Package 'fractaldim'

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fractaldim-package

Estimating Fractal Dimensions

Description

Implements various methods for estimating fractal dimension of time series and 2-dimensional data.

Details

The package provides tools for estimating fractal dimension of one- or two-dimensional data, using methods described in Gneiting et al. (2010). The user can take an advantage of the available sliding window technique in which a window of a given size is slided along the data and an estimate is obtained for each position.

The main function is fd.estimate which can be used for one dimensional time series, as well as for two dimensional data. It computes one estimate for each method and each sliding window. It is a wrapper for lower level functions for computing just one estimate on the given data, see fd.estim.method for details.

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References

Gneiting, T., Sevcikova, H. and Percival, D. B. (2012). Estimators of fractal dimension: Assessing the smoothness of time series and spatial data. Statistical Science, 27(2), 247-277. <doi:10.1214/11-STS370> (Version as technical report available at https://stat.uw.edu/sites/default/files/files/reports/2010/tr577.pdf)

See Also

fd.estimate, fd.estim.method

fd.estim.method

Estimation of Fractal Dimension via Specific Methods

Description

The functions estimate a fractal dimension of the given data. Each function uses a different method. Functions for boxcount, hallwood, variogram, madogram, rodogram, variation, incr1, genton, periodogram, wavelet and dctII methods are to be used on one-dimensional time series. The remaining functions (transect, isotropic, squareincr, and filter1) are to be used on two-dimensional data.

Usage

```
fd.estim.boxcount (data, plot.loglog = FALSE, nlags = "auto",
    shift.up=TRUE, plot.allpoints = FALSE, legend.type = 's',
    \dots, debuglevel = 0)
fd.estim.hallwood (data, plot.loglog = FALSE, nlags = "auto",
   plot.allpoints = FALSE, legend.type = 's', ..., debuglevel = 0)
fd.estim.variogram (data, ...)
fd.estim.madogram (data, ...)
fd.estim.rodogram (data, ...)
fd.estim.variation (data, p.index = 1, ...)
fd.estim.incr1(data, p.index=2, ...)
fd.estim.genton (data, ...)
fd.estim.periodogram (data, plot.loglog = FALSE, nlags = "auto", ...)
fd.estim.wavelet (data, plot.loglog=FALSE, plot.allpoints = FALSE,
    filter = "haar", J1 = max(1,floor(log2(length(data))/3-1)),
    J0 = floor(log2(length(data))), legend.type = 's',
    \dots, debuglevel = 0)
fd.estim.dctII (data, plot.loglog = FALSE, nlags = "auto", ...)
fd.estim.transect.var (data, p.index = 2, ...)
fd.estim.transect.incr1 (data, p.index = 2, ...)
fd.estim.isotropic (data, p.index = 2, direction = 'hvd+d-',
    plot.loglog = FALSE, nlags = "auto", plot.allpoints = FALSE,
    legend.type = 's', ..., debuglevel=0)
fd.estim.squareincr (data, p.index = 2,
    plot.loglog = FALSE, nlags = "auto", plot.allpoints = FALSE,
    legend.type = 's', ..., debuglevel=0)
fd.estim.filter1 (data, p.index = 2, direction = 'hvd+d-',
   plot.loglog = FALSE, nlags = "auto", plot.allpoints = FALSE,
    legend.type = 's', ..., debuglevel=0)
```

Arguments

data	For the first eleven functions data is a one-dimensional vector. For the last five functions data is a matrix.
p.index	Parameter p of the variation method (see below).
direction	For the 2d estimators, this argument specifies the direction of the estimation (see details below). It can be any combination of the characters 'h' (horizontal), 'v' (vertical), 'd+' (diagonal with positive gradient), and 'd-' (diagonal with negative gradient). These characters should be combined into one string.
plot.loglog	Logical value determining if the underlying log-log plots should be plotted.
nlags	Number of lags to be used in the estimation. Possible values are "auto", "all" or a single number. If nlags = "auto", each method sets the number of lags to the theoretically "best" value for that method. "all" means that all lags are included in the estimation.
shift.up	For each interval on the horizontal axis, it moves the boxes vertically up to the

smallest data point of that interval. If it is FALSE, all boxes are on a regular grid.

