Package 'reprDays'

October 27, 2021

Version 1.0

Title Representative days using PCA and hierarchical clustering
Description Generates representative days for each season for a single region or across different regions. Methods are Principal Component Analysis (PCA) and for comparison also hierarchical clustering
Depends R (>= $3.1.0$)
Imports corrplot, copula, fitdistrplus, spatstat, xts
<pre>URL https://gitlab.psi.ch/energy-economics-group/representative-days</pre>
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RoxygenNote 7.1.1
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Description

Package for article *Low-dimensional scenario generation method of solar and wind availability for representative days in energy modeling*, Applied Energy, in press. https://doi.org/X

Details

The package provides different categories of functions:

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Import

- · Read hourly solar and wind generation data, and optionally load data
 - Current data is from ENTSO-E's transparency platform. Data from countries DE and AT is converted to hourly. Data should all be in CET time-zone.
 - Provided data is of year 2017-2019 (State: Dec 2021)
 - Absolute wind and solar is converted to availabilities by using an auxiliary capacity data file
 - Absolute load data is normalized by dividing with high quantiles.
- Plot time-series of solar, wind (and load). Plot daily profiles per season and per country
- · Correlations of wind, solar, and load

PCA factor model

- Execute the PCA on the data vector
- · Make a principal component factor analysis
- Generate representaive-days scenarios using the factor models, and plot the scenarios

Analysis of accuracy of scenarios

Compare the scnearios with empirical data and incraeasing scenario number:

- Compare correlations
- Compare ECDF with empirical data
- Compare availability per season

Hierarchical clustering using medoids

Generate representative days by clustering. Given a season, single and cross-regional scenarios can be generated

Cross-regional scenarios

- Analysis of daily wind and solar correlations across regions (countries)
- Estimation of joint extreme solar and wind availabilities
- Fitting guassian copulas and t-copulas to daily cross-regional wind and solar data
- Random sampling of copulas
- Given a season, join daily cross-regional random samples with (aggregated from hourly to daily) regional scenarios to provide consistent hourly scenarios across regions

Auxiliary function (selection)

 Aggregate availabilities to 96 (24*4) load-period availabilities and write to "avlBEM.csv" for use in BEM 4 avg.Cols

agggregate.avl.BEM

Average wind and solar availability to the 96 loadperiods of BEM per country

Description

A convenience function for BEM. Not required for PCA or clustering.

Usage

```
agggregate.avl.BEM(xSWH)
```

Arguments

xSWH

Data in wide format, as returned by x.24wide

Value

Data.frame of solar and wind availability for each load period and for each country

- rows: 5 * 96 (countries x seasons x hours), e.g., "AT.WI-D-01"
- columns: "solar", "wind"

avg.Cols

Replace some data columns by a single, averaged column

Description

Replace some data columns by a single, averaged column

Usage

```
avg.Cols(
   x,
   avgCols = c("ATsolar", "DEsolar", "CHsolar", "ITsolar", "FRsolar"),
   newColname = "solar"
)
```

Arguments

x xts time-series

avgCols Data columns to be merged newColname Name of merged column

avl.emp 5

avl.emp

Seasonal availability factors from empirical data

Description

Seasonal availability factors from empirical data

Usage

```
avl.emp(x)
```

Arguments

Χ

time-series of data (xts)

avl.PCA

Seasonal availability factors implied by PCA

Description

Seasonal availability factors implied by PCA

Usage

```
avl.PCA(scnBEM)
```

Arguments

scnBEM

Data-frame

Value

avlPCA Array

binomSd

Discretized standard binomial distribution

Description

Discretized standard binomial distribution

Usage

```
binomSd(j)
```

binomSdProb(j)

6 contour.plot

Arguments

j Number of disretization (yields j+1 values)

