

# Package ‘OVESEG’

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**Type** Package

**Title** OVESEG-test to detect tissue/cell-specific markers

**Version** 1.20.0

**Author** Lulu Chen <luluchen@vt.edu>

**Maintainer** Lulu Chen <luluchen@vt.edu>

**biocViews** Software, MultipleComparison, CellBiology, GeneExpression

**Description** An R package for multiple-group comparison to detect tissue/cell-specific marker genes among subtypes. It provides functions to compute OVESEG-test statistics, derive component weights in the mixture null distribution model and estimate p-values from weightedly aggregated permutations. Obtained posterior probabilities of component null hypotheses can also portrait all kinds of upregulation patterns among subtypes.

**License** GPL-2

**Encoding** UTF-8

**Depends** R (>= 3.6)

**Suggests** knitr, rmarkdown, BiocStyle, testthat, ggplot2, gridExtra, grid, reshape2, scales

**VignetteBuilder** knitr

**Imports** stats, utils, methods, BiocParallel, SummarizedExperiment, limma, fdrtool, Rcpp

**BugReports** <https://github.com/Lululuella/OVESEG>

**RoxygenNote** 6.1.1

**LinkingTo** Rcpp

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OVESEG-package	<i>OVESEG: A package for marker gene test.</i>
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## Description

Function `OVESEGtest` performs OVESEG-test for expression profiles from multiple groups to detect subtype-specific marker genes. While it may take a long time to execute permutations for p-value estimation, users can apply `OVESEGtstat` to obtain OVESEG-test statistics to rank genes and apply `postProbNull` to obtain each gene's posterior probabilities of component null hypotheses. `nullDistri` estimates probabilities of any one group being upregulated under null hypotheses. `patternDistri` estimates probabilities of all kinds of upregulation patterns among groups.

## References

Chen, L., Herrington, D., Clarke, R., Yu, G., and Wang, Y. (2019). "Data-Driven Robust Detection of Tissue/Cell-Specific Markers." bioRxiv. <https://doi.org/10.1101/517961>.

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`countBT`*RNAseq count data downsampled from GSE60424*

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**Description**

Three cell subtypes (B cells, CD4+ T cells, CD8+ T cells) were purified from 20 fresh blood samples. RNA was extracted from each of these cell subsets and processed into RNA sequencing libraries (Illumina TruSeq). Sequencing libraries were analyzed on an Illumina HiScan, with a target read depth of ~20M reads. Reads were demultiplexed, mapped to human gene models (ENSEMBL), and tabulated using HTSeq. We downsample the original data to 10000 genes. Subtype labels for purified populations are also included. (Data generation script can be found in ./data\_raw folder.)

**Usage**

```
data(countBT)
```

**Format**

A list with one count mixture (count) and a categorical vector giving subtypes (group).

**References**

Linsley et al. PLoS One 2014;9(10):e109760. PMID: 25314013

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`nullDistri`*Probability of one group being upregulated under null*

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**Description**

This function estimates probabilities of any one group being upregulated than other groups under null hypotheses.

**Usage**

```
nullDistri(ppnull)
```

**Arguments**

`ppnull` a list returned by `postProbNull` or `OVESEGtest`.

**Details**

The probability of one group being upregulated under null hypotheses is calculated by accumulating and normalizing genewise posterior probability of null hypotheses. The group with higher probability tends to get more False Positive MGs.

**Value**

a numeric vector indicating probabilities of each group being upregulated than others under null hypotheses.

**Examples**

```
data(RocheBT)
ppnull <- postProbNull(RocheBT$y, RocheBT$group, alpha='moderated')
pk <- nullDistri(ppnull)
```

---

 OVESEGtest

*OVESEG-test*


---

**Description**

This function performs OVESEG-test to assess significance of molecular markers.

**Usage**

```
OVESEGtest(y, group, weights = NULL, alpha = "moderated",
  NumPerm = 999, seed = 111, detail.return = TRUE,
  BPPARAM = bpparam())
```

**Arguments**

<code>y</code>	a numeric matrix containing log-expression or logCPM (log <sub>2</sub> -counts per million) values. Data frame or SummarizedExperiment object will be internally coerced into a matrix. Rows correspond to probes and columns to samples. Missing values are not permitted.
<code>group</code>	categorical vector or factor giving group membership of columns of <code>y</code> . At least two categories need to be presented.
<code>weights</code>	optional numeric matrix containing prior weights for each spot.
<code>alpha</code>	parameter specifying within-group variance estimator to be used. 'moderated': empirical Bayes moderated variance estimator as used in <a href="#">eBayes</a> . Numeric value: a constant value added to pooled variance estimator ( $\alpha + \sigma$ ). NULL: no estimator; all variances are set to be 1.
<code>NumPerm</code>	an integer specifying the number of permutation resamplings (default 999).
<code>seed</code>	an integer seed for the random number generator.
<code>detail.return</code>	a logical indicating whether more details about posterior probability estimation will be returned.
<code>BPPARAM</code>	a BiocParallelParam object indicating whether parallelization should be used for permutation resamplings. The default is <code>bpparam()</code> .

