# Package 'mvhist' 

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mvhist Multivariate Histograms

## Description

Tabulate and plot histograms for multivariate data, including directional histograms. This package used to be part of the mvmesh package, which works with multivariate meshes and grids. To simplify that package and make these functions more visible, this package was extracted as a self-standing package in Septemeber 2023. The functions provided can tally the number of data points in a list of regions in dimensions two or more. All regions/bins have flat sides.

Several different plots are available to show 2 and 3 dimensional data; and one can deal with dimension greater than 3. Plots in 3d can be rotated and zoomed in/out with the mouse, as well as resized.

## Usage

histRectangular ( x, breaks=10, plot.type="default", freq=TRUE, report="summary", ... )
histSimplex ( x, S, plot.type="default", freq=TRUE, report="summary", ... )

## Arguments

X
freq
breaks specifes the subdivision of the region; see 'breaks' in SolidRectangle in package mvhist.
plot.type type of plot, see details below
S
( vps x dxnS ) array of simplices in the V-representation, see V2Hrep in package mvhist. The vector $S[, i, j]$ gives the coordinates of the $i$-th vertex of the $j$-th simplex.
report level of warning messages; one of "summary", "all", "none".
Optional arguments to plot, e.g. color="red", etc.

## Details

Calculate and plot multivariate histograms. histRectangular plots histogram based on a rectangular grid, while histSimplex plots histogram based on the simplices specified in S ,

These routines use the functions and conventions of the package mvmesh. In particular, shapes can be described in two formats: vertex representation or half-space representation, respectively called the V-representation or H-representation. In all cases, the bins are simplices are converted to the H-representation and tallied by TallyHrep.
'plot.type' values depend on the type of plot being used. Possible values are:

- "none" - does not show a plot, just return the counts. This is useful to summarize data and in higher dimensions where no plot is useful
- "index" - shows a histogram of simplex index number versus count, does not show the geometry, but works in any dimension
- "pillars" - shows a 3D plot with pillars/columns having base the shape of the simplices and height proportional to frequency counts. When the points are 2D, this works for histRectangular and histSimplex; when the points are 3D, this only works for histRectangular. DrawPillars is used to plot the pillars.
- "counts" - shows frequency counts as a number in the center of each simplex
- "radial" - histDirectional only, shows radial spikes proportional to the counts
- "grayscale" - histDirectional only, color codes simplices proportional to the counts
- "orthogonal" - histDirectional only, shows radial spikes proportional to the counts
- "default" - type depends on the dimension of the data and type of histogram


## Value

A plot is drawn (unless plot.type="none"). Note that the plots may be underneath/behind other windows; if you don't see a plot, search your desktop and/or the plot tab. A list is returned invisibly, with the following fields:

- counts - frequency count in each bin
- nrejects - number of $x$ values not in any bin
- nties - number of points in more than one bin (if bins are set up to be non-overlapping, this should only occur on a shared edge between two simplices)
- nx - total number of data points in x
- rel.freq - counts/nx
- rel.rejects - nrejects/nx
- mesh - object of type mvmesh, see mvmesh
- plot.type - input value
- report - input value

While counting data points in the different bins, two issues can arrise: (a) a data point is on the boundary of a bin, or (b) a data point is not in any of the specified bins. If report="none", no report is given about these issues. If report="summary", a count is given of the number of ties and the number of rejects. If report="all", the count of number of ties and rejects is given, and the indices (rows of the data matrix) of the rejected points are given.

## Warning

These functions use double precision numbers by default, and most real numbers cannot be expressed exactly as doubles. So testing for being on a boundary is subject to the usual issues with floating point numbers. This is why the message "If you want correct answers, use rational arithmetic." is given when the package rcdd is loaded.

It is possible, but takes some work, to specify regions using only rational numbers as coordinates, and if the data is rational, you will be able to exactly specify regions and possibily boundaries. See the help for packages mvmesh and rcdd. Using rational coordinates has not be tested in this package.

