

Package ‘PaleoSpec’

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Description Spectral tools for the ECUS group

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zoo

Suggests testthat

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AddConfInterval	<i>Add confidence intervals to a spectrum</i>
-----------------	---

Description

Add confidence intervals to a spectrum

Usage

```
AddConfInterval(spec, MINVALUE = 1e-10, pval = 0.05)
```

Arguments

spec	spectrum list(spec,freq,dof)
MINVALUE	Minimum value to which the confidence interval is limited
pval	Interval from (pval/2 to 1-pval/2) is constructed

Value

spectrum as the input but including lim.1 and lim.2 as new list elements

Author(s)

Thomas Laepple

Examples

```

N.R=1000
N.T=100
save.spec<-matrix(NA,N.T/2,N.R)
for (i.R in 1:N.R) {
  save.spec[,i.R]<-SpecMTM(ts(SimPowerlaw(1, N.T)))$spec
}

q.empirical<-apply(save.spec,1,quantile,c(0.025,0.975))
testspec<-SpecMTM(ts(SimPowerlaw(1, N.T)))
LPlot(AddConfInterval(testspec),ylim=c(0.05,10))
lines(testspec$freq,q.empirical[1,],col="red")
lines(testspec$freq,q.empirical[2,],col="red")
legend("bottomleft",lwd=2,col=c("black","red"),
c("one realization with chisq conf intervals","MC confidence intervals"))

```

AnPowerlaw

A PSD(freq) for a powerlaw with variance 1

Description

A PSD(freq) for a powerlaw with variance 1

Usage

```
AnPowerlaw(beta, freq, return.scaling = FALSE)
```

Arguments

beta	slope of the powerlaw
freq	frequency vector

Value

vector containing the PSD

Author(s)

Thomas Laepple

ApplyFilter	<i>Apply a filter to a timeseries</i>
-------------	---------------------------------------

Description

Apply a filter to a timeseries the timestep provided by ts is not used!!!! Thus for timeseries with a different spacing than 1, the filter has to be adapted Using endpoint constrains as describen in Mann et al., GRL 2003 no constraint (loss at both ends) (method=0) minimum norm constraint (method=1) minimum slope constraint (method=2) minimum roughness constraint (method=3) circular filtering (method=4)

Usage

```
ApplyFilter(data, filter, method = 0)
```

Arguments

data	Input timeseries (ts object)
filter	vector of filter weights
method	constraint method choice 0-4

Value

filtered timeseries (ts object)

Author(s)

Thomas Laepple

ApproxNearest	<i>approximate a timeseries using the nearest neighbour</i>
---------------	---

Description

extends approx which always takes the right or left neighbour or the weighted mean between both if $f_i \in [0,1]$

Usage

```
ApproxNearest(x, y, xout, rule = 1)
```

Arguments

x	numeric vector giving the coordinates of the points to be interpolate
y	corresponding y values
xout	set of numeric values specifying where interpolation is to take place.
rule	an integer (of length 1 or 2) describing how interpolation is to take place outside the interval see ?approx

Value

a list with components 'x' and 'y', containing `length(xouth)` coordinates which interpolate the given data points

Author(s)

Thomas Laepple

Examples

```
x<-1:10
y<-1:10
xout<-seq(from=0,to=11,by=0.01)
plot(x,y,type="b",pch=19,xlim=range(xout))
result<-ApproxNearest(x,y,xout)
lines(result,col="red")
```

AvgToBin	<i>Bin averaging</i>
----------	----------------------

Description

Average a vector into bins.

Usage

```
AvgToBin(x, y, N = 2, breaks = pretty(x, N), right = TRUE, bFill = FALSE)
```

Arguments

x	vector of values on which the data in y is tabulated; e.g. depth or time points.
y	vector of observation values to be averaged into bins. Must have the same length as x .
N	desired number of breaks (ignored if breaks are supplied directly).
breaks	vector of break point positions to define the averaging bins; if omitted, break point positions are calculated from the range of x and the desired number of breaks given by N .
right	logical; indicate whether the bin intervals should be closed on the right and open on the left (TRUE, the default), or vice versa (FALSE).
bFill	logical; if TRUE, fill empty bins using linear interpolation from the neighbours to the center of the bin.

Details

This function averages the vector **y** into bins according to the position of **x** within the breaks. You can either specify a desired number **N** of breaks which are used to calculate the actual breaks via `pretty(x,N)`, or directly specify the **N** + 1 break positions. For **right** = TRUE (the default) the averaging bins are defined via `x > breaks[i]` and `x <= breaks[i + 1]`, else they are defined via `x >= breaks[i]` and `x < breaks[i + 1]`. If **bFill** = TRUE, empty bins are filled using linear interpolation from the neighbours to the center of the bin.

