# Package 'copa'

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Title Functions to perform cancer outlier profile analysis.
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<b>Description</b> COPA is a method to find genes that undergo recurrent fusion in a given cancer type by finding pairs of genes that have mutually exclusive outlier profiles.
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### Description

This package is used to compute copa scores, p-values based on permutation, and plots of paired genes.

#### **Details**

Package: copa
Type: Package
Version: 1.1.2
Date: 2006-01-26
License: Artistic

There are two main functions; copa, which is used to compute the COPA score for a set of microarrays, and permCopa, which is used to calculate permutation based p-values and estimate false discovery rate (FDR).

### Author(s)

James W. MacDonald

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#### References

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сора	Calculate COPA Scores from a Set of Microarrays	

#### **Description**

This function calculates COPA scores from a set of microarrays. Input can be an ExpressionSet, or a matrix or data.frame.

#### **Usage**

```
copa(object, cl, cutoff = 5, max.overlap = 0, norm.count = 0, pct = 0.95)
```

#### **Arguments**

object An ExpressionSet, or a matrix or data. frame.

cl A vector of classlabels indicating sample status (normal = 1, tumor = 2).

cutoff The cutoff to determine 'outlier' status. See details for more information.

max.overlap The maximum number of samples that can be considered 'outliers' when com-

paring two genes. The default is 0, indicating that there can be no overlap. See

details for more information.

norm.count The number of normal samples that can be considered 'outliers'. The default is

0, meaning that no normals may be outliers.

pct The percentile to use for pre-filtering the data. A preliminary step is to compute

the number of outlier samples for each gene. All genes with a number of outlier samples less than the (default 95th) percentile will be removed from further

consideration.

#### **Details**

Cancer Outlier Profile Analysis is a method that is intended to find pairs of genes that may be involved in recurrent gene fusion with a third (unknown) gene. The underlying idea here is that in certain cancers it may be common for the promoter region of one gene to become fused to certain oncogenes. For instance, Tomlins et. al. showed that the promoter region of TMPRSS2 fused to either ERG or ETV1 in the majority of prostate cancer tumors tested.

Since this fusion should only happen with one oncogene in a given sample, we look for pairs of genes where some samples have much higher expression values, but the samples for gene 'A' are mutually exclusive from the samples for gene 'B'.

The cutoff argument for this function is used to determine how high the centered and scaled expression value has to be in order to be considered an outlier. The max.overlap argument allows one to relax the requirement of mutual exclusivity, although in practice this is probably not advisable.

Note that this function computes all row-wise comparisons, which gets very large very quickly. The function will throw a warning for any data set containing > 1000 rows and query the user to see if he/she really wants to proceed. The number of genes to be considered can be adjusted by increasing/decreasing the 'pct' argument.

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#### Value

ord.prs A matrix with two columns containing the ordered row numbers from the origi-

nal matrix of gene expression values.

pr. sums A numeric vector with the number of mutually exclusive outliers for each gene

pair. This is the criterion for ranking the gene pairs; the assumption being that a pair of genes with more mutually exclusive outliers will be more interesting

than a pair with relatively fewer outliers.

mat A matrix containing the filtered gene expression values.

cl The classlabel vector passed to copa

cutoff The cutoff used

max.overlap The value of max.overlap used norm.count The value of norm.count used

pct The percentile used in the pre-filtering step

#### Author(s)

James W. MacDonald

#### References

Tomlins, SA, et al. Recurrent fusion of TMPRSS2 and ETS transcription factor genes in prostate cancer. Science. 2005 Oct 28;310(5748):644-8.

### **Examples**

```
library(Biobase)
data(sample.ExpressionSet)
cl <- abs(3 - as.numeric(pData(sample.ExpressionSet)[,2]))
tmp <- copa(sample.ExpressionSet, cl)</pre>
```

copaFilter

Pre-filter Genes for COPA Analysis

### **Description**

This function is used to pre-filter genes prior to doing a COPA analysis. The filtering is based on the nth percentile of the outlier samples for each gene. This function is an internal function and not intended to be called by the end user.

### Usage

```
## S4 method for signature 'matrix'
copaFilter(object, cl, cutoff, norm.count, pct)
## S4 method for signature 'data.frame'
copaFilter(object, cl, cutoff, norm.count, pct)
## S4 method for signature 'ExpressionSet'
copaFilter(object, cl, cutoff, norm.count, pct)
```

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#### **Arguments**

object An ExpressionSet, or a matrix or data. frame.

cl A vector of classlabels indicating sample status (normal = 1, tumor = 2).

cutoff The cutoff to determine 'outlier' status. See details for more information.

norm. count The number of normal samples that can be considered 'outliers'. The default is

0, meaning that no normals may be outliers.

pct The percentile to use for pre-filtering the data. A preliminary step is to compute

the number of outlier samples for each gene. All genes with a number of outlier samples less than the (default 95th) percentile will be removed from further

consideration.