plot.allpoints Logical. If FALSE, only points that were considered in the regression are shown. Otherwise, all points of the log-log plot are shown in the graph and those considered in the regression are marked by filled circles. This argument is only used if plot.loglog = TRUE. Note that setting this argument to TRUE might (depending on the method) considerably increase the computation run-time. filter Argument passed to the modwt function of the **wavelets** package. J0, J1 Parameters of the wavelet method controlling the number of frequencies used in the estimation. legend.type One of the characters 'f', 's', or 'n'. It controlls the amount of information in the legend of the log-log plot. If it is 'f' (full), values of fd and scale, including the raw values of the corresponding slope and intercept are shown. If it is 's' (short), only fd is shown. Value of 'n' (None) causes no legend being plotted. The argument is only used if plot.loglog = TRUE. Arguments passed to the plotting function if plot.loglog = TRUE. For some functions, ... contain additional arguments, see Details. Controls the amount of debugging messages. The functions produce messages debuglevel on level 5.

Details

The methodology of these functions is based on the theory described in Gneiting et al (2010). Please refer to this paper for notation. Here we give only a few comments about the implementation.

Box-count estimator: The function fd.estim.boxcount determines the smallest possible value of m for which $n \leq 2^m$ is a power of 2. Only data points $x_1, \ldots, x_{n_{eff}}$ are considered for the estimation, where $n_{eff} = 2^{m-1} + 1$. The value of K can be given by the user through the argument nlags. If nlags = "auto", box sizes ϵ_k for $k = j, j+1, \ldots, m-2$ are considered, where for all i < j is $N(\epsilon_i) > \frac{n_{eff}}{5}$, i.e. the two largest box sizes and very small boxes are eliminated (corresponds to the Liebovitch and Toth modification).

If shift.up=TRUE, the algorithm shifts each vertical column of boxes up to the smallest data value in that column.

 $N(\epsilon_k)$ for a particular box is increased if either a data point is contained in the box, or if a line connecting two neighboring data points crosses the box.

Hall-Wood estimator This estimator is a version of box-count that instead of number of boxes considers the area of boxes that cover the underlying curve.

Hall and Wood (1993) recommend the use of L=2 which the function fd.estim.hallwood uses if the arguments nlags = "auto".

Variation, Variogram, Madogram, Rodogram, and Incr1 estimators: The p.index argument of fd.estim.variation and fd.estim.incr1 is the power index p. The madogram, variogram, and rodogram, respectively, correspond to the Variation estimator with p equals 1, 2, and 1/2, respectively. The Incr1 estimator is like Variation but based on second order differences.

Any argument that can be passed to fd.estim.hallwood can be passed here as well. In addition, as in the Hall-Wood case, L is set to 2 for these estimators, if nlags = "auto".

Genton robust estimator: This is a highly robust variogram estimator as proposed by Genton (1998). Given $U_i(d) = X_{i/n} - X_{(i-d)/n}$, define

$$\hat{V}(d) = \left[2.2191\{|U_i(d) - U_j(d)|; i < j\}_{(k)}\right]^2, \quad \text{where } k = \binom{\lfloor (n-d)/2 \rfloor + 1}{2}.$$

Thus, the estimator is derived from the k-th quantile of the $U_i(d)$ values. The \hat{D}_k estimator is derived from the log-log plot of $\log(d)$ against $\log(\hat{V}(d))$. The implementation uses the qn function of the **pcaPP** package to compute $\hat{V}(d)$.

Here again, the number of lags is set to 2 if nlags = "auto" and any arguments of the fd.estim.hallwood are accepted here as well.

Periodogram estimator: The method is implemented as proposed by Chan et al. (1995) with notation from Gneiting et al (2010).

As Chan et al. (1995) recommend, we use $L = \lfloor \min(m/2, n^{2/3}) \rfloor$ if nlags = "auto". Any arguments of the fd.estim.hallwood are also accepted here.

Wavelet estimator: This method uses J_0 vectors of wavelet coefficients which are obtained using the function modwt of the **wavelets** package. The choice of J0 and J1 determine the number of frequencies used in the estimation.

