Package ‘HiLDA’

March 3, 2024

Type Package

Title Conducting statistical inference on comparing the mutational exposures of mutational signatures by using hierarchical latent Dirichlet allocation

Depends R(>= 4.1), ggplot2

Imports R2jags, abind, cowplot, grid, forcats, stringr, GenomicRanges, S4Vectors, XVector, Biostrings, GenomicFeatures, BSgenome.Hsapiens.UCSC.hg19, BiocGenerics, tidyr, grDevices, stats, TxDb.Hsapiens.UCSC.hg19.knownGene, utils, methods, Rcpp

Suggests knitr, rmarkdown, testthat, BiocStyle

Version 1.16.0

Date 2021-10-13

Description A package built under the Bayesian framework of applying hierarchical latent Dirichlet allocation. It statistically tests whether the mutational exposures of mutational signatures (Shiraishi-model signatures) are different between two groups. The package also provides inference and visualization.

License GPL-3

URL https://github.com/USCbionatics/HiLDA,
https://doi.org/10.1101/577452

BugReports https://github.com/USCbionatics/HiLDA/issues

SystemRequirements JAGS 4.0.0

biocViews Software, SomaticMutation, Sequencing, StatisticalMethod, Bayesian

RoxygenNote 7.1.2

LinkingTo Rcpp

VignetteBuilder knitr

Encoding UTF-8

git_url https://git.bioconductor.org/packages/HiLDA

git_branch RELEASE_3_18
R topics documented:

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```
**boundaryTurbo_F**

**description**
Check whether the parameter F is within the appropriate range

**Usage**

`boundaryTurbo_F(turboF, fdim, signatureNum)`

**Arguments**

- `turboF` : F (converted for turboEM)
- `fdim` : a vector specifying the number of possible values for each mutation signature
- `signatureNum` : the number of mutation signatures

**Value**

a logical value

---

**boundaryTurbo_Q**

**description**
Check whether the parameter Q is within the appropriate range

**Usage**

`boundaryTurbo_Q(turboQ, signatureNum, sampleNum)`

**Arguments**

- `turboQ` : Q (converted for turboEM)
- `signatureNum` : the number of mutation signatures
- `sampleNum` : the number of cancer genomes

**Value**

a logical value
calcPMSLikelihood

Description
A function for calculating the log-likelihood from the data and parameters

Usage
calcPMSLikelihood(p, y)

Arguments
- p
  this variable includes the parameters for mutation signatures and membership parameters
- y
  this variable includes the information on the mutation features, the number of mutation signatures specified and so on

Value
a value

calculate

convertFromTurbo_F

Description
Restore the converted parameter F for turboEM

Usage
convertFromTurbo_F(turboF, fdim, signatureNum, isBackground)

Arguments
- turboF
  F (converted for turboEM)
- fdim
  a vector specifying the number of possible values for each mutation signature
- signatureNum
  the number of mutation signatures
- isBackground
  the logical value showing whether a background mutation features is included or not

Value
a vector
**convertFromTurbo_Q**  
*Restore the converted parameter Q for turboEM*

**Description**

Restore the converted parameter Q for turboEM

**Usage**

```
convertFromTurbo_Q(turboQ, signatureNum, sampleNum)
```

**Arguments**

- **turboQ**: Q (converted for turboEM)
- **signatureNum**: the number of mutation signatures
- **sampleNum**: the number of cancer genomes

**Value**

a vector

---

**convertToTurbo_F**  
*Convert the parameter F so that turboEM can treat*

**Description**

Convert the parameter F so that turboEM can treat

**Usage**

```
convertToTurbo_F(vF, fdim, signatureNum, isBackground)
```

**Arguments**

- **vF**: F (converted to a vector)
- **fdim**: a vector specifying the number of possible values for each mutation signature
- **signatureNum**: the number of mutation signatures
- **isBackground**: the logical value showing whether a background mutation features is included or not

