Package 'Qbone'

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```
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Description The 'Qbone' package is a set of tools that enables efficient estima-
      tion of quantlets used in quantile functional regression to analyze distributional data. This pack-
      age can be used to analyze distributional data in broader applications such as cli-
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24

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Index

Qbone-package	3
addMetaData	3
assayData	4
assays	5
createQboneData	5
createQboneObject	6
defaultAssay	8
dxPlot	9
dxPlotRev	9
ecQuantlets	0
eigenmm	0
histogram3D	1
idents	2
lassoList	3
pdPlot	4
preQuantlets	5
qbasisPlot	6
qbasisPlot3D	6
Qbone-class	7
Qbone-methods	7
QboneData-class	8
QboneData-methods	8
qfrModel 1	9
quantileFPlot3D	20
readQbone	21
samples	21
set-if-null	22
thinData	22

Qbone-package 3

Qbone-package

Qbone: Tools for Quantile Functional Regression with Quantlets

Description

The 'Qbone' package is a set of tools that enables efficient estimation of quantilets used in quantile functional regression to analyze distributional data. This package can be used to analyze distributional data in broader applications such as climate change analysis, image recognition analysis, and personalized health data analysis, etc. At current stage, it is just for independent functional linear regression.

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See Also

Useful links:

- https://github.com/siminpan/Qbone
- Report bugs at https://github.com/siminpan/Qbone/issues

addMetaData

Add in metadata associated

Description

Add in metadata associated

```
addMetaData(object, metadata, col.name = NULL)
## S3 method for class 'Qbone'
addMetaData(object, metadata, col.name = NULL)
```

4 assayData

Arguments

object An object

metadata A vector, list, or data.frame with metadata to add col.name A name for meta data if not a named list or data.frame

Value

object with metadata added

Examples

```
## Not run:
meta.data2 = data.frame(group2 = c("a2", "a2", "b2", "b2"))
qbone1 <- addMetaData(object = qbone1, metadata = meta.data2[,1], col.name = "group2")
# or
qbone1[["group2"]] <- meta.data2[,1]
## End(Not run)</pre>
```

assayData

Get and Set Assay Data

Description

General accessor and setter functions for QboneData objects. getQboneData can be used to pull information from any of the expression matrices (eg. "counts", "data", or "scale.data"). SetAssayData can be used to replace one of these expression matrices || double check

Usage

```
getQboneData(object, slot, ...)
## S3 method for class 'Qbone'
getQboneData(object, slot = "data", assay = NULL, ...)
## S3 method for class 'QboneData'
getQboneData(object, slot = c("data", "scale.data"), ...)
```

object	An object
slot	Specific assay data to get or set
	Arguments passed to other methods
assay	Specific assay to get data from or set data for; defaults to the default assay

assays 5

Value

```
getQboneData: returns the specified assay data
```

Examples

```
## Not run:
# Get the data directly from an QboneData object
getQboneData(qbone1[["Bone"]], slot = "data")
## End(Not run)
```

assays

Query Specific Object Types

Description

Adopted from Seurateobject package List the names of assay

Usage

```
assays(object, slot = NULL)
```

Arguments

object A Qbone object

slot Name of component object to return

Value

If slot is NULL, the names of all component objects in this Qbone object. Otherwise, the specific object specified

createQboneData

create an QboneData object

Description

create an QboneData object

6 createQboneObject

Usage

```
createQboneData(
  data,
  meta.assays = NULL,
  sampleid.assays = 1,
  assay.name = "Bone",
  assay.orig = NULL,
  sort = F,
  ...
)
```

Arguments

```
data Sample data

meta.assays metadata for the assay with sample names

sampleid.assays

column number of sample name in meta.assay

assay.name assay name for the data.

assay.orig Original assay that this assay is based off of. Used to track assay provenance
sort sort the data before put into data slot if T, default is F.
```

Value

A QboneData object

Examples

createQboneObject

Create a Qbone object

Description

Create a Qbone object

createQboneObject 7

Usage

```
createQboneObject(
  data,
  project = "createQboneObject",
  assay = "Bone",
  names.field = 1,
 names.delim = "_",
 meta.data = NULL,
  sampleid = 1,
)
## Default S3 method:
createQboneObject(
  data = data,
  project = "QboneProject",
  assay = "Bone",
  names.field = 1,
  names.delim = "_",
 meta.data = NULL,
  sampleid = 1,
)
## S3 method for class 'QboneData'
createQboneObject(
  data = data,
 project = "QboneProject",
  assay = "Bone",
 names.field = 1,
names.delim = "_",
 meta.data = NULL,
  sampleid = 1,
)
```

```
data

project project name for the Qbone object

assay Name of the initial assay

names.field number of field of names

names.delim delimiter of names

meta.data Include cells where at least this many features are detected.

sampleid column number of sample name in mate.data
```