Value

binomSd returns values (j=0 yields 0); binomSdProb returns probabilities

Examples

```
bimonSd(2)
binomSdProb(2)
```

clust.medoid

Get the medoid of each cluster

Description

Get the medoid of each cluster

Usage

```
clust.medoid(i, distmat, clusters)
```

Arguments

i Index

distmat Distance matrix between points

clusters Clusters

contour.plot

Contour plot of correlation matrix

Description

Contour plot of correlation matrix

Usage

```
contour.plot(correl, title.cont, cty, s, triang = TRUE, oldVer = FALSE)
```

Arguments

correl Correlation matrix title.cont Title of contour plot

cty Country or l-separated list of countries, used for labeling

s Season, used for labeling

triang Plot only upper triangle? (default: TRUE)

oldVer Plot old version with other color codes, whereas new version asfixed levels?

(default: TRUE)

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contour.wide24 Contour plot of correlations of data in wide format

Description

Contour plot of correlations of data in wide format

Usage

```
contour.wide24(
  xSWH,
  cty = "DE|IT",
  seas = c("SP", "SU"),
  yrRange = "2017-2019",
  upper.triangle = TRUE,
  subrange = FALSE,
  old.version = FALSE,
  plot2pdf = FALSE
)
```

Arguments

xSWH	Data in wide format, as returned by x.24wide
cty	Country, single or multiple countries (default: "DE IT")
seas	Season (single or multiple seasons (default: c("SP", "SU"))
yrRange	Used in title of plot (default: "2017-2019")
upper.triangle	Plot only upper triangle? (default: TRUE)
subrange	Plot only correlation between solar and wind (and not e.g. between hours of solar)? (default: FALSE)
old.version	Plot old version with other color codes, whereas new version asfixed levels? (default: TRUE)

Examples

```
## Not run:
contour.wide24(1.wide24, "DE", "SU", "2017-2019")
## End(Not run)
```

daily.cor.cross

Daily cor-matrix of wind a solar between countries

Description

Daily cor-matrix of wind a solar between countries

Usage

```
daily.cor.cross(x, seas = seasNames, plot2pdf = FALSE)
```

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar",

etc.

seas Season (seas = seasNames gives whole year)

Value

correlation matrix

Examples

```
## Not run:
daily.cor.cross(x.d, "SU")
daily.cor.cross(x.d, seasNames)
## End(Not run)
```

```
daily.cor.cross.simple
```

Simplified daily correlation matrix of wind and solar between countries

Description

Solar is no longer country-specific

Usage

```
daily.cor.cross.simple(x, seas = seasNames, plot2pdf = FALSE)
```

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar",

etc.

seas Season (seas = seasNames gives whole year)

Value

correlation matrix

dayHourPerSeason 9

dayHourPerSeason	Get data.frame of hourly wind+solar avl. per season in wide-format (hours are in columns)
------------------	---

Description

Get data.frame of hourly wind+solar avl. per season in wide-format (hours are in columns)

Usage

```
dayHourPerSeason(x, cty, s, load = FALSE)
```

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar", etc.
cty Country
s Seasons given as vector of month numbers (1-12)

Value

- 48-column data.frame of solar and wind for specified months
- if also load: 72-column df of solar, wind, and load)
- column names: "solarDE01", "solarDE02",...,"windDE24" ("loadDE24")
- · Note: Length of columns can be different for different choices of seasons

Examples

```
## Not run:
dayHourPerSeason("AT",3)
dayHourPerSeason("DE", 4:9) # summer halfyear
dayHourPerSeason("DE", c(1,2,3,10,11,12)) # winter halfyear
## End(Not run)
```

diff.avl

Difference in Availability: PCA and Empirical (Analysis only for DE)

Description

Print differences for DE and plot

Usage

```
## S3 method for class 'avl'
diff(avlPCA, avl, plot2pdf = FALSE)
```

Arguments

```
avlPCA Array returned from avl.PCA Array returned from avl.emp
```

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discrWeibull

Get values and probabilities of a discretized Weibull distribution

Description

Intervals are equally spaced from quantiles: 0.1/i up to 1-0.1/i. Values are the mid-points of the intervals.

