## Package 'SpotClean'

April 4, 2025

Version 1.9.0

Date 2024/06/08

**Title** SpotClean adjusts for spot swapping in spatial transcriptomics data

**Depends** R (>= 4.2.0),

**Imports** stats, methods, utils, dplyr, S4Vectors, SummarizedExperiment, SpatialExperiment, Matrix, rhdf5, ggplot2, grid, readbitmap, rjson, tibble, viridis, grDevices, RColorBrewer, Seurat, rlang

**Suggests** testthat (>= 2.1.0), knitr, BiocStyle, rmarkdown, R.utils, spelling

**biocViews** DataImport, RNASeq, Sequencing, GeneExpression, Spatial, SingleCell, Transcriptomics, Preprocessing

**Description** SpotClean is a computational method to adjust for spot swapping in spatial transcriptomics data. Recent spatial transcriptomics experiments utilize slides containing thousands of spots with spot-specific barcodes that bind mRNA. Ideally, unique molecular identifiers at a spot measure spot-specific expression, but this is often not the case due to bleed from nearby spots, an artifact we refer to as spot swapping. SpotClean is able to estimate the contamination rate in observed data and decontaminate the spot swapping effect, thus increase the sensitivity and precision of downstream analyses.

License GPL-3

NeedsCompilation yes

VignetteBuilder knitr

**Encoding UTF-8** 

RoxygenNote 7.3.1

URL https://github.com/zijianni/SpotClean

BugReports https://github.com/zijianni/SpotClean/issues

Language en-US

git\_url https://git.bioconductor.org/packages/SpotClean

git\_branch devel

2 SpotClean-package

git\_last\_commit 0e3a77e
git\_last\_commit\_date 2024-10-29
Repository Bioconductor 3.21
Date/Publication 2025-04-03

**Author** Zijian Ni [aut, cre] (ORCID: <a href="https://orcid.org/0000-0003-1181-8337">https://orcid.org/0000-0003-1181-8337</a>), Christina Kendziorski [ctb]

Maintainer Zijian Ni <zni25@wisc.edu>

## **Contents**

|       | SpotClean-package  |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 2  |
|-------|--------------------|------------|------|--|---|--|--|----|-----|-----|-----|---|----|-----|------|-----|-----|----|-----|----|----|-----|----|----|----|
|       | arcScore           |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 3  |
|       | convertToSeurat    |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 4  |
|       | createSlide        |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 5  |
|       | keepHighGene       |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 6  |
|       | mbrain_raw         |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 7  |
|       | read10xRaw         |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 8  |
|       | spotclean          |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 10 |
|       | visualizeHeatmap . |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 12 |
|       | visualizeLabel     |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 14 |
|       | visualizeSlide     |            | <br> |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 16 |
| Index |                    |            |      |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    | 17 |
|       |                    |            |      |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    |    |
| Spot( | Clean-package      | Spo<br>spa |      |  | • |  |  | me | eth | 100 | d 1 | 0 | ad | ju. | st j | foi | r s | ро | t s | sw | ap | pii | ng | in |    |
|       |                    |            |      |  |   |  |  |    |     |     |     |   |    |     |      |     |     |    |     |    |    |     |    |    |    |

## **Description**

SpotClean is a computational method to adjust for spot swapping in spatial transcriptomics data. Recent spatial transcriptomics experiments utilize slides containing thousands of spots with spot-specific barcodes that bind mRNA. Ideally, unique molecular identifiers at a spot measure spot-specific expression, but this is often not the case due to bleed from nearby spots, an artifact we refer to as spot swapping. SpotClean is able to estimate the contamination rate in observed data and decontaminate the spot swapping effect, thus increase the sensitivity and precision of downstream analyses.

#### **Details**

To learn more about SpotClean, see the vignette using browseVignettes(package = "SpotClean").

arcScore 3

#### Author(s)

Maintainer: Zijian Ni <zni25@wisc.edu> (ORCID)

Other contributors:

• Christina Kendziorski [contributor]

#### See Also

Useful links:

- https://github.com/zijianni/SpotClean
- Report bugs at https://github.com/zijianni/SpotClean/issues

arcScore

Calculate the ambient RNA contamination (ARC) score

#### **Description**

The ARC score is intended for subjectively measuring the level of contamination caused by ambient RNAs for a given spatial transcriptomics or droplet-based single-cell RNA-seq data. Intuitively, this score is a lower bound of the average proportion of contaminated expressions in tissue spots or cell droplets in the observed contaminated data.