8 defaultAssay

Examples

```
## Not run:
n = 10000
list1 = list(rnorm(n, mean = 0, sd = 1),
              rnorm(n, mean = 0, sd = 1),
              rnorm(n, mean = 0.5, sd = 1),
              rnorm(n, mean = 0.5, sd = 1))
meta.data = data.frame(name = c("a_1", "a_2", "b_1", "b_2"),

group = c("a", "a", "b", "b"))
rownames(meta.data) = meta.data[,1]
qbonedata = createQboneData(list1, meta.data, sampleid = 1)
qbone1 = createQboneObject(qbonedata, meta.data = meta.data)
## End(Not run)
## Not run:
n = 10000
list1 = list(rnorm(n, mean = 0, sd = 1),
              rnorm(n, mean = 0, sd = 1),
              rnorm(n, mean = 0.5, sd = 1),
              rnorm(n, mean = 0.5, sd = 1))
\texttt{meta.data} = \texttt{data.frame}(\texttt{name} = \texttt{c("a\_1", "a\_2", "b\_1", "b\_2"), group} = \texttt{c("a", "a", "b", "b")})
rownames(meta.data) = meta.data[,1]
qbonedata = createQboneData(list1, meta.data, sampleid = 1)
qbone1 = createQboneObject(qbonedata, meta.data = meta.data)
## End(Not run)
```

defaultAssay

Get and set the default assay

Description

Get and set the default assay

```
defaultAssay(object, ...)
defaultAssay(object, ...) <- value

## S3 method for class 'Qbone'
defaultAssay(object, ...)

## S3 replacement method for class 'Qbone'
defaultAssay(object, ...) <- value</pre>
```

dxPlot 9

Arguments

object An object

... Arguments passed to other methods value Name of assay to set as default

Value

DefaultAssay: The name of the default assay

defaultAssay<-: An object with the default assay updated

dxPlot

Plot near-losslessness parameters.

Description

Plots the near-losslessness parameters minimum concordance (ρ^o) and average $(\bar{\rho})$ against the number of basis coefficients function of K_c in the reduced set.

Usage

```
dxPlot(object, sparsity = 0.001, ...)
```

Arguments

object A Qboneobject

sparsity Sparsity regularization parameter.
... Arguments passed to other methods

dxPlotRev

Plot number of basis coefficients.

Description

Reversed dxPlot useful when plotting with other basis like principal components. minimum concordance (ρ^o) and average $(\bar{\rho})$ for quantlets basis, varying with the number of basis coefficients.

Usage

```
dxPlotRev(object, sparsity = 0.001, ...)
```

Arguments

object A Qboneobject#'

sparsity Sparsity regularization parameter.
... Arguments passed to other methods

10 eigenmm

ecQuantlets

Get the Compute Empirical Coefficients for quantlets

Description

Compute empirical coefficients for quantlets

Usage

```
ecQuantlets(
  object,
  new.assay.name = "Empirical.Coefficients",
  data.assay = defaultAssay(object),
  k = NULL,
  sparsity = 0.001,
  ...
)
```

Arguments

object	A Qboneobject
new.assay.name	New assay name assigned to the quantlets data
data.assay	It is the name of the assay whose data will be used to compute the lasso list. Default is the data from the defaultAssay(object).
k	number of basis coefficients to keep. This is based on the number of dictionary elements (C) to keep. Default will pick the one chosen from dxPlot().
sparsity	Sparsity regularization parameter.
	Arguments passed to other methods

eigenmm

Faster Matrix Multiplication

Description

```
Faster matrix multiplication using C++ Eigen. A * B Faster matrix multiplication using C++ Eigen. t(A) Faster matrix multiplication using C++ Eigen::Map t(A) Faster matrix multiplication using C++ Eigen::Map. A * B Faster matrix multiplication using C++ Eigen::Map. A * t(B) Faster matrix multiplication using C++ Eigen::Map. t(A) * B
```

histogram3D

Usage

```
eigenmm(A, B)
eigenmt(A)
eigenmapmmt(A)
eigenmapmmm(A, B)
eigenmapmmt(A, B)
```

Arguments

A Matrices.
A, B Matrices.

histogram3D

Histogram Plot for each sample in 3D layout

Description

Histogram Plot for each sample in 3D layout

Usage

```
histogram3D(
  object,
  title = "Histogram",
  binbreaks = 1000,
  data.assay = defaultAssay(object),
  plotting = "scatter3d",
  ...
)
```

Arguments

object A Qboneobject

title Title of the plot.

binbreaks bin width breaks for the Histogram. Defulat is 1000

data.assay It is the name of the assay whose data will be plotted

plotting Plotting type, default is "scatter3d".