Usage

```
discrWeibull(i, pWeib)
```

Arguments

i Number of values

pWeib Parameters from fitting returned by fitWeibull

Value

: Matrix with two columns: probability, value

facAnalysis

Factor-Analysis

Description

Factor-Analysis of first three PC

Usage

```
facAnalysis(
  fac,
  logFac1 = FALSE,
  logFac2 = FALSE,
  logFac3 = FALSE,
  plot2pdf = FALSE
)
```

Arguments

fac

Daily time series of factors as returned by PCAfac

Value

List fitParam with elements:

```
"mean" c(mF1, mF2, mF3)
"std" c(sF1, sF2, sF3)
"weibull" parWeibull (as returned by fitWeibull
```

fit.nC.and.sample

fit.nC.and.sample

Fit normal-copula from correlation matrix c.d.small, and sample

Description

Fit normal-copula from correlation matrix c.d.small, and sample

Usage

```
fit.nC.and.sample(c.d.small, sample.size = 20)
```

Arguments

c.d.small Time-series data (in paper: daily data)

sample.size Number of random samples

fit.tC.and.sample

Fit t-copula to data, and sample

Description

Works only well with per season data. Attention: Symmetric copula.

Usage

```
fit.tC.and.sample(x.d.small, sample.size = 20)
```

Arguments

x.d.small Time-series data (in paper: daily data)

sample.size Number of random samples

fitWeibull

Fit a Weibull distribution from data

Description

Before the fitting, the input data is shifted such that most of the values becomes positive, which may alos require an optional sign-reversion (if data was mainly nonnegative)

Usage

```
fitWeibull(data)
```

Arguments

data

Vector of data

12 hour

Value

Vector with components:

- 1. Shape and scale parameters of fitted Weibull distribution
- 2. Sign reversion and shift (applied before fitting)

get.nearest

describeIn scn.cross

Description

describeIn scn.cross

Usage

```
get.nearest(x, y)
```

hour

Extract hours and months

Description

Extract hours and months

Usage

```
hour(x)
```

month(x)

Arguments

Х

Time-date, can be a vector of dates (format: POSIXct)

Value

```
Hour of day (= 0-23), or index of month (= 1-12)
```

Examples

```
hour(as.POSIXct("2012-10-19"))
```

hourOfDay 13

hourOfDay

Get hour and year of a date

Description

Helper function to plot seasonal day-hour value

Usage

```
hourOfDay(t)
```

Arguments

t

Date-time

Value

```
Hour and year (e.g. "02 2017")
```

1.stacked.All

Data over seasons for all countries

Description

Used to prepare data for external use, e.g. for external clustering. Convert time series first to UTC to avoid duplicated hours

Usage

```
1.stacked.All(x)
daysPerSeason(x, cty, seas)
```

Arguments

```
x Time series with columns "ATsolar", "ATwind",..., "ITwind" (xts-class) cty, seas Country and season
```

Value

List of data.frames over seasons. Given a season, the columns of the data.frame are "ATsolar", \dots , "ITwind"; the rows are the hourly data in the season

Functions

• daysPerSeason:

14 lambda.t

lambda.nonpar

Non-parametric fit of lambda

Description

Best fits are for single season, e.g. "SU"

Usage

```
lambda.nonpar(x)
```

Arguments

Х

An xts-time series (for the paper, this is a daily time-series, usually denoted by x.d)

