# Package 'SingleCellExperiment'

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**Description** Defines a S4 class for storing data from single-cell experiments. This includes specialized methods to store and retrieve spike-in information, dimensionality reduction coordinates and size factors for each cell, along with the usual metadata for genes and libraries.

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altExps

Alternative Experiment methods

#### Description

In some experiments, different features must be normalized differently or have different row-level metadata. Typical examples would be for spike-in transcripts in plate-based experiments and antibody or CRISPR tags in CITE-seq experiments. These data cannot be stored in the main assays of the SingleCellExperiment itself. However, it is still desirable to store these features *somewhere* in the SingleCellExperiment. This simplifies book-keeping in long workflows and ensure that samples remain synchronised.

To facilitate this, the SingleCellExperiment class allows for "alternative Experiments". Nested SummarizedExperiment-class objects are stored inside the SingleCellExperiment object x, in a manner that guarantees that the nested objects have the same columns in the same order as those in x. Methods are provided to enable convenient access to and manipulation of these alternative Experiments. Each alternative Experiment should contain experimental data and row metadata for a distinct set of features.

## Getters

In the following examples, x is a SingleCellExperiment object.

- altExp(x, e, withColData=FALSE): Retrieves a SummarizedExperiment containing alternative features (rows) for all cells (columns) in x. e is either a string specifying the name of the alternative Experiment in x to retrieve, or a numeric scalar specifying the index of the desired Experiment. If withColData=TRUE, the column metadata of the output object is set to colData(x).
- altExpNames(x): Returns a character vector containing the names of all alternative Experiments in x. This is guaranteed to be of the same length as the number of results, though the names may not be unique.
- altExps(x, withColData=FALSE): Returns a named List of matrices containing one or more SummarizedExperiment objects. Each object has the same number of columns. If withColData=TRUE, the column metadata of each output object is set to colData(x).

#### altExps

#### Single-object setter

altExp(x,e) <-value will add or replace an alternative Experiment in a SingleCellExperiment object x. The value of e determines how the result is added or replaced:

- If e is missing, value is assigned to the first result. If the result already exists, its name is preserved; otherwise it is given a default name "unnamed1".
- If e is a numeric scalar, it must be within the range of existing results, and value will be assigned to the result at that index.
- If e is a string and a result exists with this name, value is assigned to to that result. Otherwise a new result with this name is append to the existing list of results.

value is expected to be a SummarizedExperiment object with number of columns equal to ncol(x). Alternatively, if value is NULL, the alternative Experiment at e is removed from the object.

## **Other setters**

In the following examples, x is a SingleCellExperiment object.

altExps(x) <- value: Replaces all alternative Experiments in x with those in value. The latter should be a list-like object containing any number of SummarizedExperiment objects with number of columns equal to ncol(x).

If value is named, those names will be used to name the alternative Experiments in x. Otherwise, unnamed results are assigned default names prefixed with "unnamed".

If value is NULL, all alternative Experiments in x are removed.

altExpNames(x) <- value: Replaces all names for alternative Experiments in x with a character vector value. This should be of length equal to the number of results currently in x.

removeAltExps(x) will remove all alternative Experiments from x. This has the same effect as altExps(x) <-NULL but may be more convenient as it directly returns a SingleCellExperiment.

#### Author(s)

Aaron Lun

#### See Also

splitAltExps, for a convenient way of adding alternative Experiments from existing features.

swapAltExp, to swap the main and alternative Experiments.

## Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
dim(counts(sce))
```

```
# Mocking up some alternative Experiments.
se1 <- SummarizedExperiment(matrix(rpois(1000, 5), ncol=ncol(se)))
rowData(se1)$stuff <- sample(LETTERS, nrow(se1), replace=TRUE)
se2 <- SummarizedExperiment(matrix(rpois(500, 5), ncol=ncol(se)))
rowData(se2)$blah <- sample(letters, nrow(se2), replace=TRUE)</pre>
```

```
# Setting the alternative Experiments.
altExp(sce, "spike-in") <- se1
altExp(sce, "CRISPR") <- se2</pre>
```

```
# Getting alternative Experimental data.
altExpNames(sce)
altExp(sce, "spike-in")
altExp(sce, 2)
# Setting alternative Experimental data.
altExpNames(sce) <- c("ERCC", "Ab")
altExp(sce, "ERCC") <- se1[1:2,]</pre>
```

colLabels

#### Get or set column labels

## Description

Get or set column labels in an instance of a SingleCellExperiment class. Labels are expected to represent information about the biological state of each cell.

## Usage

