# Package 'cytofQC'

May 24, 2024

Type Package

for each label

Version 1.5.0 Description cytofQC is a package for initial cleaning of CyTOF data. It uses a semi-supervised approach for labeling cells with their most likely data type (bead, doublet, debris, dead) and the probability that they belong to each label type. This package does not remove data from the dataset, but provides labels and information to aid the data user in cleaning their data. Our algorithm is able to distinguish between doublets and large cells. License Artistic-2.0 URL https://github.com/jillbo1000/cytofQC BugReports https://github.com/jillbo1000/cytofQC/issues biocViews Software, SingleCell, Annotation **Encoding UTF-8** LazyData false **Imports** CATALYST, flowCore, e1071, EZtune, gbm, ggplot2, hrbrthemes, matrixStats, randomForest, rmarkdown, SingleCellExperiment, stats, SummarizedExperiment, ssc, S4Vectors, graphics, methods RoxygenNote 7.2.3 Suggests gridExtra, knitr, RColorBrewer, testthat, uwot VignetteBuilder knitr git\_url https://git.bioconductor.org/packages/cytofQC git\_branch devel git\_last\_commit dd1933b git\_last\_commit\_date 2024-04-30 Repository Bioconductor 3.20 Date/Publication 2024-05-24 **Author** Jill Lundell [aut, cre] (<a href="https://orcid.org/0000-0002-6048-4700">https://orcid.org/0000-0002-6048-4700</a>), Kelly Street [aut] (<a href="https://orcid.org/0000-0001-6379-5013">https://orcid.org/0000-0001-6379-5013</a>) Maintainer Jill Lundell < jflundell@gmail.com>

Title Labels normalized cells for CyTOF data and assigns probabilities

2 cytofQC-package

# **Contents**

|       | cytofQC-package        |  |
|-------|------------------------|--|
|       |                        |  |
|       | =                      |  |
|       | =                      |  |
|       | initialBead            |  |
|       | initialDead            |  |
|       | initialDebris          |  |
|       | initialDoublet         |  |
|       | initialGuess           |  |
|       | labelQC                |  |
|       | modelData              |  |
|       | plotInitialGuess       |  |
|       | readCytof              |  |
|       | rfLabel                |  |
|       | s3vmLabel              |  |
|       | scores                 |  |
|       | svmLabel               |  |
| Index |                        | 22   |
|       | fQC-package <i>cyt</i> | ofQC: Event labeling for quality control of CyTOF data |

## Description

Labels observations in a CyTOF dataset as a cell, gdpZero (zero for at least one Gaussian parameter), bead, debris, doublet, or dead cell.

#### **Details**

Data from an fcs file are read directly into a SingleCellExperiment using the readCytof function.

The data can be labeled with a single function, labelQC, which can be customized. Labeling can also be done using a set of other functions that first select a set of events that clearly look like the event type being modeled and then use those events to train a statistical learning model that can identify the event type. These functions are discussed and demonstrated in the vignette.

A plotting function called cytofHist is included that makes assessing the characteristic of the data and labeling easy.

The package also includes a function called cytofQCreport that generates a report of the labeling and can generate a umap created with the QC variables and colored by event label.

Package: cytofQC
Type: Package
Version: 0.99.3
Date: 2022-11-11
License: Artistic-2.0

cytofHist 3

# Author(s)

Maintainer: Jill Lundell <jflundell@gmail.com>

Authors: J. Lundell, K. Street

cytofHist

Returns histogram for grouped data

# Description

Returns histogram for grouped data

# Usage

```
cytofHist(x, group, type = c("count", "density"), na.rm = FALSE, title = NULL)
```

# Arguments

| X     | Numeric vector of values that will be plotted.   |
|-------|--|
| group | A vector that contains the grouping variable. It can be a numeric, factor, or character vector.  |
| type  | Either "count" or "density". The "count" selection keeps the groups on the same scale. The "density" option will over emphasize the group with the fewest observations. This is helpful when identifying where certain subgroups are relative to the majority of the data. |
| na.rm | TRUE if NAs should be removed prior to plotting. FALSE if they should remain. The NAs will be plotted as a separate group if they are not removed.   |
| title | Optional title for the plot  |

## Value

A ggplot2 histogram.