Probably the binning could be considerably speeded up by using `?cut`.

Value

a list with four elements:

breaks: numeric vector of the used break point positions.

centers: numeric vector with the positions of the bin centers.

avg: numeric vector with the bin-averaged values.

nobs: numeric vector with the number of observations contributing to each bin average.

Author(s)

Thomas Laepple

Bandpass	<i>calculate weights for a bandpass filter</i>
----------	--

Description

Derive the (smoothed) least square bandpass based on Bloomfield 1976

Usage

```
Bandpass(omega.upper, omega.lower, n, sample = 1, convergence = T)
```

Arguments

<code>omega.upper</code>	upper cutoff frequency
<code>omega.lower</code>	lower cutoff frequency
<code>n</code>	length of the filter, has to be odd
<code>sample</code>	sampling rate of the timeseries on which the filter will be applied (1/deltat)
<code>convergence</code>	TRUE: smoothed least square lowpass; FALSE = unsmoothed
<code>omega.c</code>	cutoff frequency

Value

vector of filter weights

Author(s)

Thomas Laepple

ClosestElement	<i>Get closest element of a vector</i>
----------------	--

Description

Get closest element of a vector

Usage

```
ClosestElement(xvector, x, type = "N")
```

Arguments

xvector	a vector of values
x	the value to find the closest match to
type	

ColTransparent	<i>Modify a color to get brighter and transparent for the confidence intervals</i>
----------------	--

Description

Modify a color to get brighter and transparent for the confidence intervals

Usage

```
ColTransparent(color, alpha = 0.8, beta = 150)
```

Arguments

color	color value, e.g. "red"
alpha	(0..1) transparency value
beta	(0..255) to make it brighter, this value gets added on the RGB values

Value

modified color

Author(s)

Thomas Laepple

ConfRatio	<i>Confidence Interval of ratios</i>
-----------	--------------------------------------

Description

Confidence Interval of ratios based on a ChiSquare Distribution

Usage

```
ConfRatio(varratio, df.1, df.2, pval = 0.1)
```

Arguments

df.1	degree of freedom of denominator
df.2	degree of freedom of numerator

Value

lower and upper confidence intervals

Author(s)

Thomas Laepple

ConfVar	<i>Provide ChiSquared confidence intervals for ratios</i>
---------	---

Description

Provide ChiSquared confidence intervals for ratios

Usage

```
ConfVar(varlist, pval = 0.05)
```

Arguments

varlist	list(var,dof)
pval	requested p-value

Value

Output: confidence intervals

Author(s)

Thomas Laepple

FirstElement	<i>first element of a vector</i>
--------------	----------------------------------

Description

first element of a vector

Usage

```
FirstElement(x)
```

Value

first element of X

Author(s)

Thomas Laepple

fweights	<i>weights</i>
----------	----------------

Description

weights

Usage

```
fweights(ftarget, f, df.log)
```

Value

weight vector

Author(s)

Thomas Laepple

fweights.lin	<i>fweights.lin</i>
--------------	---------------------

Description

fweights.lin

Usage

fweights.lin(ftarget, f, df.log)

Value

weight vector

Author(s)

Thomas Laepple

GetTransferFunction	<i>Derives and plots the transfer function (given a filter)</i>
---------------------	---

Description

Get the transfer function of a symmetric filter, page 122 in Bloomfield 1976, page 135 in Bloomfield 2000

Usage

```
GetTransferFunction(
  g.u,
  resolution = 100,
  freq = NULL,
  bPlot = is.null(freq) == TRUE,
  add = FALSE,
  ...
)
```

Arguments

g.u	a filter, a numeric vector, values should sum to 1
resolution	the number of frequencies at which to evaluate the transfer function
freq	the specific frequency(s) at which to evaluate the transfer function if NULL, transfer function is evaluated at 1:resolution frequencies
bPlot	logical, plot the transfer function, defaults to FALSE if frequencies are specified, TRUE otherwise
add	logical, add to a previous plot
...	other arguments to pass to the plotting function

Value

list(freq, y) containing the transfer function

Author(s)

Thomas Laepple

Examples

```
l <- 11
tf <- GetTransferFunction(rep(1/l, l), resolution = 1000)
tf <- GetTransferFunction(rep(1/l, l), freq = 1/c(100, 10, 2))
```

GetVarFromSpectra	<i>Variance estimate by integrating a part of the spectrum</i>
-------------------	--