Examples

```
## Not run:
lambda.non.param(x.d)
## End(Not run)
```

lambda.t

Lambda from t-distribution

Description

Lambda from t-distribution is symmetric: counterfactual

Usage

```
lambda.t(x)
f.display(y, row.col.names)
```

Arguments

x An xts-time series (for the paper, this is a daily time-series, usually denoted by

y numeric argument

Value

rounded argument with row and column names set

Functions

• f.display: Round numeric argument and set row and column names

load.24

Examples

```
## Not run:
lambda.t(x.d)
## End(Not run)
```

load.24

Vector of load-period tags in a season

Description

Vector of load-period tags in a season

Usage

```
load.24(seas, n = 24)
```

Arguments

seas Season

Number of load periods in a day (default: 24)

Value

```
c("WI-D-01",...,"FA-D-24")
```

PCAfac

PCA for a single season and country

Description

There can be several seasons (together) and countries (additional dimension)

Usage

```
PCAfac(
  xSWH,
  cty = "DE",
  season = "SP|SU",
  m = 4,
  deMean = FALSE,
  plot2pdf = FALSE,
  load = FALSE
)
```

16 plot24

Arguments

xSWH	List over seasons of data in wide format (day hours are in columns). Given a
	season, a list element is a data.frame with columns "ATsolar01", "ATsolar02'
	etc., and rows = observations in the season; as returned by $x.24$ wide

cty Country season Season

m Number of loadings to plot

deMean Should data first be de-meaned? (default: FALSE)
plot2pdf Should plots be copied to pdf? (default: FALSE)

load If load is included make a different pdf file name (default: FALSE)

Details

Log-normal factors gave usually bad results. Avoid!

Value

list: 1. Factors implied by PCA over the input data points (rows), that is, a daily time series of factors (class: matrix); 2. pcaloads

Examples

```
## Not run:
PCAsingle("DE|IT","SU")
PCAsingle("AT","SU")
PCAsingle("DE","WI|SP|SU|FA")
## End(Not run)
```

plot24

Plot the seasonal (averaged) day-hour data

Description

The number of seasons is currently hardcoded: 4 seasons

Usage

```
plot24(x, cols, yr = c("2017", "2018", "2019"), xpd = FALSE)
```

Arguments

X	Time series (xts class) containing hourly data with column names "ATsolar", etc.; as returned sel.wind
cols	column to plot
yr	list of years (default: c("2017","2018","2019"))
xpd	expand the dispay (required for plots of wind)

plotCor.Emp 17

Examples

```
## Not run:
windows(); plot24(x,"ATsolar"); dev.print(pdf, "ATsolar.pdf")
windows(); plot24(x,"ATwind", TRUE)
## End(Not run)
```

plotCor.Emp

Plot correlations of empirical data

Description

Plot correlations of empirical data

Usage

```
plotCor.Emp(xSWH, cty = "DE", s = "SU", oldV = FALSE, plot2pdf = FALSE)
```

Arguments

xSWH	List of scenarios over countries of type <i>scnBEM</i> (see help scn.clust), as returned by scn.All
cty	Country
S	Season

plotCor.genClust

Clustering: Generate scenarios and plot correlations

Description

Clustering: Generate scenarios and plot correlations

Usage

```
plotCor.genClust(
  xSWH,
  cty = "DE",
  s = "SU",
  n = 20,
  oldV = FALSE,
  plot2pdf = FALSE
```

Arguments

xSWH List over seasons of data in wide format (day hours are in columns). Given a season, a list element is a data.frame with columns "ATsolar01", "ATsolar02' etc., and rows = observations in the season.

cty Country s Season 18 plotECDF

Value

covariance-matrix

plotCor.genPCA

PCA factor model: Generate scenarios and plot correlations

Description

PCA factor model: Generate scenarios and plot correlations

Usage

```
plotCor.genPCA(
  xSWH,
  cty = "DE",
  s = "SU",
J = c(5, 2, 1),
  oldV = FALSE,
  plot2pdf = FALSE,
  textArg
```

Arguments

xSWH	List over seasons of data in wide format (day hours are in columns). Given a season, a list element is a data.frame with columns "ATsolar01", "ATsolar02' etc., and rows = observations in the season.
cty	Country
	_