**Details**

OVESEG-test is a statistically-principled method that can detect tissue/cell-specific marker genes among many subtypes. OVESEG-test statistics are designed to mathematically match the definition of molecular markers, and a novel permutation scheme are employed to estimate the corresponding distribution under null hypotheses where the expression patterns of non-markers can be highly complex.

**Value**

a list containing the following components:

<code>pv.overall</code>	a vector of p-values calculated by all permutations regardless of upregulated subtypes.
<code>pv.oneside</code>	a vector of subtype-specific p-values calculated specifically for the upregulated subtype of each probe.
<code>pv.oneside.max</code>	subtype-specific p-values when observed test statistic equal to zero.
<code>pv.multiside</code>	<code>pv.oneside*K</code> (K-time comparison correction) and truncated at 1.
<code>W</code>	a matrix of posterior probabilities for each component null hypothesis given an observed probe. Rows correspond to probes and columns to one hypothesis.
<code>label</code>	a vector of group labels.
<code>groupOrder</code>	a matrix with each row being group indexes ordered based on decreasing expression levels. Group indexes are positions in <code>label</code> .
<code>F.p.value</code>	a matrix with each column giving p-values corresponding to F-statistics on certain groups.
<code>lfdr</code>	a matrix with each column being local false discovery rates estimated based on one column of weighted <code>F.p.value</code> matrix.
<code>fit</code>	a <code>MArrayLM</code> fitted model object produced by <code>lmFit</code> .

`F.p.value`, `lfdr` and `fit` are returned only when `detail.return` is `TRUE`.

**Examples**

```
data(RocheBT)
rttest <- OVESEGtest(RocheBT$y, RocheBT$group, NumPerm=99,
                    BPPARAM=BiocParallel::SerialParam())
## Not run:
#parallel computing
rttest <- OVESEGtest(RocheBT$y, RocheBT$group, NumPerm=99,
                    BPPARAM=BiocParallel::SnowParam())

## End(Not run)
```

---

 OVESEGtstat

*OVESEG-test statistics*


---

### Description

This function computes OVESEG-test statistics.

### Usage

```
OVESEGtstat(y, group, weights = NULL, alpha = "moderated",
  order.return = FALSE, lmfit.return = FALSE)
```

### Arguments

<code>y</code>	a numeric matrix containing log-expression or logCPM (log2-counts per million) values. Data frame or SummarizedExperiment object will be internally coerced into a matrix. Rows correspond to probes and columns to samples. Missing values are not permitted.
<code>group</code>	categorical vector or factor giving group membership of columns of <code>y</code> . At least two categories need to be presented.
<code>weights</code>	optional numeric matrix containing prior weights for each spot.
<code>alpha</code>	parameter specifying within-group variance estimator to be used. 'moderated': empirical Bayes moderated variance estimator as used in <a href="#">eBayes</a> . Numeric value: a constant value added to pooled variance estimator ( $\alpha + \sigma$ ). NULL: no estimator; all variances are set to be 1.
<code>order.return</code>	a logical indicating whether the order of groups will be returned. If FALSE, only the highest expressed group index is return for each probe.
<code>lmfit.return</code>	a logical indicating whether a <code>MArrayLM</code> fitted model object produced by <code>lmFit</code> should be returned.

### Details

OVESEG-test statistics are designed to mathematically match the definition of molecular markers:

$$\max_{k=1, \dots, K} \left\{ \min_{l \neq k} \left\{ \frac{\mu_k(j) - \mu_l(j)}{\sigma(j) \sqrt{\frac{1}{N_k} + \frac{1}{N_l}}} \right\} \right\}$$

where  $j$  is probe index,  $K$  is the number of groups, and  $\mu_k$  is the mean expression of group  $k$ .

### Value

a list containing the following components:

<code>tstat</code>	a vector of OVESEG-test statistics for probes.
<code>label</code>	a vector of group labels.

groupOrder	If <code>order.return</code> is TRUE, a matrix with each row being group indexes ordered based on decreasing expression levels. If <code>order.return</code> is FALSE, a vector with each element being a probe's highest expressed group index. Group indexes are positions in <code>label</code> .
fit	a <code>MArrayLM</code> fitted model object produced by <code>lmFit</code> . Returned only when <code>lmFit.return</code> is TRUE.