Description

Variance estimate by integrating a part of the spectrum

Usage

```
GetVarFromSpectra(spec, f, dfreq = NULL, df.log = 0, bw = 3)
```

Arguments

spec	spectrum (list of spec,freq,dof) to be analysed
f	f[1],f[2]: frequency interval to be analysed
dfreq	frequency discretisation used in the temporary interpolation
df.log	if != 0, smooth the spectra prior to integrating
bw	the bandwidth assumed for the confinterval calculation (from the multi-taper spectral estimate)

Value

list(var,dof) variance and corresponding dof

Author(s)

Thomas Laepple

Examples

```
x<-ts(rnorm(100))
spec<-SpecMTM(x)
var(x) #Sample variance of the timeseries
GetVarFromSpectra(spec,c(1/100,0.5))
GetVarFromSpectra(spec,c(0.25,0.5))
```

Highpass	<i>calculate weights for a bandpass filter</i>
----------	--

Description

Derive the (smoothed) least square highpass based on Bloomfield 1976

Usage

```
Highpass(omega.c, n = 9, sample = 1, convergence = T)
```

Arguments

omega.c	cutoff frequency
n	length of the filter, has to be odd
sample	sampling rate of the timeseries on which the filter will be applied (1/deltat)
convergence	TRUE: smoothed least square lowpass; FALSE = unsmoothed

Value

vector of filter weights

Author(s)

Thomas Laepple

InverseFilter	<i>Construct the inverse filter in the time domain</i>
---------------	--

Description

Construct the inverse filter in the time domain

Usage

```
InverseFilter(filter.weights)
```

Arguments

filter.weights

Value

filter weights for the inverse filter

Author(s)

Thomas Laepple

LastElement	<i>last element of a vector</i>
-------------	---------------------------------

Description

last element of a vector

Usage

```
LastElement(x)
```

Arguments

x

Value

last element of X

Author(s)

Thomas Laepple

LLines	<i>Add a spectrum to an existing log-log spectral plot.</i>
--------	---

Description

This function adds a spectrum to an existing double-logarithmic plot and optionally adds a transparent confidence interval.

Usage

```
LLines(  
  x,  
  conf = TRUE,  
  bPeriod = FALSE,  
  col = "black",  
  alpha = 0.3,  
  removeFirst = 0,  
  removeLast = 0,  
  ...  
)
```

Arguments

<code>x</code>	a spectral object resulting from a call to <code>SpecMTM</code> .
<code>conf</code>	if TRUE (the default) add a transparent confidence interval (suppressed if <code>x</code> contains no error limits).
<code>bPeriod</code>	if TRUE treat the x-axis values in units of period (inverse frequency). Defaults to FALSE.
<code>col</code>	color for the line plot and the confidence interval.
<code>alpha</code>	transparency level (between 0 and 1) for the confidence interval. Defaults to 0.3.
<code>removeFirst</code>	omit <code>removeFirst</code> values on the low frequency side.
<code>removeLast</code>	omit <code>removeLast</code> values on the high frequency side.
<code>...</code>	further graphical parameters passed to <code>lines</code> .

Author(s)

Thomas Laepple

Examples

```
x <- ts(arima.sim(list(ar = 0.9), 1000))
spec <- SpecMTM(x)
LPlot(spec, col = "grey")
LLines(LogSmooth(spec), lwd = 2)
```

LogSmooth

Smooths the spectrum using a log smoother

Description

Smooths the spectrum using a log smoother

Usage

```
LogSmooth(
  spectra,
  df.log = 0.05,
  removeFirst = 1e+06,
  removeLast = 0,
  bLog = FALSE
)
```

Arguments

<code>spectra</code>	<code>spectra</code> : list(spec,freq) <code>spec[specIndex]</code> : spectra density vector <code>freq[specIndex]</code> : frequency vector
<code>df.log</code>	width of the smoother in log units
<code>removeFirst</code>	elements to remove on the slow side (one element recommended because of the detrending)
<code>removeLast</code>	elements to remove on the fast side
<code>bLog</code>	TRUE: average in the log space of the power, FALSE: arithmetic average

Value

smoothed spectrum

Author(s)

Thomas Laepple

Examples

```
x<-ts(arima.sim(list(ar = 0.9),1000))
spec<-SpecMTM(x)
LPlot(spec,col='grey')
LLines(LogSmooth(spec,df.log=0.01),lwd=2,col='green')
LLines(LogSmooth(spec,df.log=0.05),lwd=2,col='blue')
LLines(LogSmooth(spec,df.log=0.1),lwd=2,col='red')
legend('bottomleft', col=c('grey','green','blue','red'),
lwd=2,c('raw','smoothed 0.01',
'smoothed 0.05', 'smoothed 0.1'), bty='n')
```

