

# Package ‘ClusterFoldSimilarity’

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**Type** Package

**Title** Calculate similarity of clusters from different single cell samples using foldchanges

**Version** 1.1.0

**Description** This package calculates a similarity coefficient using the fold changes of shared features (e.g. genes) among clusters of different samples/batches/datasets. The similarity coefficient is calculated using the dot-product (Hadamard product) of every pairwise combination of Fold Changes between a source cluster  $i$  of sample/dataset  $n$  and all the target clusters  $j$  in sample/dataset  $m$

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clusterFoldSimilarity *Calculate cluster similarity between clusters from different single cell samples.*

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### Description

'clusterFoldSimilarity()' returns a dataframe containing the best top similarities between all possible pairs of single cell samples.

### Usage

```
clusterFoldSimilarity(
  scList = NULL,
  sampleNames = NULL,
  topN = 1,
  topNFeatures = 1,
  nSubsampling = 15,
  parallel = FALSE
)
```

### Arguments

scList	List. A list of Single Cell Experiments or Seurat objects. At least 2 are needed. The objects are expected to have cluster or label groups set as identity class.
sampleNames	Character Vector. Specify the sample names, if not a number corresponding with its position on (scList).
topN	Numeric. Specifies the number of target clusters with best similarity to report for each cluster comparison (default 1). If set to Inf, then all similarity values from all possible pairs of clusters are returned.
topNFeatures	Numeric. Number of top features that explains the clusters similarity to report for each cluster comparison (default 1). If topN = Inf then topNFeatures is automatically set to 1.
nSubsampling	Numeric. Number of random sampling of cells to achieve fold change stability (default 15).
parallel	Boolean. Whether to use parallel computing using BiocParallel or not (default FALSE).

**Details**

This function will calculate a similarity coefficient using the fold changes of shared features (e.g.:genes for a single-cell RNA-Seq, peaks for ATAC-Seq) among clusters, or user-defined-groups, from different samples/batches. The similarity coefficient is calculated using the dotproduct of every pairwise combination of Fold Changes between a source cluster/group *i* from sample *n* and all the target clusters/groups in sample *j*.

**Value**

The function returns a DataFrame containing the best top similarities between all possible pairs of single cell samples. Column values are:

similarityValue	The top similarity value calculated between datasetL:clusterL and datasetR.
w	Weight associated with the similarity score value.
datasetL	Dataset left, the dataset/sample which has been used to be compared.
clusterL	Cluster left, the cluster source from datasetL which has been compared.
datasetR	Dataset right, the dataset/sample used for comparison against datasetL.
clusterR	Cluster right, the cluster target from datasetR which is being compared with the clusterL from datasetL.
topFeatureConserved	The features (e.g.: genes, peaks...) that most contributed to the similarity between clusterL & clusterR.
featureScore	The similarity score contribution for the specific topFeatureConserved (e.g.: genes, peaks...).

**Author(s)**

Oscar Gonzalez-Velasco

**Examples**

```
if (requireNamespace("Seurat") & requireNamespace("SeuratObject")){
  library(ClusterFoldSimilarity)
  library(Seurat)
  library(SeuratObject)
  # data dimensions
  nfeatures <- 2000; ncells <- 400
  # single-cell 1
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene", seq(nfeatures))
  colnames(counts) <- paste0("cell", seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3"), size = ncells, replace = TRUE),
    row.names=paste0("cell", seq(ncells)))
  seu1 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu1) <- "cluster"
  # single-cell 2
```

```

counts <- matrix(rpois(n=nfeatures * ncells, lambda=20), nfeatures)
rownames(counts) <- paste0("gene",seq(nfeatures))
colnames(counts) <- paste0("cell",seq(ncells))
colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3", "Cluster4"),size = ncells,replace = TRUE),
                        row.names=paste0("cell",seq(ncells)))
seu2 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
Idents(object = seu2) <- "cluster"
# Create a list with the unprocessed single-cell datasets
singlecellObjectList <- list(seu1, seu2)

similarityTable <- clusterFoldSimilarity(scList=singlecellObjectList, sampleNames = c("sc1", "sc2"))
head(similarityTable)
}

```

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## findCommunitiesSimilarity

*Find cell-group communities by constructing and clustering a directed graph using the similarity values calculated by ClusterFoldSimilarity()*

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### Description

‘findCommunitiesSimilarity()’ Find communities by constructing and clustering graph using the similarity values calculated by ClusterFoldSimilarity().

### Usage

```
findCommunitiesSimilarity(similarityTable = NULL)
```

### Arguments

similarityTable

Dataframe. A table obtained from ClusterFoldSimilarity that contains the similarity values as a column "similarityValue" that represents the similarity of a source cluster to a target cluster.