ARC score is calculated as follows: (1) estimate the average amount of contaminated UMI counts received per spot (droplet) using the total UMI counts in background spots (empty droplets) divided by total number of spots (droplets). This is an underestimation as it does not account for contamination inside tissue spots or cell droplets. (2) estimate the average amount of observed UMI counts per tissue spot (cell droplet) using the total UMI counts in tissue spots (cell droplets) divided by number of tissue spots (cell droplets). (3) Divide the value in (1) by the value in (2) to get the ARC score.

This lower bound is very conservative as it only accounts for observable contamination in background spots or empty droplets, neglecting contamination in tissue spots or cell droplets. However, it is totally subjective, not relying on any complicated assumptions and modelling. ARC score serves as a relative contamination measurement for comparison among different datasets and protocols.

```
arcScore(object, ...)
## Default S3 method:
arcScore(object, background_bcs, ...)
## S3 method for class 'SummarizedExperiment'
arcScore(object, ...)
```

4 convertToSeurat

#### Arguments

object A gene-by-barcode count matrix or a slide object created or inherited from

createSlide(). Ideally this should give the raw count matrix with all genes

and barcodes without any filtering.

... Arguments passed to other methods

background\_bcs (vector of chr) Background barcodes in count\_mat. For spatial data, these are

background spots not covered by tissue. For single-cell data, these are empty

droplets not containing cells.

## Value

(num) The ARC score of given data.

## **Examples**

convertToSeurat

Convert slide object to Seurat object

#### **Description**

This function converts our slide object of class SummarizedExperiment to Seurat object of class Seurat so that users can directly proceed with Seurat spatial analyses pipelines. Built based on Seurat's Load10X\_Spatial().

```
convertToSeurat(slide_obj, image_dir, slice = "slice1", filter_matrix = TRUE)
```

createSlide 5

#### Arguments

slide\_obj A slide object created or inherited from createSlide().

image\_dir (chr) Path to directory with 10X Genomics visium image data; should include files tissue\_lowres\_image.png, scalefactors\_json.json and tissue\_positions\_list.csv.

slice (chr) Name for the stored image of the tissue slice. Default: "slice1"

filter\_matrix (logical) If TRUE, only keep spots that have been determined to be over tissue.

If slide\_obj only contains tissue spots, filter\_matrix has to be set TRUE. If slide\_obj contains both tissue and background spots, setting filter\_matrix=TRUE

will subset the expression matrix to tissue spots only. Default: TRUE

#### Value

A Seurat object with spatial information.

#### **Examples**

```
# load count matrix and slide metadata
data(mbrain_raw)
spatial_dir <- system.file(file.path("extdata",</pre>
                                      "V1_Adult_Mouse_Brain_spatial"),
                            package = "SpotClean")
mbrain_slide_info <- read10xSlide(tissue_csv_file=file.path(spatial_dir,
                                         "tissue_positions_list.csv"),
             tissue_img_file = file.path(spatial_dir,
                                         "tissue_lowres_image.png"),
             scale_factor_file = file.path(spatial_dir,
                                         "scalefactors_json.json"))
# Create slide object
mbrain_obj <- createSlide(mbrain_raw,</pre>
                           mbrain_slide_info)
# Convert to Seurat object
seurat_obj <- convertToSeurat(mbrain_obj, spatial_dir, "raw")</pre>
str(seurat_obj)
```

createSlide

Create a new slide object

#### **Description**

This function takes input of the count matrix (from read10xRaw or read10xRawH5) and slide information (from read10xSlide or manually specified data frame) and outputs a SummarizedExperiment object as our slide object for downstream decontamination and visualization.

6 keepHighGene

#### Usage

```
createSlide(count_mat, slide_info, gene_cutoff = 0.1, verbose = TRUE)
```

#### **Arguments**

| count_mat   | (matrix of num) The raw gene-by-barcode count matrix. Can be either standard matrix format or sparse matrix format.   |
|-------------|---|
| slide_info  | (list or data.frame) A list of slide information from read10xSlide(), or a data frame only containing spot information like barcode, tissue, imagerow, imagecol, etc. |
| gene_cutoff | (num) Filter out genes with average expressions among tissue spots below or equal to this cutoff. Default: 0.1  |
| verbose     | (logical) Whether print progress information. Default: TRUE   |

#### Value

A SummarizedExperiment object containing gene expression and spot metadata.

## **Examples**

keepHighGene

Filter and return highly expressed or highly variable genes

#### Description

This function is for filtering genes in the expression count matrix based on their average expression and variability. Usually genes with low expressions and variability are less interesting and do not contribute too much to downstream analyses, but rather bring technical noise. It is always recommended to pre-filter gene expression matrix before any analyses.