Lowpass	<i>Calculate weights for lowpass filter</i>
---------	---

Description

Derive the (smoothed) least square lowpass, given the cutoff frequency `omega.c` and the length of the filter `n`

based on Bloomfield 1976

Usage

```
Lowpass(omega.c, n = 9, sample = 1, convergence = TRUE)
```

Arguments

<code>omega.c</code>	cutoff frequency
<code>n</code>	length of the filter, has to be odd
<code>sample</code>	sampling rate of the timeseries on which the filter will be applied ($1/\text{deltat}$)
<code>convergence</code>	TRUE: smoothed least square lowpass; FALSE = unsmoothed

Value

vector of filter weights

Author(s)

Thomas Laepple

LPlot

*Log-log spectral plot.***Description**

This function plots a spectrum on a double-logarithmic scale and optionally adds a transparent confidence interval.

Usage

```
LPlot(
  x,
  conf = TRUE,
  bPeriod = FALSE,
  bNoPlot = FALSE,
  axes = TRUE,
  col = "black",
  alpha = 0.3,
  removeFirst = 0,
  removeLast = 0,
  xlab = "f",
  ylab = "PSD",
  xlim = NULL,
  ylim = NULL,
  ...
)
```

Arguments

<code>x</code>	a spectral object resulting from a call to SpecMTM .
<code>conf</code>	if TRUE (the default) add a transparent confidence interval (suppressed if <code>x</code> contains no error limits).
<code>bPeriod</code>	if TRUE the x-axis is displayed in units of period (inverse frequency), increasing to the left. Defaults to FALSE.
<code>bNoPlot</code>	if TRUE only produce the plot frame (<code>type = "n"</code> behaviour of function plot). Defaults to FALSE.
<code>axes</code>	if FALSE the plotting of the x and y axes is suppressed. Defaults to TRUE.
<code>col</code>	color for the line plot and the confidence interval.
<code>alpha</code>	transparency level (between 0 and 1) for the confidence interval. Defaults to 0.3.
<code>removeFirst</code>	omit <code>removeFirst</code> values on the low frequency side.
<code>removeLast</code>	omit <code>removeLast</code> values on the high frequency side.
<code>xlab</code>	character string for labelling the x-axis.
<code>ylab</code>	character string for labelling the y-axis.
<code>xlim</code>	range of x-axis values; if NULL (the default) it is calculated internally and automatically reversed for <code>bPeriod = TRUE</code> .
<code>ylim</code>	range of y-axis values; if NULL (the default) it is calculated internally.
<code>...</code>	further graphical parameters passed to <code>plot</code> .

Author(s)

Thomas Laepple

Examples

```
x <- ts(arima.sim(list(ar = 0.9), 1000))
spec <- SpecMTM(x)
LPlot(spec, col = "grey")
LLines(LogSmooth(spec), lwd = 2)
```

MakeEquidistant

*Average an irregular timeseries to a regular timeseries***Description**

Make an irregular timeseries equidistant by interpolating to high resolution, lowpass filtering to the Nyquist frequency, and subsampling; e.g. as used in Huybers and Laepple, EPSL 2014

Usage

```
MakeEquidistant(
  t.x,
  t.y,
  dt = NULL,
  time.target = seq(from = t.x[1], to = t.x[length(t.x)], by = dt),
  dt.hres = NULL,
  bFilter = TRUE,
  k = 5,
  kf = 1.2,
  method.interpolation = "linear",
  method.filter = 2
)
```

Arguments

<code>t.x</code>	vector of timepoints
<code>t.y</code>	vector of corresponding values
<code>dt</code>	target timestep; can be omitted if <code>time.target</code> is supplied
<code>time.target</code>	time vector to which timeseries should be averaged/interpolated to by default the same range as <code>t.x</code> with a timestep <code>dt</code>
<code>dt.hres</code>	timestep of the intermediate high-resolution interpolation. Should be smaller than the smallest timestep
<code>bFilter</code>	(TRUE) low pass filter the data to avoid aliasing, (FALSE) just interpolate
<code>k</code>	scaling factor for the Length of the filter (increasing creates a sharper filter, thus less aliasing)
<code>kf</code>	scaling factor for the lowpass frequency; $1 = \text{Nyquist}$, $1.2 = 1.2 \times \text{Nyquist}$ is a tradeoff between reducing variance loss and keeping aliasing small

`method.interpolation`

'linear' or 'constant', see `approx`

`method.filter`

To avoid loosing data at the ends of the dataset, endpoint constraints are used (see `ApplyFilter`) no constraint (loss at both ends) (`method=0`), only works if `t.x` covers more time than `time.target` minimum norm constraint (`method=1`) minimum slope constraint (`method=2`) minimum roughness constraint (`method=3`) circular filtering (`method=4`)

Value

ts object with the equidistant timeseries

Author(s)

Thomas Laepple

MeanSpectrum	<i>average spectra with weighting</i>
--------------	---------------------------------------

Description

Calculate the weighted mean spectrum of all spectra by interpolating them to the highest resolution frequency grid and averaging them.