**Value**

a vector
convertToTurbo_Q  

*Convert the parameter Q so that turboEM can treat*

**Description**

Convert the parameter Q so that turboEM can treat

**Usage**

```r
convertToTurbo_Q(vQ, signatureNum, sampleNum)
```

**Arguments**

- `vQ`  
  Q (converted to a vector)
- `signatureNum`  
  the number of mutation signatures
- `sampleNum`  
  the number of cancer genomes

**Value**

a vector

---

**EstimatedParameters-class**

*An S4 class representing the estimated parameters*

**Description**

An S4 class representing the estimated parameters

**Slots**

- `sampleList`  
  a list of sample names observed in the input mutation data
- `signatureNum`  
  the number of mutation signatures specified at the time of estimation
- `isBackground`  
  the flag showing whether the background signature data is used or not.
- `backGroundProb`  
  the background signatures
- `signatureFeatureDistribution`  
  estimated parameters for mutation signatures
- `sampleSignatureDistribution`  
  estimated parameters for memberships of mutation signatures for each sample
- `loglikelihood`  
  the log-likelihood value for the estimated parameters
**getLogLikelihoodC**  
*Calculate the value of the log-likelihood for given parameters*

Description

Calculate the value of the log-likelihood for given parameters

Usage

```r
getLogLikelihoodC(
  vPatternList,  
  vSparseCount,  
  vF,  
  vQ,  
  fdim,  
  signatureNum,  
  sampleNum,  
  patternNum,  
  samplePatternNum,  
  isBackground,  
  vF0
)
```

Arguments

- **vPatternList**  
The list of possible mutation features (converted to a vector)
- **vSparseCount**  
The table showing (mutation feature, sample, the number of mutation) (converted to a vector)
- **vF**  
The list of possible mutation features (converted to a vector)
- **vQ**  
The list of possible mutation features (converted to a vector)
- **fdim**  
a vector specifying the number of possible values for each mutation signature
- **signatureNum**  
the number of mutation signatures
- **sampleNum**  
the number of cancer genomes
- **patternNum**  
the number of possible combinations of all the mutation features
- **samplePatternNum**  
the number of possible combination of samples and mutation patterns
- **isBackground**  
the logical value showing whether a background mutation features is included or not
- **vF0**  
a background mutation features

Value

a value
getMutationFeatureVector

*Get mutation feature vector from context sequence data and reference and alternate allele information*

**Description**

Get mutation feature vector from context sequence data and reference and alternate allele information.

**Usage**

```r
getMutationFeatureVector(
    context, ref_base, alt_base,
    strandInfo = NULL, numBases, type
)
```

**Arguments**

- `context`: the context sequence data around the mutated position. This should be Biostrings::DNAStringSet class.
- `ref_base`: the reference bases at the mutated position.
- `alt_base`: the alternate bases at the mutated position.
- `strandInfo`: transcribed strand information at the mutated position. (this is optional)
- `numBases`: the number of flanking bases around the mutated position.
- `type`: the type of mutation feature vector (should be "independent" or "full").

**Value**

A mutation feature vector.

---

**hildaBarplot**

*Read the raw mutation data with the mutation feature vector format, estimate and plot both mutation signatures and their fractions*

**Description**

Read the raw mutation data with the mutation feature vector format, estimate and plot both mutation signatures and their fractions.
**Usage**

```r
hildaBarplot(
  inputG, 
  hildaResult, 
  sigOrder = NULL, 
  refGroup, 
  sortSampleNum = TRUE, 
  refName = "Control", 
  altName = "Case", 
  charSize = 3
)
```

**Arguments**

- **inputG**: a MutationFeatureData S4 class output by the pmsignature.
- **hildaResult**: a rjags class output by HiLDA.
- **sigOrder**: the order of signatures if needed (default: NULL).
- **refGroup**: the samples in the reference group (default: NULL).
- **sortSampleNum**: whether to sort plots by number of mutations (default: TRUE).
- **refName**: the name of reference group (default: Control)
- **altName**: the name of the other group (default: Case)
- **charSize**: the size of the character on the signature plot (default: 3)

