# Package 'unbalhaar'

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unbalhaar-package

Function estimation via Unbalanced Haar wavelets

#### **Description**

The package implements top-down and bottom-up algorithms for nonparametric function estimation in Gaussian noise using Unbalanced Haar wavelets.

#### **Details**

Package: unbalhaar Type: Package Version: 2.0

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The main functions of the package are uh and uh.bu.

#### Author(s)

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## References

P. Fryzlewicz (2007) "Unbalanced Haar technique for nonparametric function estimation". *Journal of the American Statistical Association*, 102, 1318-1327.

## **Examples**

```
x \leftarrow c(rep(0, 100), rep(1, 200)) + rnorm(300)
est.topdown \leftarrow uh(x)
est.bottomup \leftarrow uh.bu(x)
```

best.unbal.haar

Best top-down Unbalanced Haar decomposition

## **Description**

The function finds the "best" top-down Unbalanced Haar (UH) decomposition of the input vector x, according to a selection rule (criterion) which specifies which UH vector gets chosen at each scale and location.

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#### Usage

```
best.unbal.haar(x, criterion = inner.prod.max)
```

## **Arguments**

x a vector

criterion a function which takes a vector of length *n* and returns an integer between 1 and

*n*-1

## Value

tree A list of J matrices, where J represents the number of "scales". Each matrix is of

size 5 x (the number of UH coefficients at a given scale). Each column (= vector of length 5) contains an Unbalanced Haar coefficient in the following format: 1st component - an index of the coefficient; 2nd component - the value of the coefficient; 3rd component - time point where the corresponding UH vector starts; 4th component - last time point before the breakpoint of the UH vector;

5th component - end point of the UH vector.

smooth the "smooth" component of x, equal to sum(x) / sqrt(n), where n is the length

of x

#### Author(s)

Piotr Fryzlewicz

## See Also

```
inner.prod.max, inner.prod.max.p, best.unbal.haar.bu
```

## **Examples**

```
best.unbal.haar(rnorm(100), inner.prod.max.p)
```

best.unbal.haar.bu

Best bottom-up Unbalanced Haar decomposition

#### **Description**

The function finds the "best" bottom-up Unbalanced Haar (UH) decomposition of the input vector x.

## Usage

```
best.unbal.haar.bu(x, stretch = length(x))
```

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#### **Arguments**

x a vector

stretch at each iteration, only the first 1:stretch elements of the current input vector

(whose length decreases by one with each iteration) get scanned in the search

for the worst-fitting fine-scale Unbalanced Haar wavelet

#### Value

detail A matrix of size 3 x n-1, where n is the length of x, containing the detail co-

efficients of x in the order they were chosen. Each column corresponds to a single coefficient and contains, from top to bottom: location of the coefficient,

the associated weight, and the value of the coefficient.

smooth the "smooth" component of x, equal to sum(x) / sqrt(n), where n is the length

of x

#### Author(s)

Piotr Fryzlewicz

#### See Also

```
best.unbal.haar
```

#### **Examples**

best.unbal.haar.bu(rnorm(100))

hard.thresh

Hard thresholding of a top-down Unbalanced Haar decomposition

## **Description**

Presented with an object returned by best.unbal.haar, the function sets to zero those Unbalanced Haar coefficients which fall below a certain threshold sigma.

## Usage

```
hard.thresh(buh, sigma = 1)
```

#### **Arguments**

buh an object returned by best.unbal.haar containing the decomposition to be

thresholded

sigma the threshold (a positive scalar)

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## Value

a thresholded object, of the same class as buh

#### Author(s)

Piotr Fryzlewicz

#### See Also

```
best.unbal.haar, hard.thresh.bu
```

## **Examples**

```
x <- rnorm(1000)
x.uh <- best.unbal.haar(x)
x.uh.th <- hard.thresh(x.uh)
x.uh.th.r <- reconstr(x.uh.th)
ts.plot(x.uh.th.r)</pre>
```

hard.thresh.bu

Hard thresholding of a bottom-up Unbalanced Haar decomposition

## **Description**

Presented with an object returned by best.unbal.haar.bu, the function sets to zero those Unbalanced Haar coefficients which fall below a certain threshold sigma.