Spectra can have different resolution and span a different freq range.

Usage

```
MeanSpectrum(specList, iRemoveLowest = 1, weights = rep(1, length(specList)))
```

Arguments

`iRemoveLowest` number of lowest frequencies to remove (e.g. to remove detrending bias)

`weights` vector of weights (same length as elements in `speclist`)

`speclist` list of spectra

Value

`list(spec, nRecords)` `spec`=average spectrum, `nRecords` = number of records contributing to each spectral estimate

Author(s)

Thomas Laepple

MonthlyFromDaily	<i>Bin daily values to monthly values</i>
------------------	---

Description

Assumes months of equal length and a 365 day long year

Usage

```
MonthlyFromDaily(ts.daily)
```

Arguments

ts.daily vector of 365 values

Value

vector of 12 values

Author(s)

Thomas Laepple

NaFillTs	<i>NaFill</i>
----------	---------------

Description

NaFill

Usage

```
NaFillTs(x)
```

Arguments

x

Value

filled x

Author(s)

Thomas Laepple

PS.VarUntilF	<i>Variance of a powerlaw process if integrated from until frequency f</i>
--------------	---

Description

Integral of $PSD=f^{(-\beta)}$ from $f_1=1/N$ to $f_2=f$ this equals the variance of a lowpass filtered powerlaw process WARNING: The result is not normalized

Usage

```
PS.VarUntilF(f, beta, N)
```

Arguments

f	frequency until which to integrate
beta	powerlaw slope
N	length of the timeseries

Value

non-normalized variance

Author(s)

Thomas Laepple

Examples

```
beta <- 1
signal <- ts(SimPowerlaw(beta,100000))
spec <- SpecMTM(signal)
v1 <- GetVarFromSpectra(spec,f=c(1/length(signal),0.5))
v2 <- GetVarFromSpectra(spec,f=c(1/length(signal),0.01))
PS.VarUntilF(0.01,beta,length(signal))/PS.VarUntilF(0.5,beta,length(signal))
v2$var/v1$var
```

PSP.CorAfterRollmean	<i>Numerical correlation of random timeseries with different filtering (running mean)</i>
----------------------	---

Description

Numerical correlation of random timeseries with different filtering (running mean)

Usage

```
PSP.CorAfterRollmean(N, betaSignal, betaNoise, R)
```

Arguments

N	Number of points of the timeseries
betaSignal	powerlaw slope of the signal
betaNoise	powerlaw slope of the noise
R	expected correlation of the whole timeseries

Value

correlation of unfiltered, 10point mean and 50 point mean

Author(s)

Thomas Laepple

Examples

```
temp <- replicate(1000,PSP.CorAfterRollmean(1000,1,0,0.5))
rowMeans(temp)
PSP.CorUntilF(c(0.5,0.5/10,0.5/50),1,0,1000,0.5)
```

PSP.CorUntilF	<i>lowpass filtered expected correlation of powerlaw signal pair</i>
---------------	--

Description

Correlation of two timeseries with powerlaw signal and powerlaw noise evaluated until f this equals the correlation of linearly coupled lowpass filtered powerlaw process

Usage

```
PSP.CorUntilF(f, betaSignal, betaNoise, N, r)
```

Arguments

f	frequency until which to integrate
betaSignal	powerlaw slope of the signal
betaNoise	powerlaw slope of the noise
N	Number of points per timeseries
r	expected correlation of the unfiltered

Value

expected correlation of the timeseries

Author(s)

Thomas Laepple

Examples

```
temp <- replicate(1000,PSP.CorAfterRollmean(1000,1,0,0.5))
rowMeans(temp)
PSP.CorUntilF(f=c(0.5,0.5/10,0.5/50),betaSignal=1,betaNoise=0,N=1000,r=0.5)
```

SimFromEmpiricalSpec	<i>Simulate a random timeseries consistent with an arbitrary numerical power spectrum</i>
----------------------	---

Description

Adapted from SimPowerlaw

Usage

```
SimFromEmpiricalSpec(spec, N)
```

Arguments

spec	Numerical power spectrum consisting of a list with components \$freq and \$spec
N	length of timeseries to be generated