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1','cisPt2'))
sce <- labelQC(sce)
cytofHist(scores(sce, 'bead'), label(sce))</pre>
```

4 gbmLabel

| cytofQCreport $Ge$ | nerate a cytofQC report |
|--------------------|-------------------------|
|--------------------|-------------------------|

# Description

Generate a cytofQC report

# Usage

```
cytofQCreport(x, outDir, sampName, runUMAP = TRUE, ...)
```

# Arguments

| x        | A SingleCellExperiment object generated by labelQC.   |
|----------|---|
| outDir   | The output directory (currently required).  |
| sampName | Basename of the output HTML file (if not provided, same as outDir).   |
| runUMAP  | Logical value indicating whether or not to include a UMAP plot in the report. This plot can be beneficial for diagnostic purposes, but is time-consuming to generate. |
|          | Additions arguments that may be passed to the function.   |

## Value

If successful, returns TRUE silently and generates the specified QC report.

# **Examples**

```
data("raw_data", package = "CATALYST")
x <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
x <- labelQC(x, n = 500)
tmp <- tempdir()
cytofQCreport(x, tmp, 'example')</pre>
```

| gbmLabel | Returns the final label assignments for a parameter using a gradient |
|----------|--|
|          | boosting machine   |

# Description

Returns the final label assignments for a parameter using a gradient boosting machine

gbmLabel 5

#### Usage

```
gbmLabel(
    x,
    type = c("bead", "doublet", "debris", "dead"),
    loss = c("auc", "class"),
    n = 4000,
    standardize = TRUE
)
```

#### **Arguments**

| Х           | A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.           |
|-------------|--|
| type        | Identifies the type of label that is being modeled. Must be 'bead', 'doublet', 'debris', or 'dead'.                                    |
| loss        | Specifies the type of loss used to tune the GBM. Can be either "auc" for the area under the curve or "class" for classification error. |
| n           | number of observations in training dataset.  |
| standardize | Indicates if the data should be standardized. Because the data are on different scales, it should be standardized for this analysis.   |

#### **Details**

gbmLabel uses a gradient boosting machine to compute the final labels for the specified parameter type (bead, doublet, debris, or dead). This step cannot be completed until the corresponding initialization function (initialBead, initialDebris, initialDoublet, or initialDead) is done on the SingleCellExperiment created by readCytof. The gbm is tuned using eztune and then predicted values are computed for all of the events in x. If the predicted probability for the label type is greater than 0.5, the label is changed to the specified type. However, if an observation already has a label other than 'cell' in the label variable, it will not be changed. The predicted probabilities for all of the observations are stored in the variable associated with that type in the probs object of x for further analysis. Thus, it is possible to have a probability greater than 0.5 for 'debris' but still have a label of 'bead' if an observation was classified as a bead prior to classifying the debris.

## Value

An updated SingleCellExperiment is returned with the labels for the parameter of interest (bead, doublet, debris, or dead) added to the label object of the SingleCellExperiment and the probabilities for the event type added to the probs object of the SingleCellExperiment.

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialBead(sce)
sce <- gbmLabel(sce, type = "bead", loss = "auc")
head(probs(sce))
table(label(sce))</pre>
```

6 initialBead

initialBead

Preliminary bead classification

## **Description**

Preliminary bead classification

## Usage

```
initialBead(x)
```

## **Arguments**

Χ

A SingleCellExperiment created with readCytof.

#### **Details**

The beads are typically the first cell classification that is done. The different event types are labeled iteratively so the labels vector in the colData will contain all of the labels and probabilities computed up to this point. Only events that have a "cell" label can be assigned an initial event classification of "bead". This function computes a score that assesses how much an event looks like a bead and then fits a mixture model to assign each event a class of 1 for a bead, -1 for an event that is not a bead, or 0 for undetermined or previously assigned to a different event type. The score is recorded in the score object in the colData and the initial classification is recorded in the initial part of the colData.

