

# Package ‘EBSeq’

July 9, 2025

**Type** Package

**Title** An R package for gene and isoform differential expression analysis of RNA-seq data

**Version** 2.6.0

**Date** 2015-12-8

**Depends** blockmodeling, gplots, testthat, R (>= 3.0.0)

**Description** Differential Expression analysis at both gene and isoform level using RNA-seq data

**License** Artistic-2.0

**LazyLoad** yes

**Collate** 'MedianNorm.R' 'GetNg.R' 'beta.mom.R' 'EBTest.R'  
'GetPatterns.R' 'EBMultiTest.R' 'PostFC.R' 'GetPPMat.R'  
'GetMultiPP.R' 'GetMultiFC.R' 'PlotPostVsRawFC.R' 'crit\_fun.R'  
'DenNHist.R' 'GetNormalizedMat.R' 'PlotPattern.R'  
'PolyFitPlot.R' 'QQP.R' 'QuantileNorm.R' 'RankNorm.R'  
'GetDEResults.R' 'EBSeqTest.R' 'Likefun.R' 'LikefunMulti.R'  
'LogN.R' 'LogNMulti.R' 'f0.R' 'f1.R' 'GetSelectedPatterns.R'

**BuildVignettes** no

**Imports** Rcpp (>= 0.12.11), RcppEigen (>= 0.3.2.9.0), BH (<= 1.87.0-1)

**LinkingTo** Rcpp, RcppEigen, BH

**SystemRequirements** c++14

**Roxygen** list(wrap=FALSE)

**RoxygenNote** 7.1.0

**biocViews** ImmunoOncology, StatisticalMethod, DifferentialExpression, MultipleComparison, RNASeq, Sequencing

**NeedsCompilation** no

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EBSeq\_NingLeng-package

*EBSeq: RNA-Seq Differential Expression Analysis on both gene and isoform level*

---

## Description

In 'EBSeq\_NingLeng-package,' a Negative Binomial-beta model was built to analyze the RNASeq data. We used the empirical bayes method and EM algrithom.

## Details

|           |                           |
|-----------|---------------------------|
| Package:  | EBSeq_NingLeng            |
| Type:     | Package                   |
| Version:  | 1.0                       |
| Date:     | 2011-06-13                |
| License:  | What license is it under? |
| LazyLoad: | yes                       |

## Author(s)

Ning Leng,Xiuyu Ma, Christina Kendziorski, Michael A. Newton

Maintainer: Ning Leng <lengning1@gmail.com> Xiuyu Ma <watsonforfun@gmail.com>

## References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

## See Also

EBTest, EBMultiTest

## Examples

```
data(GeneMat)
GeneMat.small = GeneMat[c(1:10,511:550),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data=GeneMat.small,
  Conditions=as.factor(rep(c("C1","C2"), each=5)),
  sizeFactors=Sizes, maxround=5)
```

---

`beta.mom`*Fit the beta distribution by method of moments*

---

**Description**

'beta.mom' fits the beta distribution by method of moments.

**Usage**

```
beta.mom(qs.in)
```

**Arguments**

`qs.in` A vector contains the numbers that are assumed to follow a beta distribution.

**Value**

`alpha.hat` Returns the estimation of alpha.

`beta.hat` Returns the estimation of beta.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

DenNHist, DenNHistTable

**Examples**

```
#tmp = rbeta(5, 5, 100)
#param = beta.mom(tmp)
```

---

|          |                                                      |
|----------|------------------------------------------------------|
| crit_fun | <i>Calculate the soft threshold for a target FDR</i> |
|----------|------------------------------------------------------|

---

## Description

'crit\_fun' calculates the soft threshold for a target FDR.

## Usage

```
crit_fun(PPEE, thre)
```

## Arguments

|      |                                          |
|------|------------------------------------------|
| PPEE | The posterior probabilities of being EE. |
| thre | The target FDR.                          |

## Details

Regarding a target FDR  $\alpha$ , both hard threshold and soft threshold could be used. If the hard threshold is preferred, user could simply take the transcripts with PP(DE) greater than  $(1-\alpha)$ . Using the hard threshold, any DE transcript in the list is with  $FDR \leq \alpha$ .

If the soft threshold is preferred, user could take the transcripts with PP(DE) greater than  $\text{crit\_fun}(\text{PPEE}, \alpha)$ . Using the soft threshold, the list of DE transcripts is with average FDR  $\alpha$ .

## Value

The adjusted FDR threshold of target FDR.

## Author(s)

Ning Leng

## References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

## Examples

```
data(GeneMat)
GeneMat.small = GeneMat[c(1:10, 500:600),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1", "C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
PP = GetPPMat(EBOut)
DEfound = rownames(PP)[which(PP[, "PPDE"] >= 0.95)]
```

```
str(DEfound)

SoftThre = crit_fun(PP[, "PPEE"], 0.05)
DEfound_soft = rownames(PP)[which(PP[, "PPDE"] >= SoftThre)]
```

---

|          |                                                                                                           |
|----------|-----------------------------------------------------------------------------------------------------------|
| DenNHist | <i>Density plot to compare the empirical q's and the simulated q's from the fitted beta distribution.</i> |
|----------|-----------------------------------------------------------------------------------------------------------|

---

## Description

'DenNHist' gives the density plot that compares the empirical q's and the simulated q's from the fitted beta distribution.

## Usage

```
DenNHist(EBOut, GeneLevel = F)
```

## Arguments

|           |                                                           |
|-----------|-----------------------------------------------------------|
| EBOut     | The output of EBTest or EBMultiTest.                      |
| GeneLevel | Indicate whether the results are from data at gene level. |

## Value

For data with n1 conditions and n2 uncertainty groups, n1\*n2 plots will be generated. Each plot represents a subset of the data. The empirical estimation of q's will be represented as blue histograms and the density of the fitted beta distribution will be represented as the green line.

## Author(s)

Ning Leng

## References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

## See Also

beta.mom, QQP, EBTest, EBMultiTest

## Examples

```
data(GeneMat)
GeneMat.small = GeneMat[c(500:1000),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1", "C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
par(mfrow = c(2,2))
DenNHist(EBOut)
```

---

|             |                                                                                                                         |
|-------------|-------------------------------------------------------------------------------------------------------------------------|
| EBMultiTest | <i>Using EM algorithm to calculate the posterior probabilities of interested patterns in a multiple condition study</i> |
|-------------|-------------------------------------------------------------------------------------------------------------------------|

---

## Description

'EBMultiTest' is built based on the assumption of NB-Beta Empirical Bayes model. It utilizes the EM algorithm to give the posterior probability of the interested patterns.