Season s

J J+1 = Number of realizations of factors

Optional argument to insert in title of plot textArg

Value

covariance-matrix

plotECDF

Check with empirical distribution function

Description

Plot empirical distribution function of wind and solar. Select a season or entire year.

plotScn 19

Usage

```
plotECDF(
    scn.ws.or.comp,
    cty = "DE",
    s = seasNames,
    yrs = "2017-2019",
    comparePCA = FALSE,
    plot2pdf = FALSE,
    J.cases
)
```

Arguments

scn.ws.or.comp List of scenarios over countries of type *scnBEM* (see help scn.clust). If sensitivity analysis (comparison): List of single-country scenarios over the different

elements of J. cases. As returned by scn.All

cty Country

s Season (default is fully year: s=seasNames)

yrs Used for plot title, range of years

comparePCA Is it a sensitivity analysis (default: FALSE)

J. cases Parameters of sensitivity analysis, used in title of plot

Examples

```
## Not run:
plotEmpirical(scn.ws) # full year
plotEmpirical(scn.ws, s="SU") # SU
## End(Not run)
```

plotScn

Plot scenarios of PCA factor model

Description

Plot scenarios for selected country and season.

Usage

```
plotScn(scnAll, cty = "DE", s = "SU")
```

Season

Arguments

s

scnAll List of scenarios over countries of type *scnBEM* (see help scn.clust), as returned by scn.All

cty Country

20 reduce.cor

plotScnData

Plot scenarios generated from a PCA factor model

Description

The probability of a scenarios is proportional to the line width.

Usage

```
plotScnData(scnData, cty, season, plot2pdf = FALSE)
```

Arguments

scnData

Scenarios as returnd by scn. PCAfac

Details

For the used rainbow palette you can also select start/end color (red = 0, yellow = 1/6, green = 2/6, cyan = 3/6, blue= 4/6 and magenta = 5/6) and saturation (s) and value (v): rainbow(n, s = 1, v = 1, start = 0, end = max(1, n - 1)/n, alpha = 1)

reduce.cor

Reduce correlation matrix (remove cross-regional solar correlations)

Description

Reduce correlation matrix (remove cross-regional solar correlations)

Usage

```
reduce.cor(x, seas)
```

Arguments

Time series (xts class) containing hourly data with column names "ATsolar",

etc.

seas Season (seas = seasNames gives whole year)

scn.All

scn.All

Create scenarios for all countries and all seasons

Description

Combination of previous functions: scn.PCAfac etc. Sensitivity analysis of a single country w.r.t different J is also possible

Usage

```
scn.All(
  xSWH,
  J.cases = list(c(5, 2, 1)),
  thresMin = -0.1,
  thresMinDeMean = -0.01,
  weibFac1 = TRUE,
  comparePCA = FALSE,
  compareCty = "DE",
  logFac = c(FALSE, FALSE, FALSE, FALSE, FALSE))
```

Arguments

List of vectors of factor realizations, e.g. list(c(5,2,1)); usually the list has just a element. Sensitivity analysis is also possible with more list elements

thresMin

Bound to identify a pathological, negative avl. scenario

thresMinDeMean

Different bound if data was de-meaned

weibFac1

The first factor is fitted to weibull? (default: TRUE)

comparePCA

Sensitivity analysis? (default: FALSE)

compareCty

Country of sensitivity analysis (default: "DE")

logFac

Switches for log-normal factors (default: FALSE)

Value

List of scenarios over countries of type *scnBEM* (see help scn.clust). If sensitivity analysis: List of single-country scenarios over the different elements of J.cases

Examples

```
## Not run:
scn.All(J.cases = list(c(5,2,1)))
scn.All(J.cases = list(c(5,0), c(5,2,0), c(5,2,1)))
## End(Not run)
```