**Value**

a list of a signature plot and a barplot of mutational exposures

**Examples**

```r
load(system.file("extdata/sample.rdata", package="HiLDA"))
inputFile <- system.file("extdata/hildaLocal.rdata", package="HiLDA")
hildaLocal <- readRDS(inputFile)

hildaBarplot(G, hildaLocal, refGroup=1:4)
```

---

**hildaDiffPlot**

*Read the raw mutation data with the mutation feature vector format, estimate and plot both mutation signatures and their fractions*

**Description**

Read the raw mutation data with the mutation feature vector format, estimate and plot both mutation signatures and their fractions
**Usage**

hildaDiffPlot(inputG, hildaResult, sigOrder = NULL, charSize = 3)

**Arguments**

- **inputG**: a MutationFeatureData S4 class output by the pmsignature.
- **hildaResult**: a rjags class output by HiLDA.
- **sigOrder**: the order of signatures if needed (default: NULL).
- **charSize**: the size of the character on the signature plot (default: 3)

**Value**

a list of the signature plot and the mean difference plot.

**Examples**

```r
load(system.file("extdata/sample.rdata", package="HiLDA"))
inputFile <- system.file("extdata/hildaLocal.rdata", package="HiLDA")
hildaLocal <- readRDS(inputFile)

hildaDiffPlot(G, hildaLocal)
```

---

**hildaGlobalResult**  
*Compute the Bayes factor*

**Description**

Compute the Bayes factor

**Usage**

hildaGlobalResult(jagsOutput, pM1 = 0.5)

**Arguments**

- **jagsOutput**: the output jags file generated by the jags function from the R2jags package.
- **pM1**: the probability of sampling the null (default: 0.5)

**Value**

a number for the Bayes factor
Examples

```r
load(system.file("extdata/sample.rdata", package="HiLDA"))
hildaGlobal <- hildaTest(inputG=G, numSig=3, refGroup=1:4, nIter=1000, localTest=TRUE)
hildaGlobalResult(hildaGlobal)
```

---

**hildaLocalResult**

*Extract the posterior distributions of the mean differences in muational exposures*

**Description**

Extract the posterior distributions of the mean differences in muational exposures

**Usage**

```r
hildaLocalResult(jagsOutput)
```

**Arguments**

- `jagsOutput`: the output jags file generated by the jags function from the R2jags package.

**Value**

a data frame that contains the posterior distributions of difference.

**Examples**

```r
inputFile <- system.file("extdata/hildaLocal.rdata", package="HiLDA")
hildaLocal <- readRDS(inputFile)
hildaLocalResult(hildaLocal)
```

---

**hildaPlotSignature**

*Plot mutation signatures from HiLDA output*

**Description**

Plot mutation signatures from HiLDA output

**Usage**

```r
hildaPlotSignature(hildaResult, sigOrder = NULL, colorList = NULL, ...)
```
Arguments

- `hildaResult`: a rjags class output by HiLDA
- `sigOrder`: the order of signatures if needed (default: `NULL`)
- `colorList`: a vector of color for mutational exposures barplots
- `...`: additional arguments passed on to `visPMS`

Value

a plot object containing all mutational signatures

Examples

```r
inputFile <- system.file("extdata/hildaLocal.rdata", package="HiLDA")
hildaLocal <- readRDS(inputFile)
hildaPlotSignature(hildaLocal)
```

Description

The mutation position format is tab-delimited text file, where the 1st-5th columns shows sample names, chromosome names, coordinates, reference bases (A, C, G, or T) and the alternate bases (A, C, G, or T), respectively. An example is as follows;

```
--
sample1 chr1 100 A C
sample1 chr1 200 A T
sample1 chr2 100 G T
sample2 chr1 300 T C
sample3 chr3 400 T C
--
```

Also, this function usually can accept compressed files (e.g., by gzip, bzip2 and so on) when using recent version of R.