## Usage

```
EBMultiTest(Data, NgVector = NULL, Conditions, sizeFactors, uc = 0, AllParti = NULL, fast = T,
  Alpha = NULL, Beta = NULL, Qtrm = 1, QtrmCut = 0, maxround = 50,
  step1 = 1e-6, step2 = 1e-4, thre = 1.15, sthre = 0,
  filter = 1, stopthre = 1e-04, nequal = 0)
```

## Arguments

|             |                                                                                                                                                                                                                                                                                                                                                                                  |
|-------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Data        | A data matrix contains expression values for each transcript (gene or isoform level). In which rows should be transcripts and columns should be samples.                                                                                                                                                                                                                         |
| NgVector    | A vector indicates the uncertainty group assignment of each isoform. e.g. if we use number of isoforms in the host gene to define the uncertainty groups, suppose the isoform is in a gene with 2 isoforms, Ng of this isoform should be 2. The length of this vector should be the same as the number of rows in Data. If it's gene level data, Ngvector could be left as NULL. |
| Conditions  | A vector indicates the condition in which each sample belongs to.                                                                                                                                                                                                                                                                                                                |
| sizeFactors | The normalization factors. It should be a vector with lane specific numbers (the length of the vector should be the same as the number of samples, with the same order as the columns of Data).                                                                                                                                                                                  |
| uc          | number of unceratin positions, unit levels                                                                                                                                                                                                                                                                                                                                       |
| AllParti    | user specified set of partitions, a matrix, with each row represent a partition                                                                                                                                                                                                                                                                                                  |
| fast        | boolean indicator whether to use fast EBSeq or full EBSeq                                                                                                                                                                                                                                                                                                                        |
| Alpha       | start value of hyper parameter alpha                                                                                                                                                                                                                                                                                                                                             |
| Beta        | start value of hyper parameter beta                                                                                                                                                                                                                                                                                                                                              |

|               |                                                                                                                                                                                                                                         |
|---------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Qtrm, QtrmCut | Transcripts with Qtrm th quantile $\leq$ QtrmCut will be removed before testing. The default value is Qtrm = 1 and QtrmCut=0. By default setting, transcripts with all 0's won't be tested.                                             |
| maxround      | Number of iterations. The default value is 50. Users should always check the convergency by looking at the Alpha and Beta in output. If the hyper-parameter estimations are not converged in 50 iterations, larger number is suggested. |
| step1         | stepsize for gradient ascent of alpha                                                                                                                                                                                                   |
| step2         | stepsize for gradient ascent of beta                                                                                                                                                                                                    |
| thre          | threshold for determining the state of a position                                                                                                                                                                                       |
| sthre         | shrinkage threshold for iterative pruning during the EM updates                                                                                                                                                                         |
| filter        | filterthreshold for low expression units                                                                                                                                                                                                |
| stopthre      | stopping threshold for EM                                                                                                                                                                                                               |
| nequal        | when there is a chain of equal states with the number of equal states bigger than nequal, equalhandle algorithm will be used to further checking the homogeneity between the group means                                                |

### Value

|              |                                                                                                                                                                                                                                                                  |
|--------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Alpha        | Fitted parameter alpha of the prior beta distribution.                                                                                                                                                                                                           |
| Beta         | Fitted parameter beta of the prior beta distribution.                                                                                                                                                                                                            |
| P            | Global proportion of DE patterns.                                                                                                                                                                                                                                |
| RList        | The fitted values of r for each transcript.                                                                                                                                                                                                                      |
| MeanList     | The mean of each transcript (across conditions).                                                                                                                                                                                                                 |
| VarList      | The variance of each transcript (across conditions).                                                                                                                                                                                                             |
| QList        | The fitted q values of each transcript within the two conditions                                                                                                                                                                                                 |
| Mean         | The mean of each transcript within the two conditions (adjusted by normalization factors).                                                                                                                                                                       |
| Var          | The estimated variance of each transcript within the two conditions (adjusted by normalization factors).                                                                                                                                                         |
| PoolVar      | The variance of each transcript (The pooled value of within condition EstVar).                                                                                                                                                                                   |
| DataNorm     | Normalized expression matrix.                                                                                                                                                                                                                                    |
| Iso          | same as NgVector                                                                                                                                                                                                                                                 |
| AllZeroIndex | The transcript with expression 0 for all samples (which are not tested).                                                                                                                                                                                         |
| PPMat        | The Posterior Probability of following each pattern (columns) for each transcript (rows). Transcripts with expression 0 for all samples are not shown in this matrix.                                                                                            |
| AllParti     | selected patterns                                                                                                                                                                                                                                                |
| PPMatWith0   | The Posterior Probability of following each pattern (columns) for each transcript (rows). Transcripts with expression 0 for all samples are shown in this matrix with PP(any_patrn)=NA. The transcript order is exactly the same as the order of the input data. |
| Conditions   | The input conditions.                                                                                                                                                                                                                                            |
| NumUC        | The number of uncertain positions at each unit                                                                                                                                                                                                                   |

Author(s)

Ning Leng, Xiuyu Ma

References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

See Also

EBTest, GetMultiPP, GetMultiFC

Examples

```
data(MultiGeneMat)
Conditions = c("C1", "C1", "C2", "C2", "C3", "C3")
MultiSize = MedianNorm(MultiGeneMat)
MultiOut = EBMultiTest(MultiGeneMat, Conditions=Conditions, uc = 2,
                      sizeFactors=MultiSize)
MultiPP = GetMultiPP(MultiOut)
```

---

|           |                   |
|-----------|-------------------|
| EBSeqTest | <i>EBSeq core</i> |
|-----------|-------------------|

---

Description

core function of EBSeq computation. Users are expected to use the wrappers, 2 conditions scenario, using EBTest, more than 2 conditiions, using EBMultiTest

Usage

```
EBSeqTest(data, conditions, uc, AllParti = NULL, iLabel = 1, sizefactor = 1,
  iter = 50, alpha = 0.4, beta = 0, step1 = 1e-6, step2 = 1e-4,
  thre = 1.15, sthre = 0, filter = 1, stopthre = 1e-4, nequal = 0)
```