We apply the function FindVariableFeatures with selection.method = "mvp" from package Seurat on log transformed expression matrix to detect high variable genes. This method does not require a pre-specified number of high variable genes.

mbrain\_raw 7

#### Usage

```
keepHighGene(
  count_mat,
  top_high = 5000,
  mean_cutoff = 1,
  return_matrix = FALSE,
  verbose = TRUE
)
```

## **Arguments**

count\_mat (matrix of num) Input count matrix to be filtered. Can be either standard matrix format or sparse matrix format.

top\_high (int) Only look for highly expressed and variable genes within this number of top expressed genes. Default: 5000.

mean\_cutoff (num) Genes with average expressions among all spots exceeding this cutoff are kept as highly expressed genes.

return\_matrix (logical) Whether return filtered matrix instead of gene names. Default: FALSE verbose (logical) Whether print progress information. Default: TRUE

#### Value

A vector of gene names or a filtered expression count matrix with the same class as count\_mat.

## **Examples**

mbrain\_raw

Example 10x Visium spatial data: raw count matrix

## Description

This dataset contains one sparse count matrix mbrain\_raw of gene expressions. The original dataset can be found at https://support.10xgenomics.com/spatial-gene-expression/datasets/1.0.0/V1\_Adult\_Mouse\_Brain. For simplicity, we only keep the top 100 highest expressed genes in this example data.

If users read raw data using read10xRaw (or read10xRawH5), they should get exactly the same format as the object in this dataset.

8 read10xRaw

#### Usage

```
data(mbrain_raw)
```

#### **Format**

An object of class "dgCMatrix".

#### Source

```
V1_Adult_Mouse_Brain
```

#### **Examples**

```
data(mbrain_raw)
str(mbrain_raw)
```

read10xRaw

Read 10x Space Ranger output data

#### Description

read10xRaw() is a one-line handy function for reading the raw expression data from 10x Space Ranger outputs and producing a count matrix as an R object.

read10xRawH5() is for reading 10x Space Ranger output HDF5 file (ended with .h5).

read10xSlide() is for reading slide information (e.g. spot positions) and the tissue image from 10x Space Ranger outputs. This function is developed based on 10x's secondary analysis pipeline https://support.10xgenomics.com/spatial-gene-expression/software/pipelines/latest/rkit.

#### Usage

```
read10xRaw(count_dir = NULL, row_name = "symbol", meta = FALSE)
read10xRawH5(h5_file, row_name = "symbol", meta = FALSE)
read10xSlide(tissue_csv_file, tissue_img_file = NULL, scale_factor_file = NULL)
```

## **Arguments**

count\_dir (chr) The directory of 10x output matrix data. The directory should include three

files: barcodes.tsv.gz, features.tsv.gz, matrix.mtx.gz.

row\_name (chr) Specify either using gene symbols (row\_name = "symbol") or gene En-

sembl IDs (row\_name = "id") as row names of the count matrix. Default: row\_name

= "symbol"

read10xRaw 9

meta

(logical) If TRUE, read10xRaw or read10xRawH5 returns a list containing both the count matrix and metadata of genes (features). Metadata includes feature names, IDs and other additional information depending on Space Ranger output. If FALSE, only returns the count matrix. Default: FALSE

h5\_file

(chr) The path of 10x output matrix HDF5 file (ended with .h5).

tissue\_csv\_file

(chr) The path of 10x output CSV file of spot positions, usually named tissue\_positions\_list.csv for Space Ranger V1 and tissue\_positions.csv for Space Ranger V2.

tissue\_img\_file

(chr) The path of the 10x output low resolution tissue image in PNG format, usually named tissue\_lowres\_image.png. If NULL, the returned slide data does not contain image information. Please do provide this file if you could find it. Default: NULL

scale\_factor\_file

(chr) The path of the 10x output scale factor file in json format, usually named scalefactors\_json.json. If NULL, spot positions in image will not be corrected by the scale factor. Please do provide this file if you could find it. Default: NULL

#### Value

If meta = TRUE, read10xRaw() or read10xRawH5() returns a list of two elements: a "dgCMatrix" sparse matrix containing expression counts and a data frame containing metadata of genes (features). For the count matrix, each row is a gene (feature) and each column is a spot barcode. If meta = FALSE, only returns the count matrix.

read10xSlide() returns a list of two objects. The first object, slide, is a data frame where each row corresponds to a spot and each column corresponds to slide information such as row and column positions on the slide. The second object, grob, is a Grid Graphical Object of the tissue image when specifying tissue\_img\_file.

