c(time1, time2)</pre>
h<-wt(t.series, times)
get_times(h)
summary(h)
print(h)
```

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