Each bead channel should classify into two fairly clear groups where one is the beads and the other is non-beads. A histogram of the bead score should show a clear, small peak that represents the beads.

## Value

A SingleCellExperiment that contains the bead score and the bead designation for each event. This information is stored in the score and initial objects in the colData for the SingleCellExperiment.

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1','cisPt2'))
sce <- initialBead(sce)
head(scores(sce))
head(initial(sce))</pre>
```

initialDead 7

|--|

## **Description**

Preliminary viability classification

## Usage

```
initialDead(x, dna = FALSE, standardize = TRUE)
```

#### **Arguments**

x A SingleCellExperiment created with readCytof.

dna If TRUE, the DNA will be used to determine viability.

standardize A value of TRUE will use compute the doublet score using standardized data.

The raw data will be used to compute the score if FALSE. It is highly recommended that the data are standardized prior to computing the score because the

variables are on different scales.

#### **Details**

The beads are typically the first cell classification that is done because their identification is straightforward. Debris is typically classified after the beads and doublets classified after the debris. After the doublets are classified, the permeability is assessed. The permeability can be used to determine which cells are alive and which are dead. Dead cells are often gated out prior to gating debris and doublets. However, cleaning with respect to permeability is complicated in that it does not always make sense to clean "dead", or permeable, cells out of the data. Our default method chooses to classify them last because once an event is labeled "dead", it will not be assigned a different label. However, a user may wish to label the permeable, or dead cells right after cleaning the beads so that the "dead" label takes precedence over debris and doublets. Note that "dead" is used in place of permeable for labeling in this package.

Different event types are labeled iteratively so the labels vector in the colData will contain all of the labels and probabilities computed up to this point. Only events that have a "cell" label can be assigned an initial event classification of "dead". This function computes a score that assesses how much an event looks like a permeable cell and then fits a mixture model to assign each event a class of 1 for permeable, -1 for an event that is not permeable, or 0 for undetermined or previously assigned to a different event type. The score is recorded in the score object in the colData and the initial classification is recorded in the initial part of the colData.

The viability measures should classify into two fairly clear groups where one is permeable cells and the other is non-permeability. DNA is also often higher for cells that are permeable. The primary measure for determining permeability is sum of the viability measures, but the method allows for DNA content to be used as well. The function initialGuess is used to determine the groups. The members of the group with the largest mean are classified as 'dead' and the rest are classified as not dead.

8 initialDebris

#### Value

A SingleCellExperiment that contains the permeability score and the permeability designation for each event. This information is stored in the score and initial objects in the colData for the SingleCellExperiment.

#### **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1','cisPt2'))
sce <- initialBead(sce)
sce <- initialDebris(sce)
sce <- initialDoublet(sce)
sce <- initialDead(sce)
head(scores(sce))
head(initial(sce))</pre>
```

initialDebris

Preliminary debris classification

## **Description**

Preliminary debris classification

## Usage

```
initialDebris(x, score = c(1, 2, 3), standardize = TRUE)
```

#### **Arguments**

x A SingleCellExperiment created with readCytof.

score A value of 1, 2, or 3 that specifies the debris score that should be calculated. See

details for information on the debris score.

standardize A value of TRUE will compute the debris score using standardized data. The

raw data will be used to compute the score if FALSE. It is highly recommended that the data are standardized prior to computing the score because the variables

are on different scales.

#### **Details**

The beads are typically the first cell classification that is done because their identification is straightforward. Debris is typically classified after the beads. This is because classifying debris is more straightforward than doublets and labeling them before the doublets aids in doublet classification.