... Arguments passed to other methods

12 idents

idents

Get, set, and manipulate an object's identity classes

Description

Get, set, and manipulate an object's identity classes

Usage

```
idents(object, ...)
idents(object, ...) <- value

## S3 method for class 'Qbone'
idents(object, ...)

## S3 replacement method for class 'Qbone'
idents(object, samples = NULL, drop = FALSE, ...) <- value

## S3 method for class 'Qbone'
levels(x)

## S3 replacement method for class 'Qbone'
levels(x) <- value

## S3 method for class 'Qbone'
droplevels(x, ...)</pre>
```

Arguments

object An Qbone object

. . . Arguments passed to other methods

value The name of the identities to pull from object metadata or the identities them-

selves

samples Set cell identities for specific samples

drop Drop unused levels

Value

idents<-: object with the cell identities changed

Examples

```
## Not run:
# Get sample identity classes
idents(qbone1)
```

lassoList 13

```
## End(Not run)
## Not run:
# Set sample identity classes
# Can be used to set identities for specific samples to a new level
idents(qbone1, samples = 3:4) <- 'c'</pre>
idents(qbone1)
# Can also set idents from a value in object metadata
colnames(qbone1[[]])
idents(qbone1) <- colnames(qbone1[[]])[3]</pre>
idents(qbone1) <- 'group2'</pre>
idents(qbone1)
## End(Not run)
## Not run:
# Get the levels of identity classes of a Qbone object
levels(x = qbone1)
## End(Not run)
## Not run:
# Reorder identity classes
levels(x = qbone1)
levels(x = qbone1) <- c('A', 'B')
levels(x = qbone1)
## End(Not run)
```

lassoList

Use penalized regression (lasso) to find a sparse subset of dictionary elements

Description

First construct overcomplete dictionary (Beta CDF). Then uses penalized regression (lasso) to find a sparse subset of dictionary elements.

```
lassoList(
  object,
  verbose = TRUE,
  new.assay.name = "Lasso.list",
  data.assay = defaultAssay(object),
  alpha = c(seq(0.1, 1, by = 0.1), seq(2, 100, by = 1)),
```

14 pdPlot

```
beta = c(seq(0.1, 1, by = 0.1), seq(2, 100, by = 1)),
  assay.seed = .Random.seed,
  parallel = T,
   ...
)
```

Arguments

object A Qboneobject verbose Print a progress bar new.assay.name New assay name assigned to the lassolist data data.assay It is the name of the assay whose data will be used to compute the lasso list. Default is the data from the defaultAssay(object). alpha Vector containing sequence of beta parameter for internal function generateBetaCDF() beta Vector containing sequence of beta parameter for internal function generateBetaCDF() assay information to add into the QboneData object scale.data. The default assay.seed of lassolist() will save the random seed for the run. Use .Random.seed <-object@assays[["Lasso.list"]]@scale.data[["lassolist"]] before run</pre> lassolist() for the same results. If TRUE, use parallel foreach to fit each fold in cv.glmnet(). Default use parallel registerDoMC() to register parallel. There is another function lassolist_parallel() for overall parallel computing for all sample. Arguments passed to other methods

pdPlot

Predicted Density Plot

Description

Plot predicted densities

```
pdPlot(
  object,
  plot.col,
  group.names,
  mean.diff = F,
  var.diff = F,
  skewed.diff = F,
  kurtosis.diff = F,
  ...
)
```

preQuantlets 15

Arguments

object	A Qboneobject
plot.col	Columns to plot from qfrModel() results object@assays[["Q.F.Regression"]]@scale.data[["mcmo. Corresponding to X1 (new covariates) agreement in qfrModel().
group.names	Group name for plot legend for argument plot.col.
mean.diff	T or F to add mean difference testing for two consecutive subjects posterior probability scores
var.diff	T or F to add variance difference testing for two consecutive subjects posterior probability scores
skewed.diff	T or F to add skewness difference testing for two consecutive subjects posterior probability scores
kurtosis.diff	T or F to add kurtosis difference testing for two consecutive subjects posterior probability scores
• • •	Arguments passed to other methods
preQuantlets	Get the pre-quantlets basis functions

Description

Take union set and find near-lossless subset as confirmed by cross-validated concordance correlation coefficient (CVCCC)