Value

vector containing the timeseries

Author(s)

Thomas Laepple and Andrew Dolman

See Also

Other SimPowerlaw SimPLS SimFromEmpiricalSpectrum: [SimPowerlaw\(\)](#)

Examples

```
# Create a piecewise spectrum

## helper function to generate continuous piecewise spectrum

PiecewiseLinear <- function(x, val.at.min.x, breaks, slopes){

  breaks <- c(-Inf, breaks, Inf)
  slp.vec <- slopes[findInterval(x, breaks)]
  d.x <- diff(x)
  d.y <- c(d.x * tail(slp.vec, -1))

  y <- cumsum(c(val.at.min.x, d.y))

  data.frame(x, y)

}

slps <- c(-1, -0.5, -1)
brks <- c(1e-03, 1e-02)
emp.spec <- PiecewiseLinear(log(seq(1/1e05, 1/2, 1/1e05)), 0, log(brks), slps)
emp.spec <- exp(emp.spec)
names(emp.spec) <- c("freq", "spec")
```

```

plot(emp.spec, type = "l", log = "xy")

# Sample consistent with spectrum
ts1 <- ts(SimFromEmpiricalSpec(emp.spec, 50000))

# re-estimate power spectrum
spec1 <- SpecMTM(ts1)
LPlot(spec1)
lines(emp.spec, col = "Red")
abline(v = brks, col = "Green")

```

SimPLS

*Simulate a random timeseries with a powerlaw spectrum***Description**

This function creates a power-law series. It has the problem that it effectively produces (fractional) Brownian bridges, that is, the end is close to the beginning (cyclic signal), rather than true fBm or fGn series.

If $\alpha \neq 0$, then the EXPECTED PSD is equal to $\alpha \cdot f^{(-\beta)}$.

If $\alpha = 0$, then the timeseries is normalized such that it has EXPECTED variance $\text{abs}(\alpha)$, and the EXPECTED PSD is proportional to $f^{(-\beta)}$.

Usage

```
SimPLS(N, beta, alpha = -1)
```

Arguments

N	length of timeseries to be generated
beta	Slope of the powerlaw. $\beta = 1$ produces timeseries with -1 slope when plotted on log-log power ~ frequency axes
alpha	the constant. If $\alpha \neq 0$ this is the parameter $\alpha \cdot f^{(-\beta)}$. If $\alpha = 0$, the variance of the returned timeseries is scaled so that its expected value is $\text{abs}(\alpha)$

Value

a vector containing the timeseries

Author(s)

Torben Kunz, Andrew Dolman

Examples

```

# With a beta = 1 and alpha = 0.1
set.seed(202010312)
ts1 <- ts(SimPLS(N = 1000, beta = 1, alpha = 0.1))
plot(ts1)
sp1 <- SpecMTM(ts1)
LPlot(sp1)

```

```

abline(log10(0.1), -1, col = "Red")

# beta = 0.5, alpha = 0.4
ts2 <- ts(SimPLS(1000, beta = 0.5, alpha = 0.4))
plot(ts2)
sp2 <- SpecMTM(ts2)
LPlot(sp2)
abline(log10(0.4), -0.5, col = "Red")

# beta = 1, alpha = -2
ts3 <- ts(SimPLS(1000, 1, alpha = -2))
plot(ts3)
var(ts3)

# the EXPECTED variance is -2, for a given random timeseries the actual value will differ
rep.var <- replicate(100, {
  var(SimPLS(1000, 1, -2))
})

hist(rep.var)
abline(v = 2, col = "Red")
mean(rep.var)

```

SimPowerlaw

Simulate a random timeseries with a powerlaw spectrum

Description

Simulate a random timeseries with a powerlaw spectrum

Usage

```
SimPowerlaw(beta, N)
```

Arguments

beta	slope
N	length of timeseries to be generated

Details

Method: FFT white noise, rescale, FFT back, the result is scaled to variance 1

Value

vector containing the timeseries

Author(s)

Thomas Laepple

See Also

Other SimPowerlaw SimPLS SimFromEmpiricalSpectrum: [SimFromEmpiricalSpec\(\)](#)

SimPowerlawPiecewise	<i>Simulate a timeseries with length N which has a spectra consisting of two powerlaws</i>
----------------------	--

Description

Simulate a timeseries with length N which has a spectra consisting of two powerlaws

Usage

```
SimPowerlawPiecewise(beta1, beta2, N, deltat = 1, breakpoint = 1/50)
```