Arguments

|            |                                                                                                                                                                                                               |
|------------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| data       | A data matrix contains expression values for each transcript (gene or isoform level). In which rows should be transcripts and columns should be samples. For single cell data, normalized counts are required |
| conditions | condition label for samples                                                                                                                                                                                   |
| uc         | number of unceratin positions, unit level                                                                                                                                                                     |
| AllParti   | user specified set of partitions                                                                                                                                                                              |
| iLabel     | label for isoform, indicating how beta are shared among units                                                                                                                                                 |

|            |                                                                                                                                                                                                 |
|------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| sizefactor | The normalization factors. It should be a vector with lane specific numbers (the length of the vector should be the same as the number of samples, with the same order as the columns of Data). |
| iter       | maximum iteration step of EM                                                                                                                                                                    |
| alpha      | start value of hyper parameter alpha                                                                                                                                                            |
| beta       | start value of hyper parameter beta                                                                                                                                                             |
| step1      | stepsize for gradient ascent of alpha                                                                                                                                                           |
| step2      | stepsize for gradient ascent of beta                                                                                                                                                            |
| thre       | threshold for determining the state of a position                                                                                                                                               |
| sthre      | shrinkage threshold for iterative pruning during the EM updates                                                                                                                                 |
| filter     | filterthreshold for low expression units                                                                                                                                                        |
| stopthre   | stopping threshold for EM                                                                                                                                                                       |
| nequal     | when there is a chain of equal states with the number of equal states bigger than nequal, equalhandle algorithm will be used to further checking the homogeneity between the group means        |

### Value

a list containing selected DE patterns and their posterior probabilities, values for alpha and beta, some moments of the data

---

|        |                                                                                |
|--------|--------------------------------------------------------------------------------|
| EBTest | <i>Using EM algorithm to calculate the posterior probabilities of being DE</i> |
|--------|--------------------------------------------------------------------------------|

---

### Description

Base on the assumption of NB-Beta Empirical Bayes model, the EM algorithm is used to get the posterior probability of being DE.

### Usage

```
EBTest(Data, NgVector = NULL, Conditions, sizeFactors, fast = T,
       Alpha = NULL, Beta = NULL, Qtrm = 1, QtrmCut = 0, maxround = 50,
       step1 = 1e-6, step2 = 1e-4, thre = 1.15, sthre = 0,
       filter = 1, stopthre = 1e-4)
```

### Arguments

|          |                                                                                                                                                                                                                                                                                                                                                                                  |
|----------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Data     | A data matrix contains expression values for each transcript (gene or isoform level). In which rows should be transcripts and columns should be samples.                                                                                                                                                                                                                         |
| NgVector | A vector indicates the uncertainty group assignment of each isoform. e.g. if we use number of isoforms in the host gene to define the uncertainty groups, suppose the isoform is in a gene with 2 isoforms, Ng of this isoform should be 2. The length of this vector should be the same as the number of rows in Data. If it's gene level data, Ngvector could be left as NULL. |

|               |                                                                                                                                                                                                                                         |
|---------------|-----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Conditions    | A factor indicates the condition which each sample belongs to.                                                                                                                                                                          |
| sizeFactors   | The normalization factors. It should be a vector with lane specific numbers (the length of the vector should be the same as the number of samples, with the same order as the columns of Data).                                         |
| fast          | boolean indicator whether to use fast EBSeq or full EBSeq                                                                                                                                                                               |
| Alpha         | start value of hyper parameter alpha                                                                                                                                                                                                    |
| Beta          | start value of hyper parameter beta                                                                                                                                                                                                     |
| Qtrm, QtrmCut | Transcripts with Qtrm th quantile $\leq$ QtrmCut will be removed before testing. The default value is Qtrm = 1 and QtrmCut=0. By default setting, transcripts with all 0's won't be tested.                                             |
| maxround      | Number of iterations. The default value is 50. Users should always check the convergency by looking at the Alpha and Beta in output. If the hyper-parameter estimations are not converged in 50 iterations, larger number is suggested. |
| step1         | stepsize for gradient ascent of alpha                                                                                                                                                                                                   |
| step2         | stepsize for gradient ascent of beta                                                                                                                                                                                                    |
| thre          | threshold for determining the state of a position                                                                                                                                                                                       |
| sthre         | shrinkage threshold for iterative pruning during the EM updates                                                                                                                                                                         |
| filter        | filterthreshold for low expression units                                                                                                                                                                                                |
| stopthre      | stopping threshold for EM                                                                                                                                                                                                               |

## Details

For each transcript  $g_i$  within condition, the model assumes:  $X_{g_i} \sim \text{NB}(r_{g_i} * l_s, q_{g_i})$   
 $q_{g_i} \sim \text{Beta}(\alpha, \beta^{N_{g_i}})$  In which the  $l_s$  is the sizeFactors of samples.

The function will test " $H_0: q_{g_i}^{C1} = q_{g_i}^{C2}$ " and " $H_1: q_{g_i}^{C1} \neq q_{g_i}^{C2}$ ."

## Value

|          |                                                                                                          |
|----------|----------------------------------------------------------------------------------------------------------|
| Alpha    | Fitted parameter alpha of the prior beta distribution.                                                   |
| Beta     | Fitted parameter beta of the prior beta distribution.                                                    |
| P        | Global proportion of DE patterns.                                                                        |
| RList    | The fitted values of $r$ for each transcript.                                                            |
| MeanList | The mean of each transcript (across conditions).                                                         |
| VarList  | The variance of each transcript (across conditions).                                                     |
| QList    | The fitted $q$ values of each transcript within the two conditions                                       |
| Mean     | The mean of each transcript within the two conditions (adjusted by normalization factors).               |
| Var      | The estimated variance of each transcript within the two conditions (adjusted by normalization factors). |
| PoolVar  | The variance of each transcript (The pooled value of within condition EstVar).                           |
| DataNorm | Normalized expression matrix.                                                                            |

|              |                                                                                                                                                                                                                                                                                                    |
|--------------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| AllZeroIndex | The transcript with expression 0 for all samples (which are not tested).                                                                                                                                                                                                                           |
| Iso          | same as NgVector                                                                                                                                                                                                                                                                                   |
| PPMat        | A matrix contains posterior probabilities of being EE (the first column) or DE (the second column). Rows are transcripts. Transcripts with expression 0 for all samples are not shown in this matrix.                                                                                              |
| AllParti     | selected patterns                                                                                                                                                                                                                                                                                  |
| PPMatWith0   | A matrix contains posterior probabilities of being EE (the first column) or DE (the second column). Rows are transcripts. Transcripts with expression 0 for all samples are shown as PP(EE) = PP(DE) = NA in this matrix. The transcript order is exactly the same as the order of the input data. |
| Conditions   | The input conditions.                                                                                                                                                                                                                                                                              |

### Author(s)

Ning Leng, Xiuyu Ma

### References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

### See Also

EBMultiTest, PostFC, GetPPMat

### Examples

```
data(GeneMat)
str(GeneMat)
Sizes = MedianNorm(GeneMat)
EBOut = EBTest(Data=GeneMat, Conditions=as.factor(rep(c("C1", "C2"), each=5)),
               sizeFactors = Sizes)
PP = GetPPMat(EBOut)
```

---

f0

*The Prior Predictive Distribution of being EE*

---

### Description

'f0' gives the Prior Predictive Distribution of being EE.