Different event types are labeled iteratively so the labels vector in the colData will contain all of the labels and probabilities computed up to this point. Only events that have a "cell" label can be assigned an initial event classification of "debris". This function computes a score that assesses how much an event looks like debris and then fits a mixture model to assign each event a class of 1 for

initialDoublet 9

debris, -1 for an event that is not debris, or 0 for undetermined or previously assigned to a different event type. The score is recorded in the score object in the colData and the initial classification is recorded in the initial part of the colData.

Several options are available for computing the debris score. The following list shows the debris score calculations. Each one can be selected by its number on the following list:

```
    1. 1 - (DNA1 + DNA2 + Event_length - Center - Width + Offset)
    2. Residual + Offset - 2(DNA1) - 2(DNA2) - Event_length - Center - 0.5(Width)
    3. 1 - (DNA1 + DNA2 + Event_length)
```

#### Value

A SingleCellExperiment that contains the debris score and the debris designation for each event. This information is stored in the score and initial objects in the colData for the SingleCellExperiment.

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1','cisPt2'))
sce <- initialBead(sce)
sce <- initialDebris(sce)
head(scores(sce))
head(initial(sce))</pre>
```

initialDoublet

Preliminary doublet classification

## Description

Preliminary doublet classification

## Usage

```
initialDoublet(x, score = c(1, 2, 3), standardize = TRUE)
```

# **Arguments**

x A SingleCellExperiment created with readCytof.

score A value of 1, 2, or 3 that specifies the doublet score that should be calculated.

See details for information on the doublet score.

standardize A value of TRUE will use compute the doublet score using standardized data.

The raw data will be used to compute the score if FALSE. It is highly recommended that the data are standardized prior to computing the score because the

variables are on different scales.

10 initialGuess

#### **Details**

The beads are typically the first cell classification that is done because their identification is straightforward. Debris is typically classified after the beads. This is because classifying debris is more straightforward than doublets and labeling them before the doublets aids in doublet classification.

Different event types are labeled iteratively so the labels vector in the colData will contain all of the labels and probabilities computed up to this point. Only events that have a "cell" label can be assigned an initial event classification of "doublet". This function computes a score that assesses how much an event looks like a doublet and then fits a mixture model to assign each event a class of 1 for doublet, -1 for an event that is not a doublet, or 0 for undetermined or previously assigned to a different event type. The score is recorded in the score object in the colData and the initial classification is recorded in the initial part of the colData.

Several options are available for computing the doublet score. The following list shows the doublet score calculations. Each one can be selected by its number on the following list:

```
    DNA1 + DNA2 + Residual + Event_length - Offset - 0.5(Width)
    DNA1 + DNA2 + Residual + Event_length - Offset - 0.5(Width) + abs(Center)
    0.3 * (DNA1 + DNA2 + Event_length) + Residual + Center + (max(Offset))
```

#### Value

A SingleCellExperiment that contains the doublet score and the doublet designation for each event. This information is stored in the score and initial objects in the colData for the SingleCellExperiment.

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1','cisPt2'))
sce <- initialBead(sce)
sce <- initialDebris(sce)
sce <- initialDoublet(sce)
head(scores(sce))
head(initial(sce))</pre>
```

initialGuess

General preliminary classification.

## **Description**

General preliminary classification.

```
initialGuess(x, middleGroup = c(0, -1, 1))
```

labelQC 11

## **Arguments**

x The score (ie. debris score, doublet score, etc.) to be used for predicting each event's label (eg. "doublet" vs. "cell").

middleGroup

numeric. When the optimal model (according to BIC) is the 3-component mixture model, this argument determines how to assign the middle group. Possible values are -1 for "cell", 0 (default) for "indeterminate", and 1 for the event type of interest (eg. "doublet").

#### Value

A list with the following elements:

- label A vector of the same length as x providing the labels (-1 for cells, 1 for non-cells, 0 for uncertain).
- fit1 Summary of the 1-component (half Normal) model fit.
- fit2 Summary of the 2-component (half Normal + Normal) model fit.
- fit1 Summary of the 3-component (half Normal + 2 Normals) model fit.