22 scn.clust

scn.clust Cluster by hierarchical method using medoids

Description

Single countries or multiple countries can be selected, whereas only a single season can be specified. The agglomerative, hierarchical clustering uses a method, which is a dissimilarity measure between clusters (so-called Linkage):

"ward.D2" (**default**) Ward's method. Minimizes variance of (potentially) merged clusters (ward "likes" to produce clusters of equal sizes; "ward.D" was coded wrongly)

"average" (= UPGMA): average distance between all points of two clusters

"complete" Highest distance between point-pairs of two clusters

"single" Smallest distance between point-pairs of two clusters

Usage

```
scn.clust(
  xSWH,
  nclus = 20,
  cty = "DE",
  s = "SU",
  interactive = FALSE,
  crossCountry = FALSE,
  clustmethod = "ward.D2",
  distmeasure = "euclidean"
)
```

Arguments

xSWH	List over seasons of data in wide format (day hours are in columns). Given a season, a list element is a data.frame with columns "ATsolar01", "ATsolar02' etc., and rows = observations in the season; as returned by $\times.24$ wide
nclus	Number of clusters
cty	Country (default: "DE"; several countries "AT CH DE FR IT")
S	Season (default: "SU")
interactive	Plot detailed diagonstic of clustering (dendogramm etc.)? (default: FALSE)
crossCountry	Cluster across countries (cty must have several regions)? (default: FALSE)
clustmethod	Cluster method, that is, the linkage (default: Ward's method)
distmeasure	Measure of distance between data points (default: "euclidean"). Other possible distances are e.g. "maximum" and "manhattan"

Value

For a single region, a data.frame (called *scnBEM*) of scenarios in stacked format is returned (i.e. the 24 day hours of scenario values are in rows):

scn country loadp prob windAvl solarAvl

scn.clust.cross 23

"o1"	"AT"	"WI-D-01"	0.01	0.3	0.0
"o1"	"AT"	"WI-D-02"	0.01	0.3	0.0
"o1"	"AT"		0.01		
"o1"	"AT"	"WI-D-24"	0.01	0.3	0.1
"o2"	"AT"	"WI-D-01"	0.02	0.3	0.0

For multiple regions, a list over the countries is returned, where each list element is data.frame of format *scnBEM*

scn.clust.cross Clustering of cross-country scenarios over all seasons
--

Description

Stack the cross-country scenarios over all the seasons. Hence, increase the scenario index, because different seasons have independent scenarios in the electricity market model BEM

Usage

```
scn.clust.cross(xSWH, nclust = 20)
```

Arguments

xSWH List over seasons of data in wide format (day hours are in columns). Given a

season, a list element is a data.frame with columns "ATsolar01", "ATsolar02'

etc., and rows = observations in the season; as returned by x.24wide

nclust Number of clusters

Value

scenarios over all countries over all seasons

scn.cross	Generate cross-country scenarios for seasonal data	

Description

Generate cross-country scenarios for seasonal data

Usage

```
scn.cross(scn.ws, s = "SU", rC, sample.size)
```

Arguments

scn.ws	List of scenarios over countries of type <i>scnBEM</i> (see help scn.clust)
S	Season
rC	$random\ samples\ as\ returned\ by\ \texttt{fit.nC.and.sample}\ or\ \texttt{fit.tC.and.sample}$
sample.size	Sample size corresponding to rC (can in fact be determined by the dimensions of rC)

24 scn.cross.write

scn.cross.plot

Plot cross-regional scenarios

Description

Plot cross-regional scenarios

Usage

```
scn.cross.plot(scn.ws.new, s = "SU", sample.size = 20, plot2pdf = FALSE)
```

Arguments

scn.ws.new

Cross-regional scenarios as returned by scn.cross

scn.cross.write

Concatenate cross-regional scenarios over seasons and write to file

Description

Concatenate cross-regional scenarios over seasons and write to file

Usage

```
scn.cross.write(scn.ws.new.year, sample.size = 20, tag = "")
```

Arguments

```
scn.ws.new.year
```

List of cross-regional scenarios over the seasons

sample.size Sample size: required to make correct scenario numbering: "o1", "o2", ...