## Examples

```
data(RocheBT)
rtstat <- OVESEGtstat(RocheBT$y, RocheBT$group, alpha='moderated')
rtstat <- OVESEGtstat(RocheBT$y, RocheBT$group, alpha=0.1)
```

---

OVEtstatPermTopM      *OVESEG-test statistics after permuting top M groups*

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## Description

This function permutes group labels among highest expressed M groups and then computes new OVESEG-test statistics.

## Usage

```
OVEtstatPermTopM(y, group, groupOrder, M, weights = NULL,
  alpha = "moderated", NumPerm = 999, seed = 111,
  BPPARAM = bpparam())
```

## Arguments

y	a numeric matrix containing log-expression or logCPM (log <sub>2</sub> -counts per million) values. Data frame or SummarizedExperiment object will be internally coerced into a matrix. Rows correspond to probes and columns to samples. Missing values are not permitted.
group	categorical vector or factor giving group membership of columns of y. At least two categories need to be presented.
groupOrder	an integer matrix with each row giving group indexes ordered based on decreasing expression levels.
M	an integer indicating the number of groups being permuted. The range is $[2, K]$ , where K is the total number of groups.
weights	optional numeric matrix containing prior weights for each spot.
alpha	parameter specifying within-group variance estimator to be used. 'moderated': empirical Bayes moderated variance estimator as used in <a href="#">eBayes</a> . Numeric value: a constant value added to pooled variance estimator ( $\alpha + \sigma$ ). NULL: no estimator; all variances are set to be 1.
NumPerm	an integer specifying the number of permutation resamplings (default 999).
seed	an integer seed for the random number generator.
BPPARAM	a <code>BiocParallelParam</code> object indicating whether parallelization should be used for permutation resamplings. The default is <code>bpparam()</code> .

**Details**

Top M expressed groups will be involved in permutation. There are  $C_K^M$  probe patterns in which probes are highly expressed in certain M groups among the total K groups. Probes of the same pattern share the same shuffled labels.

To improve the time efficiency, some functions within permutation loops are implemented using c++.

**Value**

a list containing the following components:

tstat.perm	a numeric matrix with each column giving OVESEG-test statistics over the expressions after one permutation.
topidx.perm	a integer matrix with each column giving the highest expressed group index over the expressions after one permutation.

**Examples**

```
data(RocheBT)
ppnull <- postProbNull(RocheBT$y, RocheBT$group, detail.return = TRUE)
rperm <- OVEtstatPermTopM(RocheBT$y, RocheBT$group, ppnull$groupOrder, M=2,
                          NumPerm=99, BPPARAM=BiocParallel::SerialParam())

## Not run:
#parallel computing
rperm <- OVEtstatPermTopM(RocheBT$y, RocheBT$group, ppnull$groupOrder, M=2,
                          NumPerm=99, BPPARAM=BiocParallel::SnowParam())

## End(Not run)
```

---

pairwise\_tstat\_unscaled  
*pairwise t-statistics (unscaled)*

---

**Description**

pairwise t-statistics (unscaled)

**Usage**

```
pairwise_tstat_unscaled(ymean, stdevUnscaled)
```

**Arguments**

ymean	a numeric matrix containing group means.
stdevUnscaled	a numeric matrix containing unscaled standard deviations of the group means.

**Value**

unscaled pairwise t-statistics



---

patternDistri	<i>Probabilities of all upregulation patterns</i>
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---

**Description**

This function estimates probabilities of all kinds of upregulation patterns among subtypes.

**Usage**

```
patternDistri(ppnull)
```

**Arguments**

ppnull            a list returned by [postProbNull](#) or [OVESEGtest](#).

**Details**

The probability of each upregulation pattern is calculated by accumulating and normalizing gene-wise posterior probability of null hypotheses and of alternative hypotheses.

**Value**

a data frame object containing all possible upregulation patterns and corresponding probabilities.

**Examples**

```
data(RocheBT)
ppnull <- postProbNull(RocheBT$y, RocheBT$group, alpha='moderated')
pd<- patternDistri(ppnull)
```

---

permfunc	<i>Internal function for one permutation task</i>
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---

**Description**

Internal function for one permutation task

**Usage**

```
permfunc(p, y, group, weights, alpha, combM, geneSubset, seeds)
```

**Arguments**

p	an integer indicating permutation index
y	an expressions matrix
group	a integer vector indicating group labels
weights	optional numeric matrix containing prior weights
alpha	parameter specifying within-group variance estimator to be used
combM	a integer matrix with each row giving one choice of M groups
geneSubset	a integer vector indicating the probe pattern of combM
seed	an integer seed for the random number generator

**Value**

test statistics and upregulated group indexes after one permutation

---

postProbNull	<i>Posterior probabilities of each component null hypothesis</i>
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---

**Description**

This function computes posterior probabilities of each component null hypothesis given observed probes. Such probe-wise probabilities will be used as weights for aggregating permutations.