## Usage

```
hard.thresh.bu(buh.bu, sigma = 1)
```

## Arguments

buh.bu an object returned by best.unbal.haar.bu containing the decomposition to be

thresholded

sigma the threshold (a positive scalar)

#### Value

a thresholded object, of the same class as buh. bu

#### Author(s)

Piotr Fryzlewicz

#### See Also

```
best.unbal.haar.bu, hard.thresh
```

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## **Examples**

```
x <- rnorm(1000)
x.uh <- best.unbal.haar.bu(x)
x.uh.th <- hard.thresh.bu(x.uh)
x.uh.th.r <- reconstr.bu(x.uh.th)
ts.plot(x.uh.th.r)</pre>
```

inner.prod.iter

Inner products with Unbalanced Haar wavelets

## **Description**

For an input vector of length n, the function computes inner products between the input vector and all possible n-1 Unbalanced Haar vectors of length n.

## Usage

```
inner.prod.iter(x)
```

#### **Arguments**

х

a vector of length n

## **Details**

The computation is iterative and is performed in computational time O(n).

#### Value

a vector of length n-1, containing inner products between x and consecutive Unbalanced Haar wavelets of length n

## Author(s)

Piotr Fryzlewicz

## **Examples**

```
inner.prod.iter(rnorm(100))
```

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inner.prod.max

Unbalanced Haar wavelet which maximises the inner product

#### **Description**

The function finds the Unbalanced Haar vector which yields the largest (in absolute value) inner product with the input vector.

#### Usage

```
inner.prod.max(x)
```

#### **Arguments**

.,

a vector

#### Value

The index where abs(inner.prod.iter(x)) is maximised. If two or more maxima are found, the med of their locations is returned.

#### Author(s)

Piotr Fryzlewicz

#### See Also

```
inner.prod.iter, med, inner.prod.max.p
```

#### **Examples**

```
inner.prod.max(c(rep(0, 100), rep(1, 200)))
```

inner.prod.max.p

Unbalanced Haar wavelet which maximises the inner product

## Description

The function finds the Unbalanced Haar vector which yields the largest (in absolute value) inner product with the input vector, amongst those Unbalanced Haar vectors whose breakpoint is located between 100(1-p)% and 100p% of their support.

#### Usage

```
inner.prod.max.p(x, p = 0.8)
```

8 med

#### **Arguments**

```
x a vector
p a scalar in (0.5, 1]
```

## Value

The index where abs(inner.prod.iter(x)) is maximised on the subinterval (1+floor((1-p)\*n)): ceiling(p\*n), where n is the length of x. If two or more maxima are found, the med of their locations is returned.

## Author(s)

Piotr Fryzlewicz

#### See Also

```
inner.prod.iter, med, inner.prod.max
```

## **Examples**

```
inner.prod.max.p(c(rep(0, 100), rep(1, 200)), .55)
```

med *Median* 

## **Description**

The function computes the median of a vector. Unlike median, it is guaranteed to return a value which is a component of the input vector.

## Usage

med(x)

## Arguments

x a vector

## Value

```
a scalar defined as quantile(x, .5, type=3)[[1]]
```

## Author(s)

Piotr Fryzlewicz

## **Examples**

```
med(1:4)
median(1:4)
```

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reconstr

Reconstruct a top-down Unbalanced Haar decomposition

#### **Description**

Reconstructs a vector from its top-down Unbalanced Haar decomposition stored in an object returned by best.unbal.haar or hard.thresh.

#### Usage

```
reconstr(buh)
```

#### **Arguments**

buh

an object of the type returned by best.unbal.haar and hard.thresh

#### Value

the inverse Unbalanced Haar transform of buh

## Author(s)

Piotr Fryzlewicz

## See Also

```
best.unbal.haar, hard.thresh, reconstr.bu
```

## **Examples**

```
x <- rnorm(1000)
x.uh <- best.unbal.haar(x)
x.uh.th <- hard.thresh(x.uh)
x.uh.th.r <- reconstr(x.uh.th)
ts.plot(x.uh.th.r)</pre>
```

reconstr.bu

Reconstruct a bottom-up Unbalanced Haar decomposition

#### **Description**

Reconstructs a vector from its bottom-up Unbalanced Haar decomposition stored in an object returned by best.unbal.haar.bu or hard.thresh.bu.