## **Examples**

10 spotclean

```
R.utils::gzip(matrix_dir)
close(barcode_dir)
close(gene_dir)
# read expression count matrix
list.files(data_dir)
mbrain_raw_new <- read10xRaw(data_dir)</pre>
str(mbrain_raw_new)
identical(mbrain_raw, mbrain_raw_new)
# read slide metadata
spatial_dir <- system.file(file.path("extdata",</pre>
                                      "V1_Adult_Mouse_Brain_spatial"),
                            package = "SpotClean")
list.files(spatial_dir)
mbrain_slide_info <- read10xSlide(tissue_csv_file=file.path(spatial_dir,</pre>
                                        "tissue_positions_list.csv"),
             tissue_img_file = file.path(spatial_dir,
                                        "tissue_lowres_image.png"),
             scale_factor_file = file.path(spatial_dir,
                                        "scalefactors_json.json"))
str(mbrain_slide_info)
```

spotclean

Decontaminate spot swapping effect in spatial transcriptomics data

## **Description**

This is the main function implementing the SpotClean method for decontaminating spot swapping effect in spatial transcriptomics data.

```
spotclean(slide_obj, ...)
## S3 method for class 'SummarizedExperiment'
spotclean(
    slide_obj,
    gene_keep = NULL,
    maxit = 30,
    tol = 1,
    candidate_radius = 5 * seq_len(6),
    kernel = "gaussian",
    verbose = TRUE,
    ...
)
## S3 method for class 'SpatialExperiment'
```

spotclean 11

```
spotclean(
   slide_obj,
   gene_keep = NULL,
   gene_cutoff = 0.1,
   maxit = 30,
   tol = 1,
   candidate_radius = 5 * seq_len(6),
   kernel = "gaussian",
   verbose = TRUE,
   ...
)
```

## **Arguments**

slide\_obj A slide object created or inherited from createSlide(), or a SpatialExperiment

object created from SpatialExperiment::read10xVisium().

... Arguments passed to other methods

gene\_keep (vector of chr) Gene names to keep for decontamination. We recommend not de-

contaminating lowly expressed and lowly variable genes in order to save computation time. Even if user include them, their decontaminated expressions will not change too much from raw expressions. When setting to NULL, keepHighGene() will be automatically called to filter out lowly expressed and lowly variable

genes before decontamination. Default: NULL.

maxit (int) Maximum iteration for EM parameter updates. Default: 30.

tol (num) Tolerance to define convergence in EM parameter updates. When the

element-wise maximum difference between current and updated parameter ma-

trix is less than tol, parameters are considered converged. Default: 1

candidate\_radius

(vector of num) Candidate contamination radius. A series of radius to try when

estimating contamination parameters. Default: c(5, 10, 15, 20, 25, 30)

kernel (chr): name of kernel to use to model local contamination. Supports "gaussian",

"linear", "laplace", "cauchy". Default: "gaussian".

verbose (logical) Whether print progress information. Default: TRUE

gene\_cutoff (num) Filter out genes with average expressions among tissue spots below or

equal to this cutoff. Only applies to SpatialExperiment object. Default: 0.1.

#### **Details**

Briefly, the contamination level for the slide is estimated based on the total counts of all spots. UMI counts travelling around the slide are assumed to follow Poisson distributions and modeled by a mixture of Gaussian (proximal) and uniform (distal) kernels. The underlying uncontaminated gene expressions are estimated by EM algorithm to maximize the data likelihood. Detailed derivation can be found in our manuscript.

12 visualizeHeatmap

#### Value

For slide object created from createSlide(), returns a slide object where the decontaminated expression matrix is in the "decont" assay slot and the contamination statistics are in metadata slots. Contamination statistics include ambient RNA contamination (ARC) score, bleeding rate, distal rate, contamination radius, contamination kernel weight matrix, log-likelihood value in each iteration, estimated proportion of contamination in each tissue spot in observed data. Since decontaminated and raw data have different number of columns, they can not be stored in a single object.

For SpatialExperiment object created from SpatialExperiment::read10xVisium(), returns a SpatialExperiment object where the decontaminated expression matrix is in the "decont" assay slot and the contamination statistics are in metadata slots. Raw expression matrix is also stored in the "counts" assay slot. Genes are filtered based on gene\_cutoff.