DCT-II estimator: If nlags = "auto", we use $L = \lfloor \min(2m, 4n^{2/3}) \rfloor$. Any arguments of the fd.estim.hallwood are also accepted here.

The two-dimensional estimators are all based on the Variation method with the power index p (argument p.index) with the following alternatives:

Transect For every given direction, a variation estimate (or a variant that uses second differences) is found in each row (for horizontal direction) and/or column (for vertical direction). The resulting estimate is the median over the set of estimates. In the function fd.estim.transect.var the line transect estimates are based on first differences; In the function fd.estim.transect.incr1 they are based on second differences.

This method does not support the feature of creating a log-log plot, since there are many log-log regressions from which the results are derived. The methods also accept arguments direction, nlags and debuglevel.

- **Isotropic** Davies and Hall (1999) on page 12 define the isotropic empirical variogram. This is here implemented more generally using the variation estimator. If nlags = "auto", the number of lags is set to either 3 if diagonal direction is used together with either horizontal or vertical direction or both. If only horizontal or/and vertical direction is used, the number of lags is set to 2.
- **Square-increment** We use the square-increment estimator proposed in eqs. (4.2) through (4.7) of Chan and Wood (2000). Note that this method is equivalent to the Filter 3 approach of Zhu and Stein (2002) which is the way it is implemented in the package. The automatic setting of number of lags is done as for the Isotropic method.
- *Filter 1* Here, the Filter 1 approach of Zhu and Stein (2002) is implemented. Again, the automatic setting of number of lags is done as for the Isotropic method.

For all methods (but Transect), if the argument plot.loglog is TRUE, a graph with the log-log plot is shown, including the fitted regression line. Only points included in the regression are plotted, unless the argument plot.allpoints is set to TRUE. In such a case, points used for fitting the regression line are marked by filled circles.

For using multiple estimation methods via one function see fd.estimate.

Value

Each function returns an object of class FractalDim with elements:

dim Here it is always 1.

fd, scale Single value, namely the estimated fractal dimension and scale, respectively.

methods, methods.coding

Method name and code used for the estimation.

window.size, step.size

Size of the data.

data.dim Dimension of the data used for the estimation. It is either one or two.

loglog Object of class FDloglog used for the estimation.

Note

Function fd.estimate can be used as a wrapper for these functions.

Author(s)

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Hall, P., Wood, A. (1993) On the Performance of Box-Counting Estimators of Fractal Dimension. Biometrika **80** (1), 246–252.

Zhu, Z., Stein, M. (2002) Parameter estimation for fractional Brownian surfaces. Statistica Sinica 12, 863–883.

See Also

```
fd.estimate
```

Examples

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```
param = c(mean=0, variance=1, nugget=0, scale=1, kappa=1))
par(mfrow=c(4,2))
fd.estim.variogram (rf, nlags = 20, plot.loglog = TRUE)
fd.estim.variation (rf, nlags = 20, plot.loglog = TRUE)
fd.estim.variogram (rf, nlags = 3, plot.loglog = TRUE,
    plot.allpoints = TRUE)
fd.estim.variation (rf, plot.loglog = TRUE, plot.allpoints = TRUE)
fd.estim.hallwood (rf, nlags = 10, plot.loglog = TRUE)
fd.estim.boxcount (rf, nlags = "all", plot.loglog = TRUE,
    plot.allpoints = TRUE)
fd.estim.periodogram (rf, plot.loglog = TRUE)
fd.estim.dctII (rf, plot.loglog = TRUE)
# 2d random fields
n <- 128
rf2d <- GaussRF(x = c(0,1, 1/n), y = c(0,1, 1/n), model = "stable",
   grid = TRUE, gridtriple = TRUE,
    param = c(mean=0, variance=1, nugget=0, scale=1, kappa=1))
par(mfrow=c(1,3))
fd.estim.isotropic (rf2d, p.index = 1, direction='hv',
                       plot.loglog = TRUE, plot.allpoints = TRUE)
fd.estim.squareincr (rf2d, p.index = 1, plot.loglog = TRUE, plot.allpoints = TRUE)
fd.estim.filter1 (rf2d, p.index = 1, plot.loglog = TRUE, plot.allpoints = TRUE)
})
```

fd.estimate

Estimating Fractal Dimensions of Time Series and Two-dimensional Data

Description

The functions compute a set of fractal dimensions D for time series and two-dimensional data via various methods using a sliding window technique. There is one D computed for each method and for each sliding window of a given size that is moved along the data.

Usage

```
## S3 method for class 'numeric'
fd.estimate(data, methods = "madogram", window.size = length(data),
    step.size = window.size, trim = TRUE, keep.data = FALSE,
    keep.loglog = FALSE, parallel = FALSE, nr.nodes = NULL,
    debuglevel = 0, ...)