Arguments

beta1	slope for frequencies lower than breakpoint
beta2	slope for frequencies higher than breakpoint
N	Number of points to simulate
deltat	timestep of the timeseries
breakpoint	frequency of the breakpoint

Value

N random numbers drawn according to the piecewise powerlaw PSD

Author(s)

Thomas Laepple

SimulatePowerlawSignalPair	<i>Create a pair of random signals with powerlaw signal and powerlaw noise</i>
----------------------------	--

Description

The timeseries have an expected variance of 1 and an expected correlation of r

Usage

```
SimulatePowerlawSignalPair(n, beta.signal, beta.noise, r)
```

Arguments

r	expected correlation between both vectors
N	Number of points per timeseries
betaSignal	powerlaw slope of the signal
betaNoise	powerlaw slope of the noise

Value

list containing both vectors y1 and y2

Author(s)

Thomas Laepple

Examples

```
mean(replicate(1000,{test <- SimulatePowerlawSignalPair(200,1,1,0.5);cor(test$y1,test$y2)}))
```

SlopeFit	<i>Fit a power-law to the spectrum</i>
----------	--

Description

Fit a power-law to the spectrum

Usage

```
SlopeFit(
  spec,
  freq.start = NULL,
  freq.end = NULL,
  bDebug = TRUE,
  breaks = NULL,
  indexRemove = NULL,
  df.log = 0.05,
  i.fStart = 4
)
```

Arguments

<code>freq.start</code>	vector containing the start frequencies of the fitting interval(s)
<code>freq.end</code>	vector containing the end frequencies of the fitting interval(s)
<code>bDebug</code>	(TRUE) plot diagnostics
<code>breaks</code>	vector of breakpoints to which the spectra is binned (optional)
<code>indexRemove</code>	bins that are removed (e.g. containing the annual and semiannual cycle)
<code>df.log</code>	resolution of the bins (if breaks are not provided)
<code>i.fStart</code>	index of first (lowest) frequency to be used

Value

```
list(slope=slope,slopesd=slopesd,spec=saveSpec,freq=binFreq,intercept=intercept)
```

Author(s)

Thomas Laepple

smoothlin.cutEnd	<i>smoothlin.cutEnd</i>
------------------	-------------------------

Description

smoothlin.cutEnd

Usage

```
smoothlin.cutEnd(x, f, df.log, dof = 1)
```

Value

smoothed x

Author(s)

Thomas Laepple

smoothlog	<i>smoothlog</i>
-----------	------------------

Description

smoothlog

Usage

```
smoothlog(x, f, df.log)
```

Value

smoothed x

Author(s)

Thomas Laepple

<code>smoothlog.cutEnd</code>	<i>smoothlog.cutEnd</i>
-------------------------------	-------------------------

Description

`smoothlog.cutEnd`

Usage

`smoothlog.cutEnd(x, f, df.log, dof = 1)`

Value

smoothed x

Author(s)

Thomas Laepple

<code>SpecInterpolate</code>	<i>Interpolates the spectrum spec to the specRef frequency resolution</i>
------------------------------	---

Description

Interpolates the spectrum spec to the specRef frequency resolution

Usage

`SpecInterpolate(freqRef, spec)`

Arguments

<code>freqRef</code>	frequency vector of the target resolution
<code>spec</code>	<code>list(spec,freq,dof)</code>

Value

one spectrum as `list(spec,freq,dof)` (spec on the specRef resolution)

Author(s)

Thomas Laepple

SpecMean	<i>Mean spectrum from of a list of spectra</i>
----------	--

Description

Mean spectrum from of a list of spectra

Usage

```
SpecMean(speclist, weight = FALSE, dof = TRUE)
```

Arguments

speclist	list of spectra each containing list(spec, freq, dof)
weight	weight by the uncertainty

Details

Returns the mean of the spectra Inputs: speclist[[*i*]], each containing a list(spec,freq,dof)
spec[specIndex]: spectra density vector freq[specIndex]: frequency vector dof[specIndex]:
DOF ... or a single value df weight: weight by the uncertainty

Weighting by $1/\sigma^2$; $\sigma^2 = \text{variance}$ is proportional to $1/\text{DOF}$

This is true if we assume a constant spectral density... if not, higher spectral densities have higher uncertainty

Value

the mean spectra

SpecMTM	<i>MTM spectral estimator</i>
---------	-------------------------------

Description

calls `spec.mtm` from library multitaper

Usage

```
SpecMTM(
  timeSeries,
  k = 3,
  nw = 2,
  nFFT = "default",
  centre = c("Slepian"),
  dpssIN = NULL,
  returnZeroFreq = FALSE,
  Ftest = FALSE,
  jackknife = FALSE,
  jkCIProb = 0.95,
```

```

    maxAdaptiveIterations = 100,
    plot = FALSE,
    na.action = na.fail,
    returnInternals = FALSE,
    detrend = TRUE,
    bPad = FALSE,
    ...
)