### Usage

```
f0(Input, AlphaIn, BetaIn, EmpiricalR, NumOfGroups, log)
```

**Arguments**

|                             |                                                     |
|-----------------------------|-----------------------------------------------------|
| Input                       | Expression Values.                                  |
| AlphaIn, BetaIn, EmpiricalR | The parameters estimated from last iteration of EM. |
| NumOfGroups                 | How many transcripts within each Ng group.          |
| log                         | If true, will give the log of the output.           |

**Value**

The function will return the prior predictive distribution values of being EE.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

f1

**Examples**

```
#
#f0(matrix(rnorm(100,100,1),ncol=10), .5, .6,
# matrix(rnorm(100,200,1),ncol=10), 100, TRUE)
```

---

f1

---

*The Prior Predictive Distribution of being DE*


---

**Description**

'f1' gives the Prior Predictive Distribution of DE.

**Usage**

```
f1(Input1, Input2, AlphaIn, BetaIn, EmpiricalRSP1,
    EmpiricalRSP2, NumOfGroup, log)
```

**Arguments**

|                                               |                                                     |
|-----------------------------------------------|-----------------------------------------------------|
| Input1                                        | Expressions from Condition1.                        |
| Input2                                        | Expressions from Condition2.                        |
| AlphaIn, BetaIn, EmpiricalRSP1, EmpiricalRSP2 | The parameters estimated from last iteration of EM. |
| NumOfGroup                                    | How many transcripts within each Ng group.          |
| log                                           | If true, will give the log of the output.           |

**Value**

The function will return the prior predictive distribution values of being DE.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

f0

**Examples**

```
#f1(matrix(rnorm(100,100,1),ncol=10),
# matrix(rnorm(100,100,1),ncol=10), .5, .6,
# matrix(rnorm(100,200,1),ncol=10),
# matrix(rnorm(100,200,1),ncol=10), 100, TRUE)
```

---

GeneMat

*The simulated data for two condition gene DE analysis*

---

**Description**

'GeneMat' gives the simulated data for two condition gene DE analysis.

**Usage**

```
data(GeneMat)
```

**Source**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

IsoList

**Examples**

```
data(GeneMat)
```

---

|              |                                                                                |
|--------------|--------------------------------------------------------------------------------|
| GetDEResults | <i>Obtain Differential Expression Analysis Results in a Two-condition Test</i> |
|--------------|--------------------------------------------------------------------------------|

---

**Description**

Obtain DE analysis results in a two-condition test using the output of EBTest()

**Usage**

```
GetDEResults(EBPrelim, FDR=0.05, Method="robust",  
             FDRMethod="hard", Threshold_FC=0.7,  
             Threshold_FCRatio=0.3, SmallNum=0.01)
```

**Arguments**

|           |                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                               |
|-----------|---------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| EBPrelim  | Output from the function EBTest().                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                            |
| FDR       | Target FDR, default is 0.05.                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                  |
| FDRMethod | "hard" or "soft". Giving a target FDR alpha, either hard threshold and soft threshold may be used. If the hard threshold is preferred, DE transcripts are defined as the the transcripts with PP(DE) greater than (1-alpha). Using the hard threshold, any DE transcript in the list has FDR <= alpha.<br><br>If the soft threshold is preferred, the DE transcripts are defined as the transcripts with PP(DE) greater than crit_fun(PPEE, alpha). Using the soft threshold, the list of DE transcripts has average FDR alpha.<br><br>Based on results from our simulation studies, hard thresholds provide a better-controlled empirical FDR when sample size is relatively small(Less than 10 samples in each condition). User may consider the soft threshold when sample size is large to improve power. |
| Method    | "robust" or "classic". Using the "robust" option, EBSeq is more robust to genes with outliers and genes with extremely small variances. Using the "classic" option, the results will be more comparable to those obtained by using the GetPP-Mat() function from earlier version (<= 1.7.0) of EBSeq. Default is "robust".                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |

|                   |                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                    |
|-------------------|------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Threshold_FC      | Threshold for the fold change (FC) statistics. The default is 0.7. The FC statistics are calculated as follows. First the posterior FC estimates are calculated using PostFC() function. The FC statistics is defined as $\exp(-\log(\text{posterior FC}))$ and therefore is always less than or equal to 1. The default threshold was selected as the optimal threshold learned from our simulation studies. By setting the threshold as 0.7, the expected FC for a DE transcript is less than 0.7 (or greater than $1/0.7=1.4$ ). User may specify their own threshold here. A higher (less conservative) threshold may be used here when sample size is large. Our simulation results indicated that when there are more than or equal to 5 samples in each condition, a less conservative threshold will improve the power when the FDR is still well-controlled. The parameter will be ignored if Method is set as "classic". |
| Threshold_FCRatio | Threshold for the fold change ratio (FCRatio) statistics. The default is 0.3. The FCRatio statistics are calculated as follows. First we get another revised fold change statistic called Median-FC statistic for each transcript. For each transcript, we calculate the median of normalized expression values within each condition. The MedianFC is defined as $\exp(-\log((C1\text{Median}+SmallNum)/(C2\text{Median}+SmallNum)))$ . Note a small number is added to avoid Inf and NA. See SmallNum for more details. The FCRatio is calculated as $\exp(-\log(FC\text{statistics}/MedianFC))$ . Therefore it is always less than or equal to 1. The default threshold was selected as the optimal threshold learned from our simulation studies. By setting the threshold as 0.3, the FCRatio for a DE transcript is expected to be larger than 0.3.                                                                          |
| SmallNum          | When calculating the FCRatio (or Median-FC), a small number is added for each transcript in each condition to avoid Inf and NA. Default is 0.01.                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                   |

## Details

GetDEResults() function takes output from EBTest() function and output a list of DE transcripts under a target FDR. It also provides posterior probability estimates for each transcript.