## S3 method for class 'matrix'
fd.estimate(data, methods = "transect.var", window.size = ncol(data),
    step.size = window.size, trim = TRUE, keep.data = FALSE,
    keep.loglog = FALSE, parallel = FALSE, nr.nodes = NULL,
    debuglevel = 0, ...)
```

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Arguments

data Vector, matrix or data frame.

methods Vector of character strings specifying methods for which D is estimated. Possi-

ble values for one-dimensional data are "variogram", "madogram", "rodogram", "variation", "incr1", "boxcount", "hallwood", "periodogram", "wavelet", "dctII", and "genton". For matrix or data frame the function accepts methods "transect.var", "transect.incr1", "isotropic", "squareincr", and "filter1" (see fd.get.available.methods). Alternatively, it can be a list of lists where each list item contains an entry "name" being the method name and entries corresponding to arguments passed to the specific methods (see Example

and fd.estim.method for details.)

window.size Size (in number of data points) of the sliding window. It should be between 2

and length of data.

step.size Number of data points by which the sliding window is moved.

trim Logical. If TRUE, the estimates are trimmed into the theoretically permissible

interval, i.e. between 1 and 2 in one-dimensional case and between 2 and 3 in

two-dimensional case.

keep.data Logical. If TRUE, the data are kept in the resulting object.

keep.loglog Logical. If TRUE, the resulting object contains a list with objects of class FDloglog

used for the estimation in each iteration and for each method.

parallel Logical determining if the process should run in parallel. If TRUE, the package

snowFT is required. In such a case, all local library paths must be included in the environment variable R_LIBS. In the one-dimensional case, the granularity of the process is given by the number of sliding windows. In the two-dimensional case, the number of spawn processes is equal to the number of sliding windows

in the vertical direction.

nr.nodes Number of nodes on which the computation should be processed if parallel is

TRUE.

debuglevel Controls the amount of debugging messages. The functions produce messages

on levels 1 - 4.

... Arguments passed to lower level functions (defined in fd.estim.method).

Details

In case of one-dimensional time series, the function initiates a sliding window of the given size at the beginning of the time series. The window is moved along the data by the given step size. If parallel is TRUE, computation on each window happens in parallel. In the two-dimensional case, the window is initiated in the top left corner of the data matrix and moved horizontally by the given step size, as well as vertically by the same step size. If the process is running in parallel, processing each row is done in parallel. In both cases, in each iteration estimates of fractal dimension for data within the sliding window are computed using the given estimation methods.

Note that the estimation results are NA for any sliding window that contains NA values.

Arguments that are to be passed to specific methods can be given either directly, if they applies to all given methods. Or, they can be given as a list via the methods argument: There is one list per method that must contain the entry "name" being the method name. Remaining entries in the list corespond to one argument each (see Example below).

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Value

An object of class FractalDim which consists of the following components:

dim Dimension of the resulting arrays fd and scale (see below). In the one-dimensional

case, possible values are 1 and 2. $\dim = 1$ means that there has been only one iteration and there is one element in the above arrays per each method used. If $\dim = 2$, rows correspond to iterations and columns correspond to methods. Estimation on two-dimensional data can in addition result in $\dim = 3$, in which case the first and second dimensions correspond to vertical and horizontal iterations,

respectively, and the third dimension corresponds to methods.

fd A dim-dimensional array of fractal dimensions.

scale A dim-dimensional array of scales, derived from the intercept of the log-log

plots on which fd were computed. Values are transformed to the scale of the

original data.

methods Vector of methods given in the methods argument. The order of the elements

corresponds to the order of estimates in the "method"-dimension of the above

dim-dimensional arrays.

methods.coding Vector of internal coding of methods. The order of the elements corresponds to

the order in methods.

data Value of the argument data, if keep.data = TRUE, otherwise NULL.

data.dim Dimension of data.

window.size Size of the actual sliding window used in the computation.

step. size Step size by which the sliding window was moved in the computation.

loglog If keep.loglog=TRUE, this is a list containing for each iteration a lists of FDloglog

objects used in the estimation, one per method. The numbering of the methods

corresponds to the method order in methods.

See Also