Usage

```
preQuantlets(
   object,
   new.assay.name = "Pre.Quantiles",
   data.assay = defaultAssay(object),
   p = signif(seq(0.001, 0.999, length = 1024), 4),
   alpha = c(seq(0.1, 1, by = 0.1), seq(2, 100, by = 1)),
   beta = c(seq(0.1, 1, by = 0.1), seq(2, 100, by = 1)),
   ...
)
```

object	A Qboneobject	
new.assay.name	New assay name assigned to the quantlets data	
data.assay	It is the name of the assay whose data will be used to compute the lasso list. Default is the data from the defaultAssay(object).	
p	Vector of length P in (0,1) Probability grids.	
alpha	Vector containing sequence of beta parameter for internal function generateBetaCDF()	
beta	Vector containing sequence of beta parameter for internal function generateBetaCDF()	
	Arguments passed to other methods	

16 qbasisPlot3D

aba		

Plot first n quantlet basis functions

Description

Plot first n quantlet basis functions

Usage

```
qbasisPlot(object, n = 16, ...)
```

Arguments

object A Qboneobject

Number of first n basis functions to plot, default = 16.

... Arguments passed to other methods

qbasisPlot3D

3D Plot of first n quantlet basis functions

Description

Plot first n quantlet basis functions in 3D Plots

Usage

```
qbasisPlot3D(object, n = 16, ...)
```

Arguments

object A Qboneobject

Number of first n basis functions to plot, default = 16.

. . . Arguments passed to other methods

Qbone-class 17

Description

The Qbone object is a representation of data analysis using Quantile Functional Regression using Quantlets (doi: 10.1080/01621459.2019.1609969) for R.

Slots

```
assays A list of QboneData Object for this project.

meta.data Meta information regarding each sample.

active.assay Name of the active, or default, assay; settable using defaultAssay active.ident The active identity for this Qbone object; settable using idents project.name Name of the project version Version of Qbone this object was built under
```

Qbone-methods

Qbone Methods

Description

Methods for Qbone objects for generics defined in other packages

Usage

```
## S3 method for class 'Qbone'
x[[i, ..., drop = FALSE]]
## S4 replacement method for signature 'Qbone'
x[[i, j, ...]] <- value</pre>
```

x, object	A Qbone object
i	Depends on the method
	[[, [[<- Name of one or more metadata columns or an associated object; associated objects include QboneData double check
• • •	Arguments passed to other methods
drop	See drop
j, samples	Sample names or indices
value	Additional metadata or associated objects to add; note : can pass NULL to remove metadata or an associated object
n	The number of rows of metadata to return

18 QboneData-methods

Value

[[: If i is missing, the metadata data frame; if i is a vector of metadata names, a data frame with the requested metadata, otherwise, the requested associated object

[[<-: x with the metadata or associated objects added as i; if value is NULL, removes metadata or associated object i from object x

Functions

- [[: Metadata and associated object accessor
- `[[`(Qbone) <-value: Metadata and associated object accessor

QboneData-class The QboneData Object is the basic unit of Qbone.

Description

The QboneData Class The QboneData object is the basic unit of Qbone.

Slots

```
data Sample data
scale.data Parameter of data processing
assay.name name of assay
assay.orig Original assay that this assay is based off of. Used to track assay provenance
meta.assays Metadata for the data processing
```

See Also

QboneData-methods

OboneData-methods

QboneData Methods QboneData Methods

Description

Methods for QboneData objects for generics defined in other packages

```
## S3 method for class 'QboneData'
x[[i, ..., drop = FALSE]]
```

qfrModel 19

Arguments

x, object An QboneData object
i, features For [[: metadata names; for all other methods, feature names or indices
... Arguments passed to other methods
drop See drop
j, samples sample names or indices

Value

[[: If i is missing, the metadata data frame; if i is a vector of metadata names, a data frame with the requested metadata, otherwise, the requested associated object

Functions

• [[: Metadata and associated object accessor

qfrModel

Fit the quantile functional regression model

Description

Fit the quantlet space model in using Markov chain Monte Carlo (MCMC)

Usage

```
qfrModel(
  object,
  new.assay.name = "Q.F.Regression",
  data.assay = defaultAssay(object),
  X = NULL,
  X1 = NULL,
  delta2 = 0.95,
  H = NULL,
  pct.range = c(0.05, 0.95),
  assay.seed2 = .Random.seed,
  ...
)
```

Arguments

object A Qboneobject

new.assay.name New assay name assigned to the quantlets data

data.assay It is the name of the assay whose data will be used to compute the lasso list.

Default is the data from the defaultAssay(object).