Usage

```r
hildaReadMPFile(
  inFile,
  numBases = 3,
  trDir = FALSE,
  bs_genome = NULL,
  txdb_transcript = NULL
)
```
Arguments

infile the path for the input file for the mutation data of Mutation Position Format.
numBases the number of upstream and downstream flanking bases (including the mutated base) to take into account.
trDir the index representing whether transcription direction is considered or not. The gene annotation information is given by UCSC knownGene (TxDb.Hsapiens.UCSC.hg19.knownGene object) When trDir is TRUE, the mutations located in intergenic region are excluded from the analysis.
bs_genome this argument specifies the reference genome (e.g., BSgenome.Musculus.UCSC.mm10 can be used for the mouse genome). See https://bioconductor.org/packages/release/bioc/html/BSgenome.html for the available genome list.
txdb_transcript this argument specified the transcript database (e.g., TxDb.Musculus.UCSC.mm10.knownGene can be used for the mouse genome). See https://bioconductor.org/packages/release/bioc/html/AnnotationDbi.html for details.

Value

The output is an instance of MutationFeatureData S4 class (which stores summarized information on mutation data). This will be typically used as the initial values for the global test and the local test.

Examples

```r
inputFile <- system.file("extdata/esophageal.mp.txt.gz", package="HiLDA")
G <- hildaReadMPFile(inputFile, numBases=5, trDir=TRUE)
```

## hildaRhat

Output the maximum potential scale reduction statistic of all parameters estimated

Description

Output the maximum potential scale reduction statistic of all parameters estimated

Usage

hildaRhat(jagsOutput)

Arguments

jagsOutput the output jags file generated by the jags function from the R2jags package.
Value

a number for the Rhat statistic.

Examples

```r
inputFile <- system.file("extdata/hildaLocal.rdata", package="HiLDA")
hildaLocal <- readRDS(inputFile)
hildaRhat(hildaLocal)
```

---

hildaTest

Apply HiLDA to statistically testing the global difference in burdens of mutation signatures between two groups

Description

Apply HiLDA to statistically testing the global difference in burdens of mutation signatures between two groups

Usage

```r
hildaTest(    inputG,    numSig,    refGroup,    useInits = NULL,    sigOrder = NULL,    nIter = 2000,    nBurnin = 0,    pM1 = 0.5,    localTest = TRUE,    ...)
```

Arguments

- `inputG`: a MutationFeatureData S4 class output by the pmsignature.
- `numSig`: an integer number of the number of mutational signatures.
- `refGroup`: the indice indicating the samples in the reference group.
- `useInits`: a EstimatedParameters S4 class output by the pmsignature (default: NULL)
- `sigOrder`: the order of the mutational signatures.
- `nIter`: number of total iterations per chain (default: 2000).
- `nBurnin`: length of burn (default: 0).
- `pM1`: the probability of sampling the null (default: 0.5)
- `localTest`: a logical value (default: TRUE)
- `...`: Other arguments passed on to methods.
Value

the output jags file

Examples

load(system.file("extdata/sample.rdata", package="HiLDA"))

## with initial values
hildaLocal <- hildaTest(inputG=G, numSig=3, refGroup=1:4, nIter=1000,
localTest=TRUE)
hildaGlobal <- hildaTest(inputG=G, numSig=3, refGroup=1:4, nIter=1000,
localTest=FALSE)
**mySquareEM**  
*A function for estimating parameters using Squared EM algorithm*

**Description**

A function for estimating parameters using Squared EM algorithm

**Usage**

```r
mySquareEM(p, y, tol = 1e-04, maxIter = 10000)
```

**Arguments**

- `p`: this variable includes the parameters for mutation signatures and membership parameters
- `y`: this variable includes the information on the mutation features, the number of mutation signatures specified and so on
- `tol`: tolerance for the estimation (when the difference of log-likelihoods become below this value, stop the estimation)
- `maxIter`: the maximum number of iteration of estimation