### Details

This function will group together nodes of the network into communities using the InfoMap community detection algorithm.

### Value

This function returns a data frame with the community that each node of the network (cell groups defined by the user) belongs to, and plots a graph in which the nodes are clusters from a specific dataset, the edges represent the similarity and the direction of that similarity between clusters.

sample	The sample name.
group	The group/cluster from sample defined by the user.
community	Community group to which the sample:group belongs to.

**Author(s)**

Oscar Gonzalez-Velasco

**Examples**

```

if (requireNamespace("Seurat") & requireNamespace("SeuratObject")){
  library(ClusterFoldSimilarity)
  library(Seurat)
  library(SeuratObject)
  # data dimensions
  nfeatures <- 2000; ncells <- 400
  # single-cell 1
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene", seq(nfeatures))
  colnames(counts) <- paste0("cell", seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3"), size = ncells, replace = TRUE),
    row.names=paste0("cell", seq(ncells)))
  seu1 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu1) <- "cluster"
  # single-cell 2
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene", seq(nfeatures))
  colnames(counts) <- paste0("cell", seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3", "Cluster4"), size = ncells, replace = TRUE),
    row.names=paste0("cell", seq(ncells)))
  seu2 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu2) <- "cluster"
  # Create a list with the unprocessed single-cell datasets
  singlecellObjectList <- list(seu1, seu2)

  similarityTable <- clusterFoldSimilarity(scList = singlecellObjectList, sampleNames = c("sc1", "sc2"))
  head(similarityTable)
  findCommunitiesSimilarity(similarityTable=similarityTable)
}

```

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foldchangeComposition *Calculate the dot product between all the possible combinations of foldchanges from diferent clusters.*

---

**Description**

'foldchangeComposition()' returns a dataframe containing the best top similarities between all possible pairs of single cell samples.

**Usage**

```
foldchangeComposition(root = NULL, comparative = NULL)
```

**Arguments**

root	Dataframe. Foldchanges between a source cluster and all the other clusters found on a sample.
comparative	Dataframe. Foldchanges between a cluster and all the other clusters found on a second sample to be compared with the (root) cluster foldchanges.

**Details**

This function will perform the dot product of each possible combination of foldchanges, by constructing two dataframes: one with the source cluster's foldchanges and the other with the fold-change values of a target sample's cluster. The computation of all the possible combinations is the hadamard product of the matrix.

**Value**

A dataframe containing the hadamard product of all the possible combinations of foldchanges.

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pairwiseClusterFoldChange

*Calculate the gene mean expression Fold Change between all possible combinations of clusters.*

---

**Description**

'pairwiseClusterFoldChange()' returns a list of dataframes containing the pairwise fold changes between all combinations of cluster.

**Usage**

```
pairwiseClusterFoldChange(countData, clusters, nSubsampling, functToApply)
```

**Arguments**

countData	Matrix. Normalized counts containing gene expression.
clusters	Factor. A vector of corresponding cluster for each sample of (x).
nSubsampling	Numeric. Number of random sampling of cells to achieve fold change stability.

## Details

This function will perform fold change estimation from the mean feature's expression between all possible combination of clusters specified on colLabels inside the sc object. Bayesian Estimation of FoldChanges and Pseudocounts adapted from: Florian Erhard, Estimating pseudocounts and fold changes for digital expression measurements, Bioinformatics, Volume 34, Issue 23, December 2018, Pages 4054–4063, <https://doi.org/10.1093/bioinformatics/bty471> Please consider citing also Erhard et. al. paper when using ClusterFoldSimilarity.

## Value

A list of dataframes containing the pairwise fold changes between all combinations of cluster.

## Author(s)

Oscar Gonzalez-Velasco

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plotClustersGraph	<i>Creates a graph plot using the similarity values calculated with ClusterFoldSimilarity().</i>
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## Description

'plotClustersGraph()' Creates a graph plot using the similarity values calculated with ClusterFoldSimilarity().

## Usage

```
plotClustersGraph(similarityTable = NULL)
```

## Arguments

similarityTable

Dataframe. A table obtained from ClusterFoldSimilarity that contains the similarity values as a column "similarityValue" that represents the similarity of a source cluster to a target cluster.

## Details

This function will calculate a similarity coefficient using the fold changes of shared genes among clusters of different samples/batches. The similarity coefficient is calculated using the dotproduct of every pairwise combination of Fold Changes between a source cluster  $i$  of sample  $n$  and all the target clusters in sample  $j$ .