#### Value

mat A matrix containing the gene expression values for the filtered genes.

#### Author(s)

James W. MacDonald

#### References

Tomlins, SA, et al. Recurrent fusion of TMPRSS2 and ETS transcription factor genes in prostate cancer. Science. 2005 Oct 28;310(5748):644-8.

copaPerm	Measure Significance of COPA by Permutation	

#### **Description**

This function can be used to determine the significance of the results that one gets from running copa on a particular dataset, based on permuting the class assignments.

#### Usage

```
copaPerm(object, copa, outlier.num, gene.pairs, B = 100, pval = FALSE, verbose = TRUE)
```

#### **Arguments**

object	An ExpressionSet.	or a matrix or	data frame
ODJECL	THE EXPLESSIONSEL,	or a maura or	uata. Hallic.

copa An object of class 'copa', produced by running copa on a set of microarray data.

outlier.num The number of outliers to test for. See details for more information gene.pairs The number of gene pairs to test for. See details for more information

B The number of permutations to perform. Defaults to 100. This may be too many

for interactive use.

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pval Boolean. Output an estimated p-value and false discovery rate? Defaults to

FALSE. This result will only be reasonable for large numbers of permutations

(500 - 1000). See details.

verbose Boolean. Print out the permutation number at each of 100, 200, etc. Defaults to

**TRUE** 

#### **Details**

Running copa on a set of microarray data will result in the output of an object of class 'copa', which is a list containing (among other things) an ordered vector that lists the number of mutually exclusive outlier samples for various gene pairs. This vector is ordered from smallest to largest following the assumption that the gene pairs with the most mutually exclusive outliers are probably more likely to be involved in some sort of recurrent fusion.

One can see how many pairs of genes resulted in a given number of outliers by calling tableCopa. One may then want to determine how significant a certain number of pairs is (e.g., how likely is it to get that many pairs if there is no recurrent fusion occurring). The most straightforward way to estimate the significance of a given result is to repeatedly permute the classlabels and see how many times one gets a result as large or larger than what was observed.

Technically speaking, to get a reasonable estimate of significance and a false discovery rate, one would need to permute 500 - 1000 times. However, this can take an inordinate amount of time (best left for an overnight run). To get a quick idea of significance, one could simply permute maybe 10 times (with pval = FALSE) to see how likely it is to get a certain number of outliers.

#### Value

out	A vector listing	the number of	gene pairs with	ı at least as many	outliers as

'num.outlier'.

p.value A permuted p-value, only output if pval = TRUE. Note that the size of the p-

value is determined by both the number of outliers >= 'num.outlier' as well as the number of permutations, so too few permutations may result in a p-value

that doesn't look very significant even if it is.

fdr The expected number of gene pairs with at least as many outliers as 'num.outlier'.

This can be converted to a %FDR by dividing by the observed value.

### Author(s)

James W. MacDonald

#### References

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getans

Interactive Function

### Description

A function to query the end user. This is an internal function and not intended to be called directly by the end user.

### Usage

```
getans(msg, allowed = c("y", "n"))
```

### **Arguments**

msg

The query.

allowed

Allowed responses

#### Value

The response is returned.

### Author(s)

James W. MacDonald

perm.mat

Produce a Matrix of Permuted Classlabels

### Description

This function makes a matrix of permuted classlabels. This is not intended to be called directly by end users.

### Usage

```
perm.mat(B, ids)
```

### **Arguments**

B The number of permutations

ids A vector of classlabels

### Value

A matrix of permuted classlabels.

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#### Author(s)

James W. MacDonald

plotCopa	Plot Gene Pairs fom the Results of Running copa	

### Description

This function can be used to visualize pairs of genes that may be involved in recurrent gene fusion in cancer.