## Value

|         |                                                                                                                                                                                                                                        |
|---------|----------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| DEfound | A list of DE transcripts.                                                                                                                                                                                                              |
| PPMat   | Posterior probability matrix. Transcripts are following the same order as in the input matrix. Transcripts that were filtered by magnitude (in EBTest function), FC, or FCR are assigned with NA for both PPDE and PPEE.               |
| Status  | Each transcript will be assigned with one of the following values: "DE", "EE", "Filtered: Low Expression", "Filtered: Fold Change" and "Filtered: Fold Change Ratio". Transcripts are following the same order as in the input matrix. |

## Author(s)

Ning Leng, Yuan Li

## References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical

Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

See Also

EBTest

Examples

```
data(GeneMat)
str(GeneMat)
GeneMat.small = GeneMat[c(1:10,511:550),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1","C2"), each = 5)),
  sizeFactors = Sizes, maxround = 5)
Out = GetDEResults(EBOut)
```

---

|            |                                                           |
|------------|-----------------------------------------------------------|
| GetMultiFC | <i>Calculate the Fold Changes for Multiple Conditions</i> |
|------------|-----------------------------------------------------------|

---

Description

'GetMultiFC' calculates the Fold Changes for each pair of conditions in a multiple condition study.

Usage

```
GetMultiFC(EBMultiOut, SmallNum = 0.01)
```

Arguments

|            |                                                                                                          |
|------------|----------------------------------------------------------------------------------------------------------|
| EBMultiOut | The output of EBMultiTest function.                                                                      |
| SmallNum   | A small number will be added for each transcript in each condition to avoid Inf and NA. Default is 0.01. |

Details

Provide the FC (adjusted by the normalization factors) for each pair of comparisons. A small number will be added for each transcript in each condition to avoid Inf and NA. Default is set to be 0.01.

Value

|                |                                                                                            |
|----------------|--------------------------------------------------------------------------------------------|
| FCMat          | The FC of each pair of comparison (adjusted by the normalization factors).                 |
| Log2FCMat      | The log 2 FC of each pair of comparison (adjusted by the normalization factors).           |
| PostFCMat      | The posterior FC of each pair of comparison.                                               |
| Log2PostFCMat  | The log 2 posterior FC of each pair of comparison.                                         |
| CondMean       | The mean of each transcript within each condition (adjusted by the normalization factors). |
| ConditionOrder | The condition assignment for C1Mean, C2Mean, etc.                                          |

**Author(s)**

Ning Leng

## References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. *Bioinformatics* (2013)

## See Also

EBMultiTest, PostFC

## Examples

```
data(MultiGeneMat)
MultiGeneMat.small = MultiGeneMat[201:210,]

Conditions = c("C1", "C1", "C2", "C2", "C3", "C3")

PosParti = GetPatterns(Conditions)
Parti = PosParti[-3,]

MultiSize = MedianNorm(MultiGeneMat.small)

MultiOut = EBMultiTest(MultiGeneMat.small,
  NgVector=NULL, Conditions=Conditions,
  AllParti=Parti, sizeFactors=MultiSize,
  maxround=5)

MultiFC = GetMultiFC(MultiOut)
```

| GetMultiPP | Posterior Probability of Each Transcript |
|------------|------------------------------------------|
|------------|------------------------------------------|

### Description

'GetMultiPP' generates the Posterior Probability of being each pattern of each transcript based on the EBMultiTest output.

## Usage

GetMultiPP(EBout)

## Arguments

|       |                                     |
|-------|-------------------------------------|
| EBout | The output of EBMultiTest function. |
|-------|-------------------------------------|

Value

|          |                                                 |
|----------|-------------------------------------------------|
| PP       | The poster probabilities of being each pattern. |
| MAP      | Gives the most likely pattern.                  |
| Patterns | The Patterns.                                   |

Author(s)

Ning Leng

References

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

See Also

GetPPMat

Examples

```
data(MultiGeneMat)
MultiGeneMat.small = MultiGeneMat[201:210,]

Conditions = c("C1","C1","C2","C2","C3","C3")
PosParti = GetPatterns(Conditions)
Parti = PosParti[-3,]
MultiSize = MedianNorm(MultiGeneMat.small)

MultiOut = EBMultiTest(MultiGeneMat.small,
  NgVector=NULL, Conditions=Conditions,
  AllParti=Parti, sizeFactors=MultiSize,
  maxround=5)
MultiPP = GetMultiPP(MultiOut)
```

---

|       |                  |
|-------|------------------|
| GetNg | <i>Ng Vector</i> |
|-------|------------------|

---

Description

'GetNg' generates the Ng vector for the isoform level data. (While using the number of isoform in the host gene to define the uncertainty groups.)

Usage

```
GetNg(IsoformName, GeneName, TrunThre = 3)
```

**Arguments**

|             |                                                                               |
|-------------|-------------------------------------------------------------------------------|
| IsoformName | A vector contains the isoform names.                                          |
| GeneName    | The gene names of the isoforms in IsoformNames (Should be in the same order). |
| TrunThre    | The number of uncertainty groups the user wish to define. The default is 3.   |

**Value**

|               |                                                                                              |
|---------------|----------------------------------------------------------------------------------------------|
| GeneNg        | The number of isoforms that are contained in each gene.                                      |
| GeneNgTrun    | The truncated Ng of each gene. (The genes contain more than 3 isoforms are with Ng 3.)       |
| IsoformNg     | The Ng of each isoform.                                                                      |
| IsoformNgTrun | The truncated Ng of each isoform (could be used to define the uncertainty group assignment). |

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
data(IsoList)

IsoMat = IsoList$IsoMat
IsoNames = IsoList$IsoNames
IsosGeneNames = IsoList$IsosGeneNames
IsoSizes = MedianNorm(IsoMat)
NgList = GetNg(IsoNames, IsosGeneNames)

#IsoNgTrun = NgList$IsoformNgTrun
#IsoEBOut = EBTest(Data = IsoMat, NgVector = IsoNgTrun,
# Conditions = as.factor(rep(c("C1", "C2"), each=5)),
# sizeFactors = IsoSizes, maxround = 5)
```

---

|                  |                                               |
|------------------|-----------------------------------------------|
| GetNormalizedMat | <i>Calculate normalized expression matrix</i> |
|------------------|-----------------------------------------------|

---

**Description**

'GetNormalizedMat' calculates the normalized expression matrix. (Note: this matrix is only used for visualization etc. EBTes and EBMultiTest request \*un-adjusted\* expressions and normalization factors.)

**Usage**

```
GetNormalizedMat(Data, Sizes)
```

**Arguments**

|       |                                                                |
|-------|----------------------------------------------------------------|
| Data  | The data matrix with transcripts in rows and lanes in columns. |
| Sizes | A vector contains the normalization factor for each lane.      |

**Value**

The function will return a normalized matrix.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
data(GeneMat)
str(GeneMat)
Sizes = MedianNorm(GeneMat)
NormData = GetNormalizedMat(GeneMat, Sizes)
```

---

**GetPatterns***Generate all possible patterns in a multiple condition study*

---

**Description**

'GetPatterns' generates all possible patterns in a multiple condition study.