## **Examples**

visualizeHeatmap

Visualize spot values on the 2D slide

## **Description**

Generate and visualize spot labels on the 2D slide as a ggplot2 object. Spot labels can be given via parameter label as external input or one column in the slide slot of the slide object's metadata via label\_col. Exactly one of label and label\_col must be specified.

```
visualizeHeatmap(object, ...)
## Default S3 method:
visualizeHeatmap(
  object,
```

visualizeHeatmap 13

```
value,
  exp_matrix = NULL,
  subset_barcodes = NULL,
  logged = TRUE,
  viridis = TRUE,
  legend_range = NULL,
  title = "",
  legend_title = NULL,
)
## S3 method for class 'SummarizedExperiment'
visualizeHeatmap(
  object,
  value,
  subset_barcodes = NULL,
  logged = TRUE,
  viridis = TRUE,
  legend_range = NULL,
  title = "",
  legend_title = NULL,
)
```

## **Arguments**

object A slide object created or inherited from createSlide(), or a data.frame of

slide information with columns: barcodes, tissue, imagerow, imagecol, etc.

... Arguments passed to other methods

value (numeric vector or chr) Either a vector of numeric values for all spots, or the

name of one gene in exp\_matrix or in the expression matrix in the slide object. In the former case, the order of values in the vector should match the spot

barcodes in the slide object.

exp\_matrix (matrix of num) When object is a data frame and value is a single character

string, will search the matching gene in exp\_matrix and plot the gene expres-

sion. Default: NULL

subset\_barcodes

(vector of chr) A subset of spot barcodes to plot. By default it plots all spots in the slide object. This can be useful when only plotting tissue spots or specific

tissue types or regions. Default: NULL

logged (logical) Specify if the color scale is log1p transformed. Default: TRUE

viridis (logical) If true, color scale uses viridis. Otherwise, use rainbow. Default: TRUE

legend\_range (length 2 vector of num) Custom legend range of the value. By default uses the

range of the plotted values. Default: NULL

title (chr) Title of the plot. Default: ""

legend\_title (chr) Title of the legend. Under default, use value as legend title. Default: NULL

14 visualizeLabel

#### Value

A ggplot2 object.

#### **Examples**

visualizeLabel

Visualize spot labels on the 2D slide

#### Description

Generate and visualize spot labels on the 2D slide as a ggplot2 object. Spot labels can be given via parameter label as external input or one column in the slide slot of the slide object's metadata via label\_col. Exactly one of label and label\_col must be specified.

```
visualizeLabel(object, ...)

## Default S3 method:
visualizeLabel(
  object,
  label = "tissue",
  subset_barcodes = NULL,
  title = "",
  legend_title = NULL,
  ...
)

## S3 method for class 'SummarizedExperiment'
visualizeLabel(
  object,
```

visualizeLabel 15

```
label = "tissue",
subset_barcodes = NULL,
title = "",
legend_title = NULL,
...
)
```

#### **Arguments**

object A slide object created or inherited from createSlide(), or a data.frame of

slide information with columns: barcodes, tissue, imagerow, imagecol, etc.

... Arguments passed to other methods

label (categorical vector or chr) Either a vector of labels for all spots, or the column

name in the slide slot of the slide object's metadata. In the former case, the order of values in the vector should match the spot barcodes in the slide object. In the latter case, The column should be categorical with reasonably number of

unique labels. Default: "tissue"

subset\_barcodes

(vector of chr) A subset of spot barcodes to plot. By default it plots all spots in the slide object. This can be useful when only plotting tissue spots or specific

tissue types or regions. Default: NULL

title (chr) Title of the plot. Default: ""

legend\_title (chr) Title of the legend. Under default, use label as legend title. Default: NULL

#### Value

A ggplot2 object.

## **Examples**

16 visualizeSlide

visualizeSlide

Visualize the Visium slide image

#### **Description**

Generate and visualize the tissue image as a ggplot2 object. Users can manually add and modify layers (e.g. title, axis) following ggplot2's syntax.

#### **Usage**

```
visualizeSlide(slide_obj, title = "")
```

## **Arguments**

slide\_obj A slide object created or inherited from createSlide().
title (chr) Title of the plot. Default: ""

#### Value

A ggplot2 object.

## **Examples**

# **Index**

```
\ast datasets
    mbrain_raw, 7
arcScore, 3
convertToSeurat, 4
createSlide, 5
{\it keepHighGene}, \color{red} 6
mbrain_raw, 7
read10xRaw, 8
read10xRawH5 (read10xRaw), 8
read10xSlide(read10xRaw), 8
SpotClean (SpotClean-package), 2
spotclean, 10
SpotClean-package, 2
visualizeHeatmap, 12
visualizeLabel, 14
visualizeSlide, 16
```