```

Arguments

timeSeries	A time series of equally spaced data, this can be created by the <code>ts()</code> function where <code>deltat</code> is specified.
k	a positive integer, the number of tapers, often $2 * \text{nw}$.
nw	a positive double precision number, the time-bandwidth parameter.
nFFT	This function pads the data before computing the fft. <code>nFFT</code> indicates the total length of the data after padding.
centre	The time series is centred using one of three methods: expansion onto discrete prolate spheroidal sequences ('Slepian'), arithmetic mean ('arith-Mean'), trimmed mean ('trimMean'), or not at all ('none').
dpssIN	Allows the user to enter a <code>dpss</code> object which has already been created. This can save computation time when Slepian's with the same bandwidth parameter and same number of tapers are used repeatedly.
returnZeroFreq	Boolean variable indicating if the zeroth frequency (DC component) should be returned for all applicable arrays.
Ftest	Boolean variable indicating if the Ftest result should be computed and returned.
jackknife	Boolean variable indicating if jackknifed confidence intervals should be computed and returned.
jkCIProb	Decimal value indicating the jackknife probability for calculating jackknife confidence intervals. The default returns a 95% confidence interval.
maxAdaptiveIterations	Maximum number of iterations in the adaptive multitaper calculation. Generally convergence is quick, and should require less than 100 iterations.
plot	Boolean variable indicating if the spectrum should be plotted.
na.action	Action to take if NAs exist in the data, the default is to fail.
returnInternals	Return the weighted eigencoefficients, complex mean values, and so on. These are necessary for extensions to the multitaper, including magnitude-squared coherence (function <code>mtm.coh</code> in this package). Note: The internal (<code>\$mtm</code>) variables <code>eigenCoefs</code> and <code>eigenCoefWt</code> correspond to the multitaper eigencoefficients. The eigencoefficients correspond to equation (3.4) and weights, <code>eigenCoefWt</code> , correspond to $\sqrt{1 - d_k(f)^2}$ from equation (5.4) in Thomson's 1982 paper. This is because the square root values contained in <code>eigenCoefWt</code> are commonly used in additional calculations (example: <code>eigenCoefWt * eigenCoefs</code>). The values returned in <code>mtm\$cmv</code> correspond to the estimate of the coefficients $\hat{\mu}(f)$ in equation (13.5) in Thomson (1982), or to the estimate of \hat{C}_1 at frequency 1 in equation (499) from Percival and Walden (1993).

detrend	logical, detrend timeseries before estimating the spectrum
bPad	if FALSE (the default) nFFT is set to the length of the timeseries
...	Additional parameters, such as xaxs="i" which are passed to the plotting function. Not all parameters are supported.

Value

spectra object list(freq, spec, dof)

Author(s)

Thomas Laepple

Examples

```
x <- ts(arima.sim(list(ar = 0.9), 1000))
spec <- SpecMTM(x)
LPlot(spec, col='grey')
LLines(LogSmooth(spec), lwd=2)
```

SubsampleTimeseriesBlock

Subsample (downsample) timeseries using block averaging#'

Description

Resample a equidistant timeseries (e.g. model result) at the 'timepoints' using block averaging. The blocks are divided at 1/2 time between the requested output points. For the first (and last) timepoint, the interval starting mean(diff(timepoints)) before (ending after) are used. Example usage is to downsample a model timeseries to mimick an integrating proxy (e.g. water isotopes that are measured by melting pieces of ice).

Usage

```
SubsampleTimeseriesBlock(ts, timepoints)
```

Arguments

ts	ts object or vector containing the equidistant timeseries
timepoints	vector with the points in time

Value

values at timepoints

Author(s)

Thomas Laepple

Examples

```
input <- ts(SimPowerlaw(0.5, 1000))
timepoints <- seq(from = 50, to = 950, by = 50)
result <- SubsampleTimeseriesBlock(input, timepoints)
plot(input, main = "Comparison of block avg. vs. simple interpolation",
      ylab = "unitless")
points(timepoints, result, pch = 19, col = "red", lwd = 3)
points(approx(time(input), c(input), timepoints), col = "green",
       pch = 10, lwd = 3)
legend("bottom", col = c("black", "red", "green"), lwd = 2, bty = "n",
      c("High-resolution timeseries (input)", " Block Avg", "interpolated values"))
```


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