Examples

histRectangular example:

histSimplex example with plot.type="counts"

histSimplex example with plot.type="pillars"

## Examples

```
# isotropic data in 2 and 3 dimensions
x2d <- matrix( rnorm(8000), ncol=2 )
x3d <- matrix( rnorm(9000), ncol=3 )
# 3d plots are in separate windows opened by the rgl package; you may have
# to search on the desktop to find those windows
if( interactive() ){
# save graphical parameters; restore to original value at end of examples
oldpar <- par()
# simple histogram of 2d data
histRectangular( x2d, breaks=5); title3d("2d, default plot.type" )
# simple histogram of 3d data: slices of data are stacked
histRectangular( x3d, breaks=4 ); title3d("3d, default plot.type" )
histRectangular( x2d, breaks=5, col='blue', plot.type="pillars" )
histRectangular( x2d, breaks=5, plot.type="counts" )
histRectangular( x2d, breaks=5, plot.type="index" )
```

\# count number of data points in a triangle, using mvmesh function to define the partition

```
S1 <- 4*SolidSimplex( n=2, k=3 )$S
histSimplex( x2d, S1, plot.type="counts" ) # note many rejects
histSimplex( x2d, S1, col="green", lwd=3 ) # default plot.type="pillars"
# partiton a ball
S2 <- 4*UnitBall( n=2, k=2 )$S
histSimplex( x2d, S2, plot.type="counts", col="purple" )
histSimplex( x2d, S2, col="red" )
# Specify simplices explicitly to get specific region, e.g. restrict to x[1] >= 0
S1 <- matrix( c(0,0, 10,0, 0,10, 10,10), ncol=2, byrow=TRUE ) # first quadrant (bounded)
S2 <- matrix( c(0,0, 10,0, 0,-10, 10,-10), ncol= 2,, byrow=TRUE ) # fourth quadrant (bounded)
S <- array( c(S1,S2), dim=c(4,2,2) )
simp <- histSimplex( x2d, S, plot.type="counts" )
text(2,9, paste("nrejects=",simp$nrejects), col='red' )
# check behavior with rejects and ties
r <- histSimplex( x2d, S, plot.type="counts" )
str(r) # see list of returned values
sum(c(r$counts,r$nrejects))
# restore user's graphical parameters
par(oldpar)
}
```

mvhistDirectional Directional Histograms

## Description

Tabulate and plot directional histograms

## Usage

histDirectional( x, k, p=2, plot.type="default", freq=TRUE, positive.only=FALSE, report="summary", label.orthants=TRUE, normalize.by.area=FALSE, ... )
histDirectionalQuantileThreshold( $x$, probs=1, $p=2$, $k=3$, positive.only=FALSE, ... )
histDirectionalAbsoluteThreshold( $x$, thresholds=0, $p=2$, $k=3$, positive.only=FALSE,...)

## Arguments

x
k
data in an ( n x d) matrix; rows are d-dimensional data vectors number of subdivisions
$\mathrm{p} \quad$ power of p -norm
freq TRUE for a frequency histogram, FALSE for a relative frequency histogram. See note about normalize.by.area

|  | if TRUE, then the counts are normalized by the surface area of the corresponding simplex on the sphere. This is useful since in general the surface area varies with the region and counts will vary accordingly. In particular, isotropic data will not appear isotropic without setting this to TRUE. If TRUE, the value of freq is ignored: the histogram always shows the ratio count/surface area |
| :---: | :---: |
| plot.type | type of plot, see details below |
| positive.only | If TRUE, look only in the first orthant |
| report | level of warning messages; one of "summary", "all", "none". |
| label.orthants | If plot.type="index", this controls whether or not the orthants are labeled on the plot. |
| probs | vector of probabilites specifying what fraction of the extremes to keep |
| thresholds | vector of thresholds specifying cutoff for extremes to keep |
|  | Optional arguments to plot |

## Details

Calculate and plot multivariate directional histograms.
Each orthant is subdivided by a k-wise subdivision and cones are constructed from the origin through each subdivision (and contiuing to infinity). The tally then counts how many data points are in each (infinite) cone.
histDirectional plots a directional histogram for all the data, histDirectionalQuantileThreshold plots $m=l e n g t h$ (probs) directional histograms, with plot $i$ using the top probs[i] fraction of the data, histDirectionalAbsoluteThreshold plots m=length(cut.off) directional histograms, with plot i using the data above cut.off[i].
When thresholding is being done, distance from the origin is computed by using the $\mathrm{p}-\mathrm{norm} ; \mathrm{p}=2$ is Euclidean distance.
'plot.type' values depend on the type of plot being used. See possible values in mvhist.

## Value

A plot is drawn (unless plot.type="none") and a list is returned invisibly. See function mvhist for the contents of that list. When the dimension of the data is bigger than 2, a flat 2d graph is drawn, with bins grouped by orthant. This may be useful to show is data is concentrated in certain directions. Orthants are labeled with a string of pluses and minuses, e.g. ++- means the first two coordinates are positive and the last two are negative.