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialDoublet(sce)
fit <- initialGuess(scores(sce, "doublet"))</pre>
```

labelQC

Returns the final label assignments the specified parameters

# Description

Returns the final label assignments the specified parameters

```
labelQC(
    x,
    model = c("svm", "rf", "gbm"),
    type = c("all", "bead", "doublet", "debris", "dead"),
    nTrain = 4000,
    loss = c("auc", "class")
)
```

12 modelData

## **Arguments**

| X      | A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.   |
|--------|--|
| model  | Type of model to use to do the labeling. Options are "svm" for a support vector machine, "gbm" for a gradient boosting machine, or "rf" for a random forest.   |
| type   | Types of events to model. Options are "all", "bead", "doublet", "debris", and "dead".  |
| nTrain | The (maximum) number of data points to use when training a model to predict event types.   |
| loss   | Specifies the type of loss used to tune the GBM. Can be either "auc" for the area under the curve or "class" for classification error. This argument is ignored if random forest is used as the model. |

## **Details**

labelQC uses a support vector machine, gradient boosting machine, or a random forest to compute the final labels for the specified parameter types (bead, doublet, debris, or dead). The predicted probabilities for all of the observations are stored in the variable associated with that type for further analysis. Thus, it is possible to have a probability greater than 0.5 for 'debris' but still have a label of 'bead' if an observation was classified as a bead prior to classifying the debris.

#### Value

A SingleCellExperiment data.frame is returned with the labels for the parameters of listed in types (bead, doublet, debris, or dead) added to the label variable and the probabilities for each of the columns pertaining to the parameters listed in probs.

# **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- labelQC(sce)
table(label(sce))</pre>
```

| modelData | Returns indices for data to be used to create the final classification model |
|-----------|--|
|           | model  |

## **Description**

Returns indices for data to be used to create the final classification model

```
modelData(x, type = c("bead", "doublet", "debris", "dead"), n = 4000)
```

plotInitialGuess 13

## **Arguments**

| X    | A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.  |
|------|---|
| type | Identifies the type of label that is being modeled. Must be 'bead', 'doublet', 'debris', or 'dead'. Note that if no type of label is specified 'bead' will be used. |
| n    | number of indices to return.  |

## **Details**

The indices that are returned by modelData are be used to create a model that can be used to classify the observations with regard to the parameter of interest (bead, doublet, debris, dead). It is used as part of gbmLabel, rfLabel, svmLable, and labelQC. The function modelData uses the score and the function initialGuess to randomly select a set of data points that we are confident are of the event type and not of the selected event type that can be used to train the data. Only points that are labeled as -1 and 1 are considered for the training dataset. The selected dataset is balance with a fairly equal number of points from each group.

## Value

An integer vector that contains the indices of the events that should be included in the creation of the final classification model for the event type of interest (bead, debris, doublet, dead).

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialBead(sce)
train <- modelData(sce, type = "bead", n = 4000)</pre>
```

plotInitialGuess

Plot preliminary classification from initialGuess

# Description

Plot preliminary classification from initialGuess

```
plotInitialGuess(
    x,
    IG = NULL,
    fit = NULL,
    type = c("both", "full", "truncated")
)
```

14 readCytof

## **Arguments**

| X    | The score (ie. debris score, doublet score, etc.) to be used for predicting each event's label (eg. "doublet" vs. "cell").   |
|------|--|
| IG   | If NULL, the function initialGuess is used to fit a mixture of normal distributions. Otherwise, a numeric vector can be passed to the function that contains the fitted values.  |
| fit  | If left blank or NULL, the best fit as determined by BIC will be plotted. Otherwise, a numeric value of 1, 2, or 3 can be be selected to plot single normal fit, mixture of two normals, or the mixture of three normals as fit by initialGuess. |
| type | Type of graph to be plotted. If 'truncated' is selected, only half of the first normal distribution will be plotted. If 'both' is selected, both the truncated and full plot will be plotted.  |

#### Value

A histogram that shows the score with the mixture of normal distributions overlayed.

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialDoublet(sce)
plotInitialGuess(scores(sce, "doublet"), type = "both")
plotInitialGuess(scores(sce, "doublet"), type = "truncated")</pre>
```