```
fd.estim.method, fd.get.available.methods, FDloglog, fd.get
```

Examples

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fd.get

Access Method for Objects of Class FractalDim

Description

For given method it returns the corresponding estimates.

Usage

```
fd.get(fractaldim, method)
```

Arguments

fractaldim object of class FractalDim as defined in fd.estimate.

method character string specifying the method. For 1-d estimators, possible values are "variogram", "madogram", "rodogram", "variation", "incr1", "boxcount", "hallwood", "periodogram", "wavelet", "dctII", and "genton". For 2-d estimators, possible values are "transect.var", "transect.incr1", "isotropic", "squareincr", and "filter1" (see fd.get.available.methods).

Value

A FractalDim object. The original fractaldim arrays fd and scale are reduced in the last dimension into only one method, namely the given method.

See Also

```
fd.estimate, fd.get.available.methods
```

fd.get.available.methods

Examples

```
## Not run:
library(RandomFields)
x < - seq(0, 10000)
# generate a random field
truealpha <- 1.5
rf <- GaussRF(x = x, model = "stable", grid = TRUE,</pre>
    param = c(mean=0, variance=1, nugget=0, scale=100,
        alpha=truealpha))
#compute fractal dimension using various methods
methods <- c("madogram", "variogram", "hallwood", "boxcount",</pre>
                       "periodogram","dctII", "wavelet")
fdts <- fd.estimate (rf, methods = methods, window.size = 500,
    step.size = 100, nlags = 10, trim = FALSE, debuglevel = 3)
# plot the variation
cols <- rainbow(length(methods))</pre>
plot(ts(fd.get (fdts, methods[1])$fd),ylim=c(min(fdts$fd), max(fdts$fd)),
             ylab="fd", col=cols[1])
for (imeth in 2:length(methods))
    lines(ts(fd.get (fdts, methods[imeth])$fd), col=cols[imeth])
legend('topleft', legend=methods, col=cols, lwd=1)
abline(h=2-truealpha/2)
## End(Not run)
```

fd.get.available.methods

Available Estimation Methods

Description

The function returns a list of estimation methods that can be used in fd.estimate and other functions of the package.

Usage

```
fd.get.available.methods(dim = 1)
```

Arguments

dim

Dimension of data for which the estimation methods should be obtained.

Value

A list of the available methods. Their order number in the list corresponds to the internal codes of the methods.

See Also

```
fd.estimate, fd.get
```

```
get.rawFD.from.regression
```

Obtaining Regression Object

Description

Obtaining and summarizing result of a linear regression of the log-log plot, object of class FDloglog.

Usage

```
get.rawFD.from.regression(x, y, leaveout = 0)
## S3 method for class 'FDloglog'
summary(object, ...)
```

Arguments

x Values of the x-axis.y Values of the y-axis.

leaveout Number of points (from the beginning of the arrays) to leave out of the regres-

sion

object Object of class FDloglog.

... Not used.

Value

Function get.rawFD.from.regression returns an object of class FDloglog with the following components:

alpha, intercept

Slope and intercept of the regression.

x, y x and y values, including the leaveout.

n Length of x.

1sq The least squared of the regression.

Author(s)

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See Also

```
{\tt fd.estimate,fd.estim.method}
```

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summary.FractalDim Summary for an Object of Class FractalDim

Description

The function prints summary of estimates in a FractalDim object.

Usage

```
## S3 method for class 'FractalDim'
summary(object, ...)
```

Arguments

object An object of class FractalDim.
... Not used.

Details

The function prints information about the grid on which the estimates were obtained. For each method it shows the mean and standard deviation of data in each of the two components (fd and scale).

See Also

fd.estimate

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