tag String appended to file name

Examples

```
## Not run:
scn.cross.write(scn.ws.new.year, 20, "_tcopula")
## End(Not run)
```

scn.cross.year 25

scn.cross.year

Make cross-regional scenarios for all seasons

Description

Make cross-regional scenarios for all seasons

Usage

```
scn.cross.year(x, scn.ws, sample.size, tCop = TRUE)
```

Arguments

scn.ws List of scenarios over countries of type scnBEM (see help scn.clust)

sample.size Sample size corresponding to rC (CAN PERHAPS BE DETERMINED FROM

rC)

tCop Take t-copula instead of guassian copula? (default: TRUE)

rC random samples from copula, as rnC or rtC

Value

List of cross-regional scenarios over the seasons

scn.PCAfac

Generate scenarios given a PCA factor model

Description

Generate scenarios given a PCA factor model

Usage

```
scn.PCAfac(
  fitParam,
  pcaloads,
  m.sw,
  J1 = 5,
  J2 = 1,
  J3 = 1,
  threshold = -0.01,
  dropNeg = TRUE,
  logFac1 = FALSE,
  logFac2 = FALSE,
  logFac3 = FALSE
)
```

26 sel.wind

Arguments

pcaloads	Loadings as returned by PCAfac
m.sw	Mean values as returned by PCAfac
Ј1	J1+1 = number of scenarios for factor 1
Ј2	J2+1 = number of scenarios for factor 2
Ј3	J3+1 = number of scenarios for factor 3
threshold	Bound to identify a pathological, negative avl. scenario
dropNeg	Should such negative scenario be dropped? (default: TRUE)

Value

data-frame "scenData"

- row 1: probability of scenario
- row 2,...,48+1: scneario realization of wind and solar
- columns: "scn1", "scn2", ... "scn(smax)"

sel.wind Select for a country the wind: Onshore, Offshore, or On+Off?

Description

Select for a country the wind: Onshore, Offshore, or On+Off?

Usage

```
sel.wind(x, windType, cty = "DE", load = FALSE)
```

Arguments

X	Time series (xts class) containing hourly data with column names, "DE-ONwind", "DEOFFwind", "DEONOFFwind"; as returned by x.normalize or x.read
windType	1: onshore, 2: offhsore, 3: total
cty	Country (default: "DE")

Value

Time series with selected column (named "DEwind")

set.cty.seas 27

set.cty.seas

Set global parameters

Description

Initialize ctyNames, seasNames, seasons

Usage

```
set.cty.seas(
  cty = c("AT", "CH", "DE", "FR", "IT"),
  seas = c("WI", "SP", "SU", "FA"),
  month.idx = c(c(12, 1, 2), 3:5, 6:8, 9:11)
)
```

Arguments

cty Vector of country names
seas Vector of season names
month.idx Index of months of the seasons 1,...,12

Value

Global parameters:

```
ctyNames c("AT", "CH", "DE", "FR", "IT") seasNames c("WI", "SP", "SU", "FA") seasons Matrix: columns = "WI, "SP", "SU", "FA"; rows = month-index (1, \ldots, 12)
```

writeScnAll

Write scenarios over seasons and countries into files

Description

Write scenarios over seasons and countries into files

Usage

```
writeScnAll(scn.ws)
```

Arguments

scn.ws List of scenarios over countries of type *scnBEM* (see help scn.clust), as returned by scn.All

28 x.cor

x.24wide

Prepare data for PCA

Description

Assumption: The input time series is in CET, and we convert first to UTC. The conversion is required to get rid of the missing DST hours in the night. We do this before subsetting to a single year (else the last hour would be missed)

Usage

```
x.24wide(x, yr = "2017/2019")
```

Arguments

Χ

Time series (xts class) containing hourly data with column names "ATsolar", etc.