**Usage**

```
GetPatterns(Conditions)
```

**Arguments**

Conditions      The names of the Conditions in the study.

**Value**

A matrix describe all possible patterns.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
Conditions = c("C1","C1","C2","C2","C3","C3")
PosParti = GetPatterns(Conditions)
```

---

**GetPPMat***Posterior Probability of Transcripts*

---

**Description**

'GetPPMat' generates the Posterior Probability of being each pattern of each transcript based on the EBTest output.

**Usage**

```
GetPPMat(EBout)
```

**Arguments**

EBout                      The output of EBTest function.

**Value**

The poster probabilities of being EE (first column) and DE (second column).

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
data(GeneMat)
GeneMat.small = GeneMat[c(500:550),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1", "C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
PP = GetPPMat(EBOut)
str(PP)
head(PP)
```

---

|                     |                                                            |
|---------------------|------------------------------------------------------------|
| GetSelectedPatterns | <i>Get selected patterns in a multiple condition study</i> |
|---------------------|------------------------------------------------------------|

---

**Description**

'GetSelectedPatterns' get selected patterns in a multiple condition study.

**Usage**

```
GetSelectedPatterns(EBout)
```

**Arguments**

EBout                      Results from EBMultiTest

**Value**

A matrix describe selected patterns.

**Author(s)**

Ning Leng, Xiuyu Ma

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. *Bioinformatics* (2013)

**Examples**

```
data(MultiGeneMat)
Conditions=c("C1","C1","C2","C2","C3","C3")
MultiSize=MedianNorm(MultiGeneMat)
MultiOut=EBMultiTest(MultiGeneMat,Conditions=Conditions,
  sizeFactors=MultiSize)
PosParti=GetSelectedPatterns(MultiOut)
```

---

IsoList

*The simulated data for two condition isoform DE analysis*

---

**Description**

'IsoList' gives the simulated data for two condition isoform DE analysis.

**Usage**

```
data(IsoList)
```

**Source**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. *Bioinformatics* (2013)

**See Also**

GeteMat

**Examples**

```
data(IsoList)
```

---

**IsoMultiList***The simulated data for multiple condition isoform DE analysis*

---

**Description**

'IsoMultiList' gives a set of simulated data for multiple condition isoform DE analysis.

**Usage**

```
data(IsoMultiList)
```

**Source**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

IsoList

**Examples**

```
data(IsoMultiList)
```

---

**Likefun***Likelihood Function of the NB-Beta Model*

---

**Description**

'Likefun' specifies the Likelihood Function of the NB-Beta Model.

**Usage**

```
Likefun(ParamPool, InputPool)
```

**Arguments**

ParamPool      The parameters that will be estimated in EM.

InputPool      The control parameters that will not be estimated in EM.

**Value**

The function will return the log-likelihood.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
#x1 = c(.6,.7,.3)
#Input = matrix(rnorm(100,100,1), ncol=10)
#RIn = matrix(rnorm(100,200,1), ncol=10)
#InputPool = list(Input[,1:5], Input[,6:10], Input,
# rep(.1,100), 1, RIn, RIn[,1:5], RIn[,6:10], 100)
#Likefun(x1, InputPool)
```

---

LikefunMulti

*Likelihood Function of the NB-Beta Model In Multiple Condition Test*


---

**Description**

'LikefunMulti' specifies the Likelihood Function of the NB-Beta Model In Multiple Condition Test.

**Usage**

```
LikefunMulti(ParamPool, InputPool)
```

**Arguments**

|           |                                                          |
|-----------|----------------------------------------------------------|
| ParamPool | The parameters that will be estimated in EM.             |
| InputPool | The control parameters that will not be estimated in EM. |

**Value**

The function will return the log-likelihood.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendziorski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

```
#x1 = c(.6, .7, .3)
#Input = matrix(rnorm(100,100,1),ncol=10)
#RIn = matrix(rnorm(100,200,1),ncol=10)
#InputPool = list(list(Input[,1:5],Input[,6:10]),
# Input, cbind(rep(.1, 10), rep(.9,10)), 1,
# RIn, list(RIn[,1:5],RIn[,6:10]),
# 10, rbind(c(1,1),c(1,2)))
#LikelihoodMulti(x1, InputPool)
```

---

|      |                                                                            |
|------|----------------------------------------------------------------------------|
| LogN | <i>The function to run EM (one round) algorithm for the NB-beta model.</i> |
|------|----------------------------------------------------------------------------|

'LogN' specifies the function to run (one round of) the EM algorithm for the NB-beta model.

```
LogN(Input, InputSP, EmpiricalR, EmpiricalRSP, NumOfEachGroup,
      AlphaIn, BetaIn, PIn, NoneZeroLength)
```

|                                                |                                        |
|------------------------------------------------|----------------------------------------|
| Input, InputSP                                 | The expressions among all the samples. |
| NumOfEachGroup                                 | Number of genes in each Ng group.      |
| AlphaIn, PIn, BetaIn, EmpiricalR, EmpiricalRSP | The parameters from the last EM step.  |
| NoneZeroLength                                 | Number of Ng groups.                   |

## Ning Leng

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. *Bioinformatics* (2013)

**Examples**

```
#Input = matrix(rnorm(100,100,1), ncol=10)
#rownames(Input) = paste("g",1:10)
#RIn = matrix(rnorm(100,200,1), ncol=10)
#res = LogN(Input, list(Input[,1:5], Input[,6:10]),
# RIn, list(RIn[,1:5], RIn[,6:10]),
# 10, .6, .7, .3, 1)
```

LogNMulti

*EM algorithm for the NB-beta model in the multiple condition test***Description**

'LogNMulti' specifies the function to run (one round of) the EM algorithm for the NB-beta model in the multiple condition test.

**Usage**

```
LogNMulti(Input, InputSP, EmpiricalR, EmpiricalRSP,
  NumOfEachGroup, AlphaIn, BetaIn, PIn,
  NoneZeroLength, AllParti, Conditions)
```

**Arguments**

Input, InputSP    The expressions among all the samples.

NumOfEachGroup    Number of genes in each Ng group.

AlphaIn, PIn, BetaIn, EmpiricalR, EmpiricalRSP  
                    The parameters from the last EM step.

NoneZeroLength    Number of Ng groups.

AllParti            The patterns of interests.

Conditions         The condition assignment for each sample.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

## Examples