### Usage

```
plotCopa(copa, idx, lib = NULL, sort = TRUE, col = NULL, legend = NULL)
```

### Arguments

сора	An object of class 'copa', resulting from a call to the copa function.
idx	A numeric vector listing the gene pairs to plot (e.g., $idx = 1:3$ will plot the first three gene pairs).
lib	If the underlying data are Affymetrix expression values, one can specify an annotation package and the plot labels will be extracted from the xxxSYMBOL environment. If NULL, the row.names of the gene expression matrix will be used.
sort	Boolean. Should the data be sorted before plotting? Defaults to TRUE.
col	A vector of color names or numbers to be used for coloring the different samples in the resulting barplot.
legend	A vector of terms describing the two sample types (e.g., 'Normal' and 'Tumor'). Defaults to $NULL$

### **Details**

Note that this function will output all the gene pairs in the idx vector without pausing. This can be controlled by either setting par(ask = TRUE), or by redirecting the output to a file (using e.g., pdf, ps, etc.).

### Value

This function is called solely for outputting plots. No values are returned.

#### Author(s)

James W. MacDonald

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#### References

Tomlins, SA, et al. Recurrent fusion of TMPRSS2 and ETS transcription factor genes in prostate cancer. Science. 2005 Oct 28;310(5748):644-8.

### **Examples**

```
if(interactive()){
library(Biobase)
data(sample.ExpressionSet)
cl <- abs(3 - as.numeric(pData(sample.ExpressionSet)[,2]))
tmp <- copa(sample.ExpressionSet, cl)
plotCopa(tmp, 1, col = c("red", "blue"))
}</pre>
```

pSum

Compute all pairwise sums

### Description

A function that computes all pairwise sums for a vector of numbers. This is an internal function and is not intended for use by end-users.

### Usage

pSum(a)

### Arguments

а

A numeric vector

#### Value

out

A square matrix (of dimension length(a) X length(a)) containing all pairwise sums.

### Author(s)

James W. MacDonald

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scatterPlotCopa	Create scatterplots of interesting gene pairs	

### Description

This function allows one to create scatterplots of gene pairs that may be involved in recurrent gene fusion in cancer.

### Usage

```
scatterPlotCopa(copa, idx, lib = NULL)
```

### Arguments

copa	An object of class 'copa', resulting from a call to the copa function
idx	A numeric vector listing the gene pairs to plot (e.g., $idx = 1:3$ will plot the first three gene pairs).
lib	If the underlying data are Affymetrix expression values, one can specify an annotation package and the plot labels will be extracted from the xxxSYMBOL environment. If NULL, the row.names of the gene expression matrix will be used.

#### **Details**

Note that this function will output all the gene pairs in the idx vector without pausing. This can be controlled by either setting par(ask = TRUE), or by redirecting the output to a file (using e.g., pdf, ps, etc.).

### Value

This function is called solely for outputting plots. No values are returned.

### Author(s)

James W. MacDonald

### References

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#### **Examples**

```
if(interactive()){
library(Biobase)
data(sample.ExpressionSet)
cl <- abs(3 - as.numeric(pData(sample.ExpressionSet)[,2]))
tmp <- copa(sample.ExpressionSet, cl)
scatterPlotCopa(tmp, 1)
}</pre>
```

summaryCopa

Create Summary Showing Top Gene Pairs

### **Description**

This function can be used to output a data.frame containing the ID and optionally the gene symbol for the top gene pairs, based on the number of outliers.

#### Usage

```
summaryCopa(copa, pairnum, lib = NULL)
```

### **Arguments**

copa An object of class 'copa', resulting from a call to the copa function.

pairnum The maximum number of outlier pairs to be output. A table can be output first

using tableCopa

lib For Affymetrix data that have an annotation package, this can be specified and

the table will then also contain the gene symbol

### Value

The output from this function is a data. frame with the number of outliers, the manufacturer identifiers, and optionally, the gene symbol for the genes.

### Author(s)

James W. MacDonald <jmacdon@u.washington.edu>

#### References

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### **Examples**

```
if(interactive()){
library(Biobase)
data(sample.ExpressionSet)
cl <- abs(3 - as.numeric(pData(sample.ExpressionSet)[,2]))
tmp <- copa(sample.ExpressionSet, cl)
summaryCopa(tmp, 6)
}</pre>
```

tableCopa

Summarize copa results

### Description

This function will output a table showing the number of gene pairs at each number of outliers.

### Usage

```
tableCopa(copa)
```

### **Arguments**

copa

A 'copa' object, the result of a call to copa

### Value

This function simply prints a table to the screen, useful for summarizing the output from a call to copa.

### Author(s)

James W. MacDonald

### **Examples**

```
library(Biobase)
data(sample.ExpressionSet)
cl <- abs(3 - as.numeric(pData(sample.ExpressionSet)[,2]))
tmp <- copa(sample.ExpressionSet, cl)
tableCopa(tmp)</pre>
```

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