## Examples

```
# some directional, heavy tailed 2-dim data
n <- 1000
A <- matrix( c(1,2, 4,1), nrow=2,ncol=2)
x2 <- matrix( 0.0, nrow=n, ncol=2 )
for (i in 1:n) { x2[i,] <- c( sum( A[1,] * (1/runif(1))), sum(A[2,] * (1/runif(1))) ) }
```

```
# three dimensional positive data
x3 <- matrix( abs(rnorm(9000)), ncol=3 )
if( interactive() ){
# save graphical parameters; restore to original value at end of examples
oldpar <- par()
histDirectional( x3, k=3, positive.only=TRUE, col='blue', lwd=3 )
# show scatter plot of all daat, then directional histogram of 100%, then top 25%,
# and finally top 10%
dev.new(); par(mfrow=c(2,2))
plot(x2,main="Raw data",col='red')
histDirectionalQuantileThreshold( x2, probs=c(1,0.25,0.1), p=1,
    positive.only=TRUE, col='green',lwd=3)
dev.new(); par(mfrow=c(2,2))
histDirectionalAbsoluteThreshold( x2, thresholds=c(0,50,100,200), p=1,
    positive.only=TRUE, col='blue',lwd=3)
# two dimensional, isotropic
x <- matrix( rnorm(8000), ncol=2 )
histDirectional( x, k=2 ) # default plot.type="radial"
histDirectional( x, k=2, col='red',lwd=4 ) # tinker with color and line width
histDirectional( x, k=2, plot.type="index" )
# three dimensional positive data
x <- matrix( abs(rnorm(9000)), ncol=3 )
histDirectional( x, k=3, positive.only=TRUE, col='blue', lwd=3 )
histDirectional( x, k=2, plot.type="orthogonal", positive.only=TRUE, p=1 )
# three dimensional isotropic/radially symmetric
x <- matrix( rnorm(3000), ncol=3, nrow=1000 )
histDirectional( x, k=2 ) # default plot.type="radial"
histDirectional( x, k=2, plot.type="grayscale" )
histDirectional( x, k=2, plot.type="index" )
# compare frequency, relative freq. and normalized histograms
n <- 20000; d <- 3; k <- 2
x <- matrix( rnorm( n*d ), nrow=n, ncol=d )
dev.new(); par(mfrow=c(3,1),mar=c(4,4,2,1))
histDirectional( x, k, plot.type="index" )
title("omnidirectional data: frequency")
histDirectional( x, k, freq=FALSE, plot.type="index" )
title("omnidirectional data: relative frequency")
histDirectional( x, k, plot.type="index", normalize.by.area=TRUE )
title("omnidirectional data: frequency/surface.area")
# 3d data, first octant only
```

```
# second plot is a multiple of first; third plot normalizes by the area of
# the partition elements
dev.new(); par(mfrow=c(3,1),mar=c(4,4,2,1))
histDirectional( abs(x), k=3, positive.only=TRUE, plot.type="index" )
title("positive data: frequency")
histDirectional( abs(x), k=3, positive.only=TRUE, freq=FALSE, plot.type="index" )
title("positive data: relative frequency")
histDirectional( abs(x), k=3, positive.only=TRUE, plot.type="index", normalize.by.area=TRUE )
title("positive data: frequency/surface.area")
# 4 dimensional data
d <- 4; n <- 10000
x <- matrix( rnorm(d*n), nrow=n, ncol=d )
histDirectional( x, k=1 ) # orthants are identified by + and - signs
histDirectional( x, k=1, normalize.by.area=TRUE )
histRectangular( x, breaks=2 )
# restore user's graphical parameters
par(oldpar)
}
```

mvhistMisc Miscellaneous routines for multivariate histograms

## Description

Utility functions for multivariate histograms

## Usage

TallyHrep( x, H, report="summary" )
DrawPillars( S, height, shift=rep(0.0,3), ... )
HrepCones( S )

## Arguments

x
S
H
report what information to return for tally
height height of the pillars
shift (x,y,z) shift of the pillars
... Optional arguments to plot, e.g. color="red", etc.

## Details

Internal functions for multivariate histograms.
TallyHrep tallies the number of data points in each simplex of the H representation.
DrawPillars plot 3d pillars/columns to show histogram height.
HrepCones computes an ( $\mathrm{mx}(\mathrm{d}+2) \mathrm{x}$ ncones) array H , with $\mathrm{H}[, \mathrm{k}]$ giving the H-representation of the $k$-th cone,

## Value

TallyHrep returns a list containing the number of data points in each simplex.
DrawPillars draws 3d pillars/columns to show histogram height.
HrepCones an ( $\mathrm{mx}(\mathrm{d}+2$ ) x ncones) array H , with $\mathrm{H}[, \mathrm{k}]$ giving the H-representation of the k -th cone.

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