```
#
#Input = matrix(rnorm(100,100,1),ncol=10)
#rownames(Input) = paste("g",1:10)
#RIn = matrix(rnorm(100,200,1), ncol=10)
#res = LogNMulti(Input, list(Input[,1:5], Input[,6:10]),
# RIn, list(RIn[,1:5], RIn[,6:10]), 10, .6, .7,
# c(.3,.7), 1, rbind(c(1,1), c(1,2)),
# as.factor(rep(c("C1","C2"), each=5)))
```

---

MedianNorm

---

*Median Normalization*


---

## Description

'MedianNorm' specifies the median-by-ratio normalization function from Anders et. al., 2010.

## Usage

```
MedianNorm(Data, alternative = FALSE)
```

## Arguments

|             |                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                             |
|-------------|-------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------------|
| Data        | The data matrix with transcripts in rows and lanes in columns.                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                              |
| alternative | <p>if alternative = TRUE, the alternative version of median normalization will be applied. The alternative method is similar to median-by-ratio normalization, but can deal with the cases when all of the genes/isoforms have at least one zero counts (in which case the median-by-ratio normalization will fail).</p> <p>In more details, in median-by-ratio normalization (denote <math>l_1</math> as libsize for sample 1 as an example, assume total S samples):</p> $\text{hat}l_1 = \text{median}_g [ X_{g1} / (X_{g1} * X_{g2} * \dots * X_{gS})^{-S} ] \quad (1)$ <p>which estimates <math>l_1 / (l_1 * l_2 * \dots * l_S)^{-S}</math>. Since we have the constrain that <math>(l_1 * l_2 * \dots * l_S) = 1</math>, equation (1) estimates <math>l_1</math>. Note (1) could also be written as:</p> $\text{hat}l_1 = \text{median}_g [ (X_{g1}/X_{g1} * X_{g1}/X_{g2} * \dots * X_{g1}/X_{gS})^{-S} ]$ <p>In the alternative method, we estimate <math>l_1/l_1, l_1/l_2, \dots, l_1/l_S</math> individually by taking <math>\text{median}_g(X_{g1}/X_{g1}), \text{median}_g(X_{g1}/X_{g2}) \dots</math> Then estimate <math>l_1 = l_1 / (l_1 * l_2 * \dots * l_S)^{-S}</math> by taking the geomean of these estimates:</p> $\text{hat}l_1 = [ \text{median}_g(X_{g1}/X_{g1}) * \text{median}_g(X_{g1}/X_{g2}) * \text{median}_g(X_{g1}/X_{g3}) * \dots * \text{median}_g(X_{g1}/X_{gS}) ]^{-S}$ |

## Value

The function will return a vector contains the normalization factor for each lane.

**Author(s)**

Ning Leng

**References**

Simon Anders and Wolfgang Huber. Differential expression analysis for sequence count data. Genome Biology (2010) 11:R106 (open access)

**See Also**

QuantileNorm

**Examples**

```
data(GeneMat)
Sizes = MedianNorm(GeneMat)
#EBOut = EBTest(Data = GeneMat,
# Conditions = as.factor(rep(c("C1","C2"), each=5)),
# sizeFactors = Sizes, maxround = 5)
```

---

MultiGeneMat

*The simulated data for multiple condition gene DE analysis*

---

**Description**

'MultiGeneMat' generates a set of the simulated data for multiple condition gene DE analysis.

**Usage**

```
data(MultiGeneMat)
```

**Source**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

GeneMat

**Examples**

```
data(MultiGeneMat)
```

---

|             |                               |
|-------------|-------------------------------|
| PlotPattern | <i>Visualize the patterns</i> |
|-------------|-------------------------------|

---

**Description**

'PlotPattern' generates the visualized patterns before the multiple condition test.

**Usage**

```
PlotPattern(Patterns)
```

**Arguments**

Patterns            The output of GetPatterns function.

**Value**

A heatmap to visualize the patterns of interest.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
Conditions = c("C1", "C1", "C2", "C2", "C3", "C3")
Patterns = GetPatterns(Conditions)
PlotPattern(Patterns)
```

---

|                 |                                |
|-----------------|--------------------------------|
| PlotPostVsRawFC | <i>Plot Posterior FC vs FC</i> |
|-----------------|--------------------------------|

---

**Description**

'PlotPostVsRawFC' helps the users visualize the posterior FC vs FC in a two condition study.

**Usage**

```
PlotPostVsRawFC(EBOut, FCOut)
```

**Arguments**

|       |                                     |
|-------|-------------------------------------|
| EBOut | The output of EBMultiTest function. |
| FCOut | The output of PostFC function.      |

**Value**

A figure shows fold change vs posterior fold change.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

PostFC

**Examples**

```
data(GeneMat)
GeneMat.small = GeneMat[c(500:600),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1","C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
FC = PostFC(EBOut)
PlotPostVsRawFC(EBOut,FC)
```

---

PolyFitPlot

*Fit the mean-var relationship using polynomial regression*

---

**Description**

'PolyFitPlot' fits the mean-var relationship using polynomial regression.

**Usage**

```
PolyFitPlot(X, Y, nterms, xname = "Estimated Mean",
  yname = "Estimated Var", pdfname = "",
  xlim = c(-1,5), ylim = c(-1,7), ChangeXY = F,
  col = "red")
```

**Arguments**

|          |                                                                                                                                                               |
|----------|---------------------------------------------------------------------------------------------------------------------------------------------------------------|
| X        | The first group of values want to be fitted by the polynomial regression (e.g Mean of the data).                                                              |
| Y        | The second group of values want to be fitted by the polynomial regression (e.g. variance of the data). The length of Y should be the same as the length of X. |
| nterms   | How many polynomial terms want to be used.                                                                                                                    |
| xname    | Name of the x axis.                                                                                                                                           |
| yname    | Name of the y axis.                                                                                                                                           |
| pdfname  | Name of the plot.                                                                                                                                             |
| xlim     | The x limits of the plot.                                                                                                                                     |
| ylim     | The y limits of the plot.                                                                                                                                     |
| ChangeXY | If ChangeXY is setted to be TRUE, X will be treated as the dependent variable and Y will be treated as the independent one. Default is FALSE.                 |
| col      | Color of the fitted line.                                                                                                                                     |