Value

List over seasons. A list element contains data.frame of all countries in wide forma (the day hours are in different columns)

• data.frame has 240 columns (2*24 hours (solar+wind) * 5 countries) with names: "solarCH01", "solarCH02", . . . , "windIT24"

x.cor

Correlation between solar, wind, and (optionally) load

Description

Prints correlation for different years. Currently, it must be three years. If load is read-in: Print correlation-test of load/wind of first year

Usage

```
x.cor(x, load = FALSE, yr = c("2017", "2018", "2019"))
```

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar", etc.; as returned by sel.wind

yr List of three years

x.daily 29

x.daily

Daily mean per season

Description

Daily mean per season

Usage

```
x.daily(x, seas)
```

Arguments

x xts-object

seas Season. Season can be whole year (s = seasNames)

x.normalize

Convert x into availability factors (divide by capacity):

Description

Generation is divided by end-of-year capacity. Load is dvidided by a high quantile of each year. Currently only DE has also Offshore wind

Usage

```
x.normalize(
   x,
   yearRead = c(2017, 2018, 2019),
   fn = "SolarWindcapacity.csv",
   load = FALSE,
   loadQuantile = 0.96
)
```

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar", etc.; as returned by x.read

fn File name of solar and wind capacities in csv format, with rows as years (e.g.

2017), and columns as country and tech (e.g. "ATsolar")

30 x.read

x.plot

Plot wind, solar (and load, if read-in) per country and per year

Description

Plot wind, solar (and load, if read-in) per country and per year

Usage

```
x.plot(x, cty, yr)
```

Arguments

```
x Time series (xts class) containing hourly data with column names "ATsolar", etc.; as returned by x.normalize or x.read
cty Country
yr Year (or a range of years in xts-notation)
```

Examples

```
## Not run:
plotSolarWind(x,"CH","2017\2019")
plotSolarWind(x,"CH","2018")
## End(Not run)
```

x.read

Load hourly wind, solar data (optionally also load)

Description

- The function works currently with only country DE having also offshore wind
- The wind and solar files must be named like "DE_Generation_2019 (ENTSO)HOURLY.csv"
- The load files must be named like "DE_Load_2019 (ENTSO)HOURLY.csv"

Usage

```
x.read(
  fn.path = "Data/",
  yearRead = c(2017, 2018, 2019),
  load = FALSE,
  colSol = "Solar.",
  colWiOn = "Wind.Onshore.",
  colWiDEOff = "DEWind.Offshore.",
  colLoad = "load"
)
```

x24Seas 31

Arguments

fn.path Path to ENTSO country files

Value

x Time series (xts class) containing hourly data with column names

- "ATsolar", "ATwind", ..., "ITwind", "DEOFFwind", "DEONOFFwind"
- If also load is read: "ATsolar", "ATwind", "ATload",...

x24Seas

Select columns from time series and simplify time index

Description

Select by year, by col-names, and reduce the time-index to the day-hour only

Usage

```
x24Seas(z, cols, year)
```

Arguments

z Time-series with time index like "23 2012"

cols Vector of column names to select

year Year (e.g. "2017")

Details

Helper function to plot seasonal day-hour value

Value

Data in specified year and columns, where the time-index is the day hour

x24SeasonYears Calculate mean-hourly values per season over selected columns and years

Description

Helper function to plot seasonal day-hour value

Usage

```
x24SeasonYears(x, cols, years = c("2017", "2018", "2019"))
```

32 x24Season Years

Arguments

x Time series (xts class) containing hourly data with column names "ATsolar", etc.; as returned sel.wind

cols Column-names of the time series to select (e.g. "ATsolar")

yr Years

Value

List mean values over years and seasons. List elements have names like "SP2017", contain a time series, with columns "ATsolar", etc., and with rows the mean values over the day hours

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