**Value**

a list

---

**pmBarplot**  
*Plot both mutation signatures and their mutational exposures from pmsignature output*

**Description**

Plot both mutation signatures and their mutational exposures from pmsignature output

**Usage**

```r
pmBarplot(
  inputG,
  inputParam,
  sigOrder = NULL,
  refGroup = NULL,
  sortSampleNum = TRUE,
  refName = "Control",
  altName = "Case",
  charSize = 3
)
```
pmgetSignature

Obtain the parameters for mutation signatures and memberships

Description

Obtain the parameters for mutation signatures and memberships

Usage

pmgetSignature(
  mutationFeatureData,
  K,
  numInit = 10,
  tol = 1e-04,
  maxIter = 10000
)
pmMultiBarplot

**Arguments**

- `mutationFeatureData`: the mutation data (MutationFeatureData class (S4 class)) by the hildaReadMPFile.
- `K`: the number of mutation signatures
- `numInit`: the number of performing calculations with different initial values
- `tol`: tolerance for the estimation (when the difference of log-likelihoods become below this value, stop the estimation)
- `maxIter`: the maximum number of iteration of estimation

**Value**

The output is an instance of EstimatedParameters S4 class, which stores estimated parameters and other meta-information, and will be used for saving parameter values and visualizing the mutation signatures and memberships

**Examples**

```r
## After obtaining G (see e.g., hildaReadMPFile function)
load(system.file("extdata/sample.rdata", package="HiLDA"))
Param <- pmgetSignature(G, K = 3)
```

---

**pmMultiBarplot**  
*Plot both mutation signatures and their mutational exposures from pm-signature output for more than two groups*

**Description**

Plot both mutation signatures and their mutational exposures from pmSignature output for more than two groups

**Usage**

```r
pmMultiBarplot(
  inputG,  
  inputParam,  
  sigOrder = NULL,  
  groupIndices,  
  sortSampleNum = TRUE,  
  charSize = 3
)
```
pmPlotSignature

**Arguments**

- **inputG**: a MutationFeatureData S4 class output by the pmsignature.
- **inputParam**: a estimatedParameters S4 class output by the pmsignature.
- **sigOrder**: the order of signatures if needed (default: NULL).
- **groupIndices**: a vector of group indicators.
- **sortSampleNum**: an indicator variable on whether samples are sorted by the number of mutations (default: TRUE).
- **charSize**: the size of the character on the signature plot (default: 3)

**Value**

a list of the signature plot and the mean difference plot.

**Examples**

```r
load(system.file("extdata/sample.rdata", package="HiLDA"))
Param <- pmgetSignature(G, K = 3)

pmPlots <- pmMultiBarplot(G, Param, groupIndices=c(1, rep(2,3), rep(3,6)))
cowplot::plot_grid(pmPlots$sigPlot, pmPlots$propPlot, rel_widths = c(1,3))
```

---

**pmPlotSignature**

*Plot mutation signatures from pmsignature output*

**Description**

Plot mutation signatures from pmsignature output

**Usage**

```r
pmPlotSignature(inputParam, sigOrder = NULL, colorList = NULL, ...)
```

**Arguments**

- **inputParam**: a estimatedParameters S4 class output by the pmsignature.
- **sigOrder**: the order of signatures if needed (default: NULL).
- **colorList**: a list of color to highlight the signatures (default: NULL).
- **...**: additional arguments passed on to visPMS.