 ${\tt readCytof}$ 

Read in a dataset and prepare it for analysis

## **Description**

Read in a dataset and prepare it for analysis

```
readCytof(
  file.name,
  beads = c("Bead"),
  dna = c("DNA1", "DNA2"),
  event_length = "Event_length",
  viability = "Live_Dead",
  gaussian = c("Center", "Offset", "Width", "Residual"),
  verbose = TRUE
)
```

readCytof 15

## **Arguments**

file.name A path to an .fcs file that contains CyTOF data or a flowSet object containing

a single sample.

beads character vector that contains the names of all of the bead channels.

dna Character vector that contains the names of the DNA markers.

event\_length Character vector of the event length variable.

viability Character vector of the permeability/viability markers.

gaussian Character vector that contains the names of the Gaussian Discrimination Param-

eters.

verbose Logical value indicating whether or not to print a summary of the technical

channels identified in the data.

#### Details

The function returns a SingleCellExperiment that contains all of the original information from the fcs file. The data are imported using CATALYST and then information is added to the colData that will be used to determine labels for each event and to provide additional information about the events that can be used for exploratory data analysis and to aid the user in labeling the data. The objects are all initialized at this point an values are filled in during later stages of the labeling process. Note that the names from the fcs file are required as arguments to the readCytof. If you are not sure what those names are, there is some code in the example that shows how to import your data into a SingleCellExperiment using prepData from CATALYST and look at the names.

#### Value

A SingleCellExperiment that contains the information from the CyTOF fcs file, the technical data that will be used to label the data, and other objects that are used to store information through the labeling process. The objects are DataFrame objects that are stored in the colData for the SingleCellExperiment. The objects are:

label A single variable DataFrame that will contain the event label as determined by

cytofQC. At this point, all events are labeled "gdpZero" if Event\_length or any of the Gaussian parameters are zero and "cell" otherwise. These labels are

changed during later stages.

probs A DataFrame that contains the "probability" that an event is a certain type. This

is initialized as NA at this point and is filled in later on.

tech A DataFrame that contains the technical variables used to determine the label of

each event. The bead, DNA, and viability variables have an arcsinh transform, Event\_length is unchanged, and the Gaussian parameters have a log transform

using log1p.

scores Scores are computed to determine how much an event looks like a bead, debris,

doublet, or dead cell. These scores are used to select a training dataset for the classification model, but they can be helpful for exploratory data analysis so they are provided in this DataFrame. At this stage they are initialized as NA and

values are added in later steps.

16 rfLabel

initial

Initial classification of each event type is determined using a mixture model and the event type score. The initial object is a DataFrame that will hold this initial classification. A training dataset for the event classification model is selected using this initial classification.

## **Examples**

```
library(CATALYST)
library(SingleCellExperiment)
data("raw_data", package = "CATALYST")

# Determine at the names of the bead, DNA, and viability channels in the
# file. Names are 'Beads', 'DNA1', 'DNA2', 'cisPt1', 'cisPt2'.
tech <- prepData(raw_data)
rownames(tech)

# Determine names of event length and Gaussian parameters
# names are 'Event_length', 'Center', 'Offset', 'Width', 'Residual'
names(int_colData(tech))

# read in the data for use with cytofQC
x <- readCytof(raw_data, beads = 'Beads', viability = c('cisPt1', 'cisPt2'))</pre>
```

rfLabel

Returns the final label assignments for a parameter using a random forest

# Description

Returns the final label assignments for a parameter using a random forest

## Usage

```
rfLabel(
   x,
   type = c("bead", "doublet", "debris", "dead"),
   loss = c("auc", "class"),
   n = 4000,
   standardize = TRUE
)
```

## **Arguments**

x A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.

type Identifies the type of label that is being modeled. Must be 'bead', 'doublet', 'debris', or 'dead'.

s3vmLabel 17

loss Specifies the type of loss used to tune the GBM. Can be either "auc" for the area

under the curve or "class" for classification error.

n number of observations in training dataset.

standardize Indicates if the data should be standardized. Because the data are on different

scales, it should be standardized for this analysis because the variables are on

different scales.