X Covariates (N by A matrix, N is the number of observations)

20 quantileFPlot3D

X1	New covariates for inferencing MCMC fit result.
delta2	Cutoff percentage of the energy for the functional coefficients
Н	Number of clustering groups. Cluster basis indices based on their eigen-values.
pct.range	Percentage range from original data set. Use as the range of the domain for the density estimate. Default is $c(0.05, 0.95)$. You can override it by assign xranges = $c(min, max)$
	Arguments passed to other methods

quantileFPlot3D

3D Plot of first n quantlet with observed and predicted quantile function

Description

3D Plot of first n quantlet with observed and predicted quantile function

Usage

```
quantileFPlot3D(
  object,
  n = 16,
  group = NULL,
  data.assay = defaultAssay(object),
  plot = "All",
   ...
)
```

object	A Qboneobject
n	Number of first n basis functions to plot, default = 16.
group	Group to be plotted. All group will be plotted if NULL. Default is NULL.
data.assay	It is the name of the assay whose data will be plotted
plot	Plot "Observed", "Quantlets", "Predicted" or "All" which is "Observed -> Quantlets -> Predicted". Default is "All"
	Arguments passed to other methods

readQbone 21

readQbone

Read Qbone from files

Description

Read Qbone from files

Usage

```
readQbone(data.dir, groupbyfolder = F, data.column = 1)
```

Arguments

data.dir the folder directory where the raw csv file saved

groupbyfolder Use parent folder names as sample group information if set to T, default is F

data.column column number of sample data in the raw csv file

samples

Get samples present in an object

Description

Get samples present in an object

Usage

```
samples(x)
## S3 method for class 'QboneData'
samples(x)
## S3 method for class 'Qbone'
samples(x)
```

Arguments

Х

An object

Value

A vector of sample names

22 thinData

Examples

```
## Not run:
samples(x = qbone1)
## End(Not run)
```

set-if-null

Set a default value depending on if an object is NULL From rlang package.

Description

Set a default value depending on if an object is NULL From rlang package.

Usage

Arguments

x An object to testy A default value

Value

For % | 1%: y if x is NULL otherwise x

Examples

```
1 %||% 2
NULL %||% 2
```

thinData

Thin the data If the data set is too big and the calculation is too heavy for your computer you may use this function to thin the data to make the calculation faster. Here we use thin the data proportionally on the sorted data. The new data set should reserve the same quantile feature as it was sequentially subsetted from ordered data set.

thinData 23

Description

Thin the data If the data set is too big and the calculation is too heavy for your computer you may use this function to thin the data to make the calculation faster. Here we use thin the data proportionally on the sorted data. The new data set should reserve the same quantile feature as it was sequentially subsetted from ordered data set.

Usage

```
thinData(object, new.assay.name = "Thin", prop = NULL)
```

Arguments

object An Qboneobject.

new.assay.name new assay name assigned to the thined data

prop proportion to keep from the original data. By default the scale.data of thinData()

will save the prop of thinning

Index

* Data thin	idents<- (idents), 12
thinData, 22	
* QboneData	lassoList, 13
QboneData-methods, 18	levels.Qbone (idents), 12
* data-access	<pre>levels<qbone (idents),="" 12<="" pre=""></qbone></pre>
assayData, 4	
assays, 5	pdPlot, 14
[[.Qbone (Qbone-methods), 17	preQuantlets, 15
[[.QboneData(QboneData-methods), 18	project, 7
[[<-,Qbone-method(Qbone-methods), 17	shaqiaDlat 16
_PACKAGE (Qbone-package), 3	qbasisPlot, 16
	qbasisPlot3D, 16
addMetaData, 3	Qbone, 5, 17
assay, 5	Qbone (Qbone-class), 17
assayData, 4	Qbone-class, 17
assays, 5	Qbone-methods, 17
	Qbone-package, 3
createQboneData, 5	QboneData, 4, 6, 17–19
createQboneObject, 6	QboneData (QboneData-class), 18
d=C=-1+ ====- /	QboneData-class, 18
default assay, 4	QboneData-methods, 18
defaultAssay, 8, 17	qfrModel, 19
defaultAssay<- (defaultAssay), 8 drop, 17, 19	quantileFPlot3D, 20
droplevels.Qbone (idents), 12	readQbone, 21
dxPlot, 9	
dxPlotRev, 9	samples, 21
	set-if-null, 22
ecQuantlets, 10	thimData 22
eigenmapmm (eigenmm), 10	thinData, 22
eigenmapmmt (eigenmm), 10	
eigenmapmt (eigenmm), 10	
eigenmapmtm (eigenmm), 10	
eigenmm, 10	
eigenmt (eigenmm), 10	
getQboneData(assayData),4	
histogram3D, 11	
idents, 12, 17	