## Value

This function plots a graph in which the nodes are clusters from a specific dataset, the edges represent the similarity and the direction of that similarity between clusters.

**Author(s)**

Oscar Gonzalez-Velasco

**Examples**

```

if (requireNamespace("Seurat") & requireNamespace("SeuratObject")){
  library(ClusterFoldSimilarity)
  library(Seurat)
  library(SeuratObject)
  # data dimensions
  nfeatures <- 2000; ncells <- 400
  # single-cell 1
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene",seq(nfeatures))
  colnames(counts) <- paste0("cell",seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3"),size = ncells,replace = TRUE),
                        row.names=paste0("cell",seq(ncells)))
  seu1 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu1) <- "cluster"
  # single-cell 2
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene",seq(nfeatures))
  colnames(counts) <- paste0("cell",seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3", "Cluster4"),size = ncells,replace = TRUE),
                        row.names=paste0("cell",seq(ncells)))
  seu2 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu2) <- "cluster"
  # Create a list with the unprocessed single-cell datasets
  singlecellObjectList <- list(seu1, seu2)

  similarityTable <- clusterFoldSimilarity(scList = singlecellObjectList, sampleNames = c("sc1", "sc2"))
  head(similarityTable)
  plotClustersGraph(similarityTable=similarityTable)
}

```

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similarityHeatmap	<i>Plot a heatmap of the similarity values obtained using cluster fold similarity</i>
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**Description**

‘similarityHeatmap()’ returns a ggplot heatmap representing the similarity values between pairs of clusters as obtained from [clusterFoldSimilarity](#).

**Usage**

```

similarityHeatmap(
  similarityTable = NULL,

```



```

    mainDataset = NULL,
    otherDatasets = NULL,
    highlightTop = TRUE
  )

```

### Arguments

similarityTable	A DataFrame containing the similarities between all possible pairs of single cell samples obtained with <a href="#">clusterFoldSimilarity</a> using the option <code>n_top=Inf</code> .
mainDataset	Numeric. Specify the main dataset (y axis). It corresponds with the <code>datasetL</code> column from the <code>similarityTable</code>
otherDatasets	Numeric. Specify some specific dataset to be plotted along the <code>mainDataset</code> (x axis, default: all other datasets found on <code>datasetR</code> column from <code>similarity_table</code> ).
highlightTop	Boolean. If the top 2 similarity values should be highlighted on the heatmap (default: TRUE)

### Details

This function plots a heatmap using `ggplot`. It is intended to be used with the output table from [clusterFoldSimilarity](#), which includes the columns: `datasetL` (the dataset used for comparison) `datasetR` (the dataset against `datasetL` has been contrasted), `clusterL` (clusters from `datasetL`), `clusterR` (clusters from `datasetR`) and the `similarityValue`.

### Value

The function returns a heatmap `ggplot` object.

### Author(s)

Oscar Gonzalez-Velasco

### Examples

```

if (requireNamespace("Seurat") & requireNamespace("SeuratObject")){
  library(ClusterFoldSimilarity)
  library(Seurat)
  library(SeuratObject)
  # data dimensions
  nfeatures <- 2000; ncells <- 400
  # single-cell 1
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)
  rownames(counts) <- paste0("gene", seq(nfeatures))
  colnames(counts) <- paste0("cell", seq(ncells))
  colData <- data.frame(cluster=sample(c("Cluster1", "Cluster2", "Cluster3"), size = ncells, replace = TRUE),
    row.names=paste0("cell", seq(ncells)))
  seu1 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
  Idents(object = seu1) <- "cluster"
  # single-cell 2
  counts <- matrix(rpois(n=nfeatures * ncells, lambda=10), nfeatures)

```

```
rownames(counts) <- paste0("gene",seq(nfeatures))
colnames(counts) <- paste0("cell",seq(ncells))
colData <- data.frame(cluster=sample(c("Cluster1","Cluster2","Cluster3","Cluster4"),size = ncells,replace = TRUE),
                      row.names=paste0("cell",seq(ncells)))
seu2 <- SeuratObject::CreateSeuratObject(counts = counts, meta.data = colData)
Idents(object = seu2) <- "cluster"
# Create a list with the unprocessed single-cell datasets
singlecellObjectList <- list(seu1, seu2)
# Using topN = Inf by default plots a heatmap using the similarity values:
similarityTableAll <- clusterFoldSimilarity(scList=singlecellObjectList, topN=Inf)
# Using the dataset 2 as a reference on the Y-axis of the heatmap:
similarityHeatmap(similarityTable=similarityTableAll, mainDataset=2, highlightTop=FALSE)
}
```

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