

# Package ‘TEAM’

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**Type** Package

**Title** Multiple Hypothesis Testing on an Aggregation Tree Method

**Version** 0.1.0

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**Description** An implementation of the TEAM algorithm to identify local differences between two (e.g. case and control) independent, univariate distributions, as described in J Pura, C Chan, and J Xie (2019) <[arXiv:1906.07757](https://arxiv.org/abs/1906.07757)>. The algorithm is based on embedding a multiple-testing procedure on a hierarchical structure to identify high-resolution differences between two distributions. The hierarchical structure is designed to identify strong, short-range differences at lower layers and weaker, but long-range differences at increasing layers. TEAM yields consistent layer-specific and overall false discovery rate control.

**License** GPL-2

**Encoding** UTF-8

**LazyData** true

**Imports** plyr,ggplot2,ks

**RoxygenNote** 6.1.1

**NeedsCompilation** no

**Repository** CRAN

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 chunk.sum

*Chunk.Sum function*


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**Description**

Rolling Sum over distinct chunks

**Usage**

```
chunk.sum(v, n, na.rm = TRUE)
```

**Arguments**

v	Numeric Vector
n	Size of chunk
na.rm	Remove NAs (default=TRUE)

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 est.c.hat

*Estimate threshold function*


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**Description**

Estimate threshold to control FDR in multiple testing procedure

**Usage**

```
est.c.hat(l, n, theta0, x.l, c.hats, alpha, m.l)
```

**Arguments**

l	Layer
n	Number of pooled case and control observations in each layer 1 bin
theta0	Nominal boundary level for binomial parameter at layer 1
x.l	Vector of case counts in each bin
c.hats	Previous c.hats calculated from layers 1 to l-1
alpha	Nominal FDR level
m.l	Number of leaf hypotheses at layer l

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est.FDR.hat.l	<i>Calculate FDR</i>
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**Description**

Step-down multiple-testing procedure

**Usage**

```
est.FDR.hat.l(min.x, max.x, c.prev, n.l, x.l, theta0, l)
```

**Arguments**

min.x	lower limit of searching range
max.x	upper limit of searching range
c.prev	Previous c.hat from layer l-1
n.l	Vector of number of pooled observations in layer l bins
x.l	Vector of case counts in each bin at layer l
theta0	Nominal boundary level for binomial parameter at layer l
l	Layer

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expand.mat	<i>Enumerate binomial support</i>
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**Description**

Enumerate possible counts for calculating binomial probability

**Usage**

```
expand.mat(mat, vec)
```

**Arguments**

mat	Matrix
vec	Numeric Vector

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splitNoOverlap	<i>splitNoOverlap function</i>
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**Description**

Split a vector into distinct chunks of specified size

**Usage**

```
splitNoOverlap(vec, seg.length)
```

**Arguments**

vec	Numeric Vector
seg.length	Number of distinct chunks to split vec

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TEAM	<i>Testing on an Aggregation Tree Method</i>
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**Description**

This function performs multiple testing embedded in a hierarchical structure in order to identify local differences between two independent distributions (e.g. case and control).

**Usage**

```
TEAM(x1, x2, theta0 = length(x2)/length(c(x1, x2)), K = 14,  
alpha = 0.05, L = 3)
```

**Arguments**

x1	Numeric vector of N1 control observations
x2	Numeric vector of N2 case observations
theta0	Nominal boundary level for binomial parameter - default is $N2/(N1+N2)$
K	log2 number of bins
alpha	Nominal false discovery rate (FDR) level
L	Number of layers in the aggregation tree

**Value**

List containing the discoveries (S.list) in each layer and the estimated layer-specific thresholds (c.hats)

## References

Pura J. Chan C. Xie J. Multiple Testing Embedded in an Aggregation Tree to Identify where Two Distributions Differ. <https://arxiv.org/abs/1906.07757>

## Examples

```
set.seed(1)
# Simulate local shift difference for each population from mixture of normals
N1 <- N2 <- 1e6
require(ks) #loads rnorm.mixt function
#Controls
x1 <- rnorm.mixt(N1,mus=c(0.2,0.89),sigmas=c(0.04,0.01),props=c(0.97,0.03))
#Cases
x2 <- rnorm.mixt(N2,mus=c(0.2,0.88),sigmas=c(0.04,0.01),props=c(0.97,0.03))
res <- TEAM(x1,x2,K=14,alpha=0.05,L=3)
#Discoveries in each layer - Each element is an growing set of
#indices captured at each layer
res$S.list
#Map back final discoveries in layer 3 to corresponding regions
levels(res$dat$quant)[res$S.list[[3]]]
```

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valid.counts

*Valid counts*

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## Description

Enumerate matrix of valid counts for a vector of values

## Usage

```
valid.counts(x, c.prev)
```

## Arguments

x	Vector
c.prev	Calculated chat from layer l-1

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