**Usage**

```
postProbNull(y, group, weights = NULL, alpha = "moderated",
             detail.return = TRUE)
```

**Arguments**

y	a numeric matrix containing log-expression or logCPM (log2-counts per million) values. Data frame or SummarizedExperiment object will be internally coerced into a matrix. Rows correspond to probes and columns to samples. Missing values are not permitted.
group	categorical vector or factor giving group membership of columns of y. At least two categories need to be presented.
weights	optional numeric matrix containing prior weights for each spot.
alpha	parameter specifying within-group variance estimator to be used. 'moderated': empirical Bayes moderated variance estimator as used in <a href="#">eBayes</a> . Numeric value: a constant value added to pooled variance estimator ( $\alpha + \sigma$ ). NULL: no estimator; all variances are set to be 1.
detail.return	a logical indicating whether more details (e.g. lfdR) will be returned.

**Details**

Posterior probabilities of each component null hypothesis given observed probes are estimated from ANOVA test on certain groups and local fdr. There are totally  $(K - 1)$  null hypotheses, where  $K$  is the number of groups.

**Value**

a list containing the following components:

<code>W</code>	a matrix of posterior probabilities for each component null hypothesis given an observed probe. Rows correspond to probes and columns to one hypothesis.
<code>label</code>	a vector of group labels.
<code>groupOrder</code>	a matrix with each row being group indexes ordered based on decreasing expression levels. Group indexes are positions in <code>label</code> .
<code>F.p.value</code>	a matrix with each column giving p-values corresponding to F-statistics on certain groups.
<code>lfdr</code>	a matrix with each column being local false discovery rates estimated based on one column of weighted <code>F.p.value</code> matrix.
<code>fit</code>	a <code>MArrayLM</code> fitted model object produced by <code>lmFit</code> .

`F.p.value`, `lfdr` and `fit` are returned only when `detail.return` is `TRUE`.

**Examples**

```
data(RocheBT)
ppnull <- postProbNull(RocheBT$y, RocheBT$group, alpha='moderated')
ppnull <- postProbNull(RocheBT$y, RocheBT$group, alpha=0.1)
```

---

`pvalueWeightedEst`      *p-value by weighted permutation scheme*

---

**Description**

This function estimates p-values by aggregating weighted permutations.

**Usage**

```
pvalueWeightedEst(tt, ttperm, w)
```

**Arguments**

<code>tt</code>	a vector of test statistics.
<code>ttperm</code>	a matrix of test statistics from permutations. Rows correspond to probes and columns to one permutation.
<code>w</code>	a matrix containing weights for each spot in <code>ttperm</code> . Provided by <code>postProbNull</code> .

**Details**

P-values are estimated by weightedly accumulating test statistics from permutations that are larger than observations

**Value**

p-values.

**Examples**

```
#generate some example data
t.obs <- rnorm(100)
t.perm <- matrix(rnorm(100*1000),nrow=100)
w <- matrix(runif(100*1000),nrow=100)

pv <- pvalueWeightedEst(t.obs, t.perm, w)
```

---

RocheBT

*mRNA expression data downsampled from GSE28490 (Roche)*

---

**Description**

Three cell subtypes (B cells, CD4+ T cells, CD8+ T cells) were isolated from 5 pools of 5 healthy donors each. RNA obtained from these 15 purified populations were subsequently used for mRNA expression profiling by HG-U133Plus2.0 microarrays. We downsample the original data to 5000 probes/probesets. Subtype labels for purified populations are also included. (Data generation script can be found in ./data\_raw folder.)

**Usage**

```
data(RocheBT)
```

**Format**

A list with one expression matrix (y) and a categorical vector giving subtypes (group).

**References**

Allantaz et al. PLoS One 2012;7(1):e29979. PMID: 22276136

---

row_min	<i>min value for each row</i>
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---

**Description**

min value for each row

**Usage**

row\_min(Y)

**Arguments**

Y                    a numeric matrix

**Value**

a numeric vector indicating min value in each row

---

row_which_max	<i>which.max for each row</i>
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---

**Description**

which.max for each row

**Usage**

row\_which\_max(Y)

**Arguments**

Y                    a numeric matrix

**Value**

a integer vector indicating the location of max value in each row

---

shuffle_topm	<i>Shuffle the top M groups</i>
--------------	---------------------------------

---

**Description**

Shuffle the top M groups

**Usage**

```
shuffle_topm(y, group, weights, combM, geneSubset, seed)
```

**Arguments**

y	a numeric matrix to be shuffled.
group	a integer vector indicating group indexes.
weights	optional numeric matrix containing prior weights.
combM	a integer matrix with each row giving one choice of M groups.
geneSubset	a integer vector indicating the probe pattern of combM.
seed	an integer seed for the random number generator.

**Value**

shuffled expression matrix and weight matrix in top M groups.

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