**Value**

The PolyFitPlot function provides a smooth scatter plot of two variables and their best fitting line of polynomial regression.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**Examples**

```
data(IsoList)
str(IsoList)
IsoMat = IsoList$IsoMat
IsoNames = IsoList$IsoNames
IsosGeneNames = IsoList$IsosGeneNames
IsoSizes = MedianNorm(IsoMat)
NgList = GetNg(IsoNames, IsosGeneNames)

IsoNgTrun = NgList$IsoformNgTrun
#IsoEBOut = EBTest(Data = IsoMat.small,
# NgVector = IsoNgTrun,
# Conditions = as.factor(rep(c("C1","C2"), each=5)),
# sizeFactors = IsoSizes, maxround = 5)

#par(mfrow=c(2,2))
```

```

#PolyFitValue = vector("list",3)

#for(i in 1:3)
# PolyFitValue[[i]] = PolyFitPlot(IsoEBOut$C1Mean[[i]],
# IsoEBOut$C1EstVar[[i]], 5)

#PolyAll = PolyFitPlot(unlist(IsoEBOut$C1Mean),
# unlist(IsoEBOut$C1EstVar), 5)

#lines(log10(IsoEBOut$C1Mean[[1]][PolyFitValue[[1]]$sort]),
# PolyFitValue[[1]]$fit[PolyFitValue[[1]]$sort],
# col="yellow", lwd=2)
#lines(log10(IsoEBOut$C1Mean[[2]][PolyFitValue[[2]]$sort]),
# PolyFitValue[[2]]$fit[PolyFitValue[[2]]$sort],
# col="pink", lwd=2)
#lines(log10(IsoEBOut$C1Mean[[3]][PolyFitValue[[3]]$sort]),
# PolyFitValue[[3]]$fit[PolyFitValue[[3]]$sort],
# col="green", lwd=2)

#legend("topleft",c("All Isoforms","Ng = 1","Ng = 2","Ng = 3"),
# col = c("red","yellow","pink","green"),
# lty=1, lwd=3, box.lwd=2)

```

---

PostFC

---

*Calculate the posterior fold change for each transcript across conditions*


---

## Description

‘PostFC’ calculates the posterior fold change for each transcript across conditions.

## Usage

```
PostFC(EBoutput, SmallNum = 0.01)
```

## Arguments

|          |                                                                                                          |
|----------|----------------------------------------------------------------------------------------------------------|
| EBoutput | The ourput from function EBTest.                                                                         |
| SmallNum | A small number will be added for each transcript in each condition to avoid Inf and NA. Default is 0.01. |

## Value

Provide both FC and posterior FC across two conditions. FC is calculated as  $(\text{MeanC1} + \text{SmallNum}) / (\text{MeanC2} + \text{SmallNum})$ . And Posterior FC is calculated as:

# Post alpha  $P_{a\_C1} = \alpha + r_{C1} * n_{C1}$

# Post beta  $P_{b\_C1} = \beta + \text{Mean}_{C1} * n_{C1}$

```
# P_q_C1 = P_a_C1 / (P_a_C1 + P_b_C1)
# Post FC = ((1-P_q_C1)/P_q_c1) / ((1-P_q_c2)/P_q_c2)
```

|           |                                                                       |
|-----------|-----------------------------------------------------------------------|
| PostFC    | The posterior FC across two conditions.                               |
| RealFC    | The FC across two conditions (adjusted by the normalization factors). |
| Direction | The direction of FC calculation.                                      |

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

EBTest, GetMultiFC

**Examples**

```
data(GeneMat)
GeneMat.small = GeneMat[c(500:550),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1", "C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
FC=PostFC(EBOut)
```

---

|     |                                                                                                                |
|-----|----------------------------------------------------------------------------------------------------------------|
| QQP | <i>The Quantile-Quantile Plot to compare the empirical q's and simulated q's from fitted beta distribution</i> |
|-----|----------------------------------------------------------------------------------------------------------------|

---

**Description**

'QQP' gives the Quantile-Quantile Plot to compare the empirical q's and simulated q's from fitted beta distribution.

**Usage**

```
QQP(EBOut, GeneLevel = F)
```

**Arguments**

|           |                                                           |
|-----------|-----------------------------------------------------------|
| EBOut     | The output of EBTest or EBMultiTest.                      |
| GeneLevel | Indicate whether the results are from data at gene level. |

**Value**

For data with  $n_1$  conditions and  $n_2$  uncertainty groups,  $n_1 \times n_2$  plots will be generated. Each plot represents a subset of the data.

**Author(s)**

Ning Leng

**References**

Ning Leng, John A. Dawson, James A. Thomson, Victor Ruotti, Anna I. Rissman, Bart M.G. Smits, Jill D. Haag, Michael N. Gould, Ron M. Stewart, and Christina Kendzierski. EBSeq: An empirical Bayes hierarchical model for inference in RNA-seq experiments. Bioinformatics (2013)

**See Also**

EBTest, EBMultiTest, DenNHist

**Examples**

```
data(GeneMat)
GeneMat.small = GeneMat[c(500:1000),]
Sizes = MedianNorm(GeneMat.small)
EBOut = EBTest(Data = GeneMat.small,
  Conditions = as.factor(rep(c("C1", "C2"), each=5)),
  sizeFactors = Sizes, maxround = 5)
par(mfrow=c(2,2))
QQP(EBOut)
```

---

QuantileNorm

*Quantile Normalization*


---

**Description**

'QuantileNorm' gives the quantile normalization.

**Usage**

```
QuantileNorm(Data, Quantile)
```

**Arguments**

|          |                                                                          |
|----------|--------------------------------------------------------------------------|
| Data     | The data matrix with transcripts in rows and lanes in columns.           |
| Quantile | The quantile the user wishes to use. Should be a number between 0 and 1. |

**Details**

Use a quantile point to normalize the data.

**Value**

The function will return a vector contains the normalization factor for each lane.

**Author(s)**

Ning Leng

**References**

Bullard, James H., et al. Evaluation of statistical methods for normalization and differential expression in mRNA-Seq experiments. BMC bioinformatics 11.1 (2010): 94.

**See Also**

MedianNorm

**Examples**

```
data(GeneMat)
Sizes = QuantileNorm(GeneMat,.75)
#EBOut = EBTest(Data = GeneMat,
# Conditions = as.factor(rep(c("C1","C2"), each=5)),
# sizeFactors = Sizes, maxround = 5)
```

---

RankNorm

*Rank Normalization*

---

**Description**

'RankNorm' gives the rank normalization.

**Usage**

```
RankNorm(Data)
```

**Arguments**

Data                      The data matrix with transcripts in rows and lanes in columns.

**Value**

The function will return a matrix contains the normalization factor for each lane and each transcript.

**Author(s)**

Ning Leng

**See Also**

MedianNorm, QuantileNorm

**Examples**

```
data(GeneMat)
Sizes = RankNorm(GeneMat)
# Run EBSeq
# EBres = EBTest(Data = GeneData, NgVector = rep(1,10^4),
# Vect5End = rep(1,10^4), Vect3End = rep(1,10^4),
# Conditions = as.factor(rep(c(1,2), each=5)),
# sizeFactors = Sizes, maxround=5)
```

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