#### **Details**

rfLabel uses a random forest to compute the final labels for the specified parameter type (bead, doublet, debris, or dead). This step cannot be completed until the corresponding initialization function (initialBead, initialDebris, initialDoublet, or initialDead) is done on the SingleCellExperiment created by readCytof. The random forest uses the defaults from randomForest and then predicted values are computed for all of the events in x. If the predicted probability for the label type is greater than 0.5, the label is changed to the specified type. However, if an observation already has a label other than 'cell' in the label variable, it will not be changed. The predicted probabilities for all of the observations are stored in the variable associated with that type in the probs object of x for further analysis. Thus, it is possible to have a probability greater than 0.5 for 'debris' but still have a label of 'bead' if an observation was classified as a bead prior to classifying the debris.

## Value

An updated SingleCellExperiment is returned with the labels for the parameter of interest (bead, doublet, debris, or dead) added to the label object of the SingleCellExperiment and the probabilities for the event type added to the probs object of the SingleCellExperiment.

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialBead(sce)
sce <- rfLabel(sce, type = "bead")
head(probs(sce))
table(label(sce))</pre>
```

s3vmLabel Returns the final label assignments for a parameter using a semisupervised support vector machine

## **Description**

Returns the final label assignments for a parameter using a semi-supervised support vector machine

18 s3vmLabel

## Usage

```
s3vmLabel(
   x,
   type = c("bead", "doublet", "debris", "dead"),
   loss = c("auc", "class"),
   n = 4000,
   standardize = TRUE
)
```

#### **Arguments**

x A SingleCellExperiment created with readCytof with the scores and initial

columns filled out for the event type of interest.

type Identifies the type of label that is being modeled. Must be 'bead', 'doublet',

'debris', or 'dead'.

loss Specifies the type of loss used to tune the SVM. Can be either "auc" for the area

under the curve or "class" for classification error.

n number of observations in training dataset.

standardize Indicates if the data should be standardized. Because the data are on different

scales, it should be standardized for this analysis because the variables are on

different scales.

#### **Details**

s3vmLabel uses a semi-supervised support vector machine to compute the final labels for the specified parameter type (bead, doublet, debris, or dead). The model is initially computed using only the data specified in the index argument. Events are iteratively added to this set when the updated SVM predicts a label with high confidence. Then predicted values are computed for all of the observations in x. If the predicted probability for the label type is greater than 0.5, the label is changed to the specified type. However, if an observation already has a label other than 'cell' in the labels\$label variable, it will not be changed. The predicted probabilities for all of the observations is stored in the variable associated with that type for further analysis. Thus, it is possible to have a probability greater than 0.5 for 'debris' but still have a label of 'bead' if an observation was classified as a bead prior to classifying the debris.

#### Value

An updated SingleCellExperiment is returned with the labels for the parameter of interest (bead, doublet, debris, or dead) added to the label object of the SingleCellExperiment and the probabilities for the event type added to the probs object of the SingleCellExperiment.

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialBead(sce)
sce <- svmLabel(sce, type = "bead", loss = "auc")
head(probs(sce))</pre>
```

scores 19

```
table(label(sce))
```

scores

Returns a specified object from the cytofQC SingleCellExperiment

## **Description**

Returns a specified object from the cytofQC SingleCellExperiment

# Usage

```
scores(x, type = c("all", "bead", "debris", "doublet", "dead"))
probs(x, type = c("all", "bead", "debris", "doublet", "dead"))
label(x)
tech(
    x,
    type = c("all", "Bead", "DNA", "Viability", "Event_length", "Center", "Offset",
        "Width", "Residual")
)
initial(x, type = c("all", "bead", "debris", "doublet", "dead"))
```

## **Arguments**

Х

A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.

type

Identifies the type of objects to be returned. For scores and probs, type can be one or more of 'bead', 'dead', 'debris', or 'doublet'. For tech it can be any of the QC variables. It will return the numeric vector or DataFrame for the score(s) or probability for the specified event type(s). If the event types are not specified, the DataFrame containing all of the scores or all of the probability will be returned. This argument does nothing for label.