#### Usage

```
reconstr.bu(buh.bu)
```

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## **Arguments**

buh.bu an object of the type returned by best.unbal.haar.bu and hard.thresh.bu

#### Value

the inverse Unbalanced Haar transform of buh.bu

#### Author(s)

Piotr Fryzlewicz

## See Also

```
best.unbal.haar.bu, hard.thresh.bu, reconstr
```

#### **Examples**

```
x <- rnorm(1000)
x.uh <- best.unbal.haar.bu(x)
x.uh.th <- hard.thresh.bu(x.uh)
x.uh.th.r <- reconstr.bu(x.uh.th)
ts.plot(x.uh.th.r)</pre>
```

uh

Denoising via top-down Unbalanced Haar

## **Description**

Given an input vector of the form "signal + iid Gaussian noise", the function estimates the noise level via Median Absolute Deviation, finds the best top-down Unbalanced Haar decomposition (according to the selection rule criterion), thresholds it with the universal threshold, and performs the inverse Unbalanced Haar transform to yield an estimate of the signal.

#### Usage

```
uh(x, criterion = inner.prod.max)
```

## **Arguments**

```
x a vector of the form "signal + iid Gaussian noise"

criterion a function which takes a vector of length n and returns an integer between 1 and n-1
```

#### Value

an estimate of the signal

uh.bu

#### Author(s)

Piotr Fryzlewicz

#### References

P. Fryzlewicz (2007) "Unbalanced Haar technique for nonparametric function estimation". *Journal of the American Statistical Association*, 102, 1318-1327.

#### See Also

```
uh.bu, best.unbal.haar, inner.prod.max, inner.prod.max.p, hard.thresh, reconstr
```

## **Examples**

```
x <- c(rep(0, 100), rep(1, 200)) + rnorm(300) est <- uh(x)
```

uh.bu

Denoising via bottom-up Unbalanced Haar

## **Description**

Given an input vector of the form "signal + iid Gaussian noise", the function estimates the noise level via Median Absolute Deviation, finds the best bottom-up Unbalanced Haar decomposition, thresholds it with the universal threshold, and performs the inverse Unbalanced Haar transform to yield an estimate of the signal.

## Usage

```
uh.bu(x, stretch = length(x))
```

## Arguments

x a vector of the form "signal + iid Gaussian noise"

stretch at each iteration, only the first 1:stretch elements of the current input vector

(whose length decreases by one with each iteration) get scanned in the search

for the worst-fitting fine-scale Unbalanced Haar wavelet

#### Value

an estimate of the signal

#### Author(s)

Piotr Fryzlewicz

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#### References

P. Fryzlewicz (2007) "Unbalanced Haar technique for nonparametric function estimation". *Journal of the American Statistical Association*, 102, 1318-1327.

## See Also

```
uh, best.unbal.haar.bu, hard.thresh.bu, reconstr.bu
```

#### **Examples**

```
x <- c(rep(0, 100), rep(1, 200)) + rnorm(300) est <- uh.bu(x)
```

unbal.haar.vector

Unbalanced Haar vector

## **Description**

Computes the non-zero part of an Unbalanced Haar vector with a given start-, break- and end-point.

## Usage

```
unbal.haar.vector(a)
```

## **Arguments**

а

a three-component vector of integers such that  $a[1] \le a[2] \le a[3]$ . The three components specify, respectively, the start point, the time point just before the breakpoint, and the endpoint of the desired Unbalanced Haar vector.

#### Value

the non-zero part of the corresponding Unbalanced Haar vector

## Author(s)

Piotr Fryzlewicz

## **Examples**

```
unbal.haar.vector(c(1, 1, 2))
unbal.haar.vector(c(2, 5, 12))
```

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