**Value**

a plot object containing all mutational signatures
load(system.file("extdata/sample.rdata", package="HiLDA"))
Param <- pmgetSignature(G, K = 3)
pmPlotSignature(Param)

PMSboundary A functional for generating the function checking the parameter (p) is within the restricted conditions or not

Description
A functional for generating the function checking the parameter (p) is within the restricted conditions or not

Usage
PMSboundary(y)

Arguments
y this variable includes the information on the mutation features, the number of mutation signatures specified and so on

Value
a functional

updateMstepFQC Update the parameter F and Q (M-step in the EM-algorithm)

Description
Update the parameter F and Q (M-step in the EM-algorithm)

Usage
updateMstepFQC(
  vPatternList, 
  vSparseCount, 
  nTheta, 
  fdim, 
  signatureNum, 
  sampleNum, 
  patternNum, 
  samplePatternNum, 
  isBackground 
)
**updatePMSParam**

**Arguments**

- `vPatternList`: The list of possible mutation features (converted to a vector)
- `vSparseCount`: The table showing (mutation feature, sample, the number of mutation) (converted to a vector)
- `nTheta`: The parameters in the distribution
- `fdim`: A vector specifying the number of possible values for each mutation signature
- `signatureNum`: The number of mutation signatures
- `sampleNum`: The number of cancer genomes
- `patternNum`: The number of possible combinations of all the mutation features
- `samplePatternNum`: The number of possible combination of samples and mutation patterns
- `isBackground`: The logical value showing whether a background mutation features is included or not

**Value**

a vector

---

**updatePMSParam** *A function for updating parameters using EM-algorithm*

**Description**

A function for updating parameters using EM-algorithm

**Usage**

`updatePMSParam(p, y)`

**Arguments**

- `p`: this variable includes the parameters for mutation signatures and membership parameters
- `y`: this variable includes the information on the mutation features, the number of mutation signatures specified and so on

**Value**

a value
updateTheta_NormalizedC

Update the auxiliary parameters theta and normalize them so that the summation of each group sums to 1 (E-step), also calculate the current log-likelihood value

**Description**

Update the auxiliary parameters theta and normalize them so that the summation of each group sums to 1 (E-step), also calculate the current log-likelihood value

**Usage**

```r
updateTheta_NormalizedC(
  vPatternList,
  vSparseCount,
  vF,
  vQ,
  fdim,
  signatureNum,
  sampleNum,
  patternNum,
  samplePatternNum,
  isBackground,
  vF0
)
```

**Arguments**

- `vPatternList`: The list of possible mutation features (converted to a vector)
- `vSparseCount`: The table showing (mutation feature, sample, the number of mutation) (converted to a vector)
- `vF`: F (converted to a vector)
- `vQ`: Q (converted to a vector)
- `fdim`: a vector specifying the number of possible values for each mutation signature
- `signatureNum`: the number of mutation signatures
- `sampleNum`: the number of cancer genomes
- `patternNum`: the number of possible combinations of all the mutation features
- `samplePatternNum`: the number of possible combination of samples and mutation patterns
- `isBackground`: the logical value showing whether a background mutation features is included or not
- `vF0`: a background mutation features
visPMS

Value

a value for theta

visPMS visualize probabisitic mutation signature for the independent model

Description

Generate visualization of mutation signatures for the model with substitution patterns and flanking bases represented by the independent representation.

Usage

visPMS(
  vF,
  numBases,
  baseCol = NA,
  trDir = FALSE,
  charSize = 5,
  isScale = FALSE,
  alpha = 2,
  charLimit = 0.25
)

Arguments

vF a matrix for mutation signature
numBases the number of flanking bases
baseCol the colour of the bases (A, C, G, T, plus/minus strand)
trDir the index whether the strand direction is plotted or not
charSize the size of the character
isScale the index whether the height of the flanking base is changed or not
alpha the parameter for the Renyi entropy (applicable only if the isScale is TRUE)
charLimit the limit of char size

Value

a plot of the input mutational signature

Examples

load(system.file("extdata/sample.rdata", package="HiLDA"))
Param <- pmgetSignature(G, K = 3)

sig <- slot(Param, "signatureFeatureDistribution")[1,,]
visPMS(sig, numBases = 5, isScale = TRUE)
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