#### Value

For probs, scores, and tech, a numeric vector or DataFrame with the information for the event type(s) is returned.

For label, a character vector containing the label for each event is returned.

For tech, a DataFrame containing the technical variables used to determine the label of each event. The bead, DNA, and viability variables have an arcsinh transform, Event\_length is unchanged, and the Gaussian parameters have a log transform using log1p.

20 svmLabel

## **Examples**

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- labelQC(sce)
table(label(sce))
cytofHist(scores(sce, type = 'bead'), label(sce), title = "Bead score")</pre>
```

svmLabel

Returns the final label assignments for a parameter using a support vector machine

# Description

Returns the final label assignments for a parameter using a support vector machine

## Usage

```
svmLabel(
    x,
    type = c("bead", "doublet", "debris", "dead"),
    loss = c("auc", "class"),
    n = 4000,
    standardize = TRUE
)
```

## **Arguments**

| х           | A SingleCellExperiment created with readCytof with the scores and initial columns filled out for the event type of interest.   |
|-------------|--|
| type        | Identifies the type of label that is being modeled. Must be 'bead', 'doublet', 'debris', or 'dead'.  |
| loss        | Specifies the type of loss used to tune the GBM. Can be either "auc" for the area under the curve or "class" for classification error.   |
| n           | number of observations in training dataset.  |
| standardize | Indicates if the data should be standardized. Because the data are on different scales, it should be standardized for this analysis because the variables are on different scales. |

#### **Details**

svmLabel uses a support vector machine to compute the final labels for the specified parameter type (bead, doublet, debris, or dead). This step cannot be completed until the corresponding initialization function (initialBead, initialDebris, initialDoublet, or initialDead) is done on the SingleCellExperiment created by readCytof. The support vector machine is tuned using eztune and then predicted values are computed for all of the events in x. If the predicted probability for the label type is greater than 0.5, the label is changed to the specified type. However, if an observation

svmLabel 21

already has a label other than 'cell' in the label variable, it will not be changed. The predicted probabilities for all of the observations are stored in the variable associated with that type in the probs object of x for further analysis. Thus, it is possible to have a probability greater than 0.5 for 'debris' but still have a label of 'bead' if an observation was classified as a bead prior to classifying the debris.

#### Value

An updated SingleCellExperiment is returned with the labels for the parameter of interest (bead, doublet, debris, or dead) added to the label object of the SingleCellExperiment and the probabilities for the event type added to the probs object of the SingleCellExperiment.

```
data("raw_data", package = "CATALYST")
sce <- readCytof(raw_data, beads = "Beads", viability = c("cisPt1", "cisPt2"))
sce <- initialBead(sce)
sce <- svmLabel(sce, type = "bead", loss = "auc")
table(label(sce))</pre>
```

# **Index**

```
cytofHist, 2, 3
cytofQC (cytofQC-package), 2
cytofQC-package, 2
cytofQCreport, 2, 4
eztune, 5, 20
gbmLabel, 4
initial (scores), 19
initialBead, 6
initialDead, 7
initialDebris, 8
initialDoublet, 9
initial \textit{Guess}, \textcolor{red}{10}
label (scores), 19
labelQC, 2, 4, 11
modelData, 12
plotInitialGuess, 13
probs (scores), 19
\verb"readCytof", 2, 5-9, 12, 13, 14, 16, 18-20"
rfLabel, 16
s3vmLabel, 17
scores, 19
SingleCellExperiment, 2
svmLabel, 20
tech (scores), 19
```