```
## S4 method for signature 'SingleCellExperiment'
colLabels(x, onAbsence = "none")
## S4 replacement method for signature 'SingleCellExperiment'
```

# colLabels(x, ...) <- value</pre>

#### Arguments

х	A SingleCellExperiment object.
onAbsence	String indicating an additional action to take when labels are absent: nothing ("none"), a warning ("warn") or an error ("error").
	Additional arguments, currently ignored.
value	Any vector-like object of length equal to ncol(object), containing labels for all cells.

#### Details

A frequent task in single-cell data analyses is to label cells with some annotation, e.g., cluster identities, predicted cell type classifications and so on. In a SummarizedExperiment, the colData represents the ideal place for such annotations, which can be easily set and retrieved with standard methods, e.g., x\$label <-my.labels.

That said, it is desirable to have some informal standardization of the name of the column used to store these annotations as this makes it easier to programmatically set sensible defaults for retrieval of the labels in downstream functions. To this end, the colLabels function will get or set labels from the "label" field of the colData. This considers the use case where there is a "primary" set of labels that represents the default grouping of cells in downstream analyses.

To illustrate, let's say we have a downstream function that accepts a SingleCellExperiment object and requires labels. When defining our function, we can set colLabels(x) as the default value for our label argument. This pattern is useful as it accommodates on-the-fly changes to a secondary set of labels in x without requiring the user to run colLabels(x) <-second.labels, while facilitating convenient use of the primary labels by default.

## Combining LEMs

For developers, onAbsence is provided to make it easier to mandate that x actually has labels. This avoids silent NULL values that flow to the rest of the function and make debugging difficult.

## Value

For colLabels, a vector or equivalent is returned containing label assignments for all cells. If no labels are available, a NULL is returned (and/or a warning or error, depending on onAbsence).

For colLabels<-, a modified x is returned with labels in its colData.

## Author(s)

Aaron Lun

### See Also

SingleCellExperiment, for the underlying class definition.

## Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
colLabels(sce) <- sample(LETTERS, ncol(sce), replace=TRUE)
colLabels(sce)
```

Combining LEMs LEM combining methods

#### Description

Methods to combine LinearEmbeddingMatrix objects.

## Usage

```
## S4 method for signature 'LinearEmbeddingMatrix'
rbind(..., deparse.level=1)
```

```
## S4 method for signature 'LinearEmbeddingMatrix'
cbind(..., deparse.level=1)
```

## Arguments

	One or more LinearEmbeddingMatrix objects.
deparse.level	An integer scalar; see ?base::cbind for a description of this argument.

#### Details

For rbind, LinearEmbeddingMatrix objects are combined row-wise, i.e., rows in successive objects are appended to the first object. This corresponds to adding more samples to the first object. Note that featureLoadings and factorData will only be taken from the first element in the list; no checks are performed to determine whether they are consistent or not across objects.

For cbind, LinearEmbeddingMatrix objects are combined columns-wise, i.e., columns in successive objects are appended to the first object. This corresponds to adding more factors to the first object. featureLoadings will also be combined column-wise across objects, provided that the number of features is the same across objects. Similarly, factorData will be combined row-wise across objects.

Combining objects with and without row names will result in the removal of all row names; similarly for column names. Duplicate row names are currently supported by duplicate column names are not, and will be de-duplicated appropriately.

#### Value

A LinearEmbeddingMatrix object containing all rows/columns of the supplied objects.

#### Author(s)

Aaron Lun

## Examples

```
example(LinearEmbeddingMatrix, echo=FALSE) # using the class example
rbind(lem, lem)
cbind(lem, lem)
```

defunct

Defunct methods

## Description

Defunct methods in the **SingleCellExperiment** package.

### Named size factors

The class now only supports one set of size factors, accessible via sizeFactors. This represents a simplification of the class and removes a difficult part of the API (that had to deal with both NULL and strings to specify the size factor set of interest).

#### Spike-ins

It is recommended to handle spike-ins and other "alternative" features via altExps.

#### Author(s)

Aaron Lun

Getter/setter methods LinearEmbeddingMatrix getters/setters

## Description

Getter/setter methods for the LinearEmbeddingMatrix class.

## Usage

```
## S4 method for signature 'LinearEmbeddingMatrix'
sampleFactors(x, withDimnames=TRUE)
## S4 replacement method for signature 'LinearEmbeddingMatrix'
sampleFactors(x) <- value</pre>
## S4 method for signature 'LinearEmbeddingMatrix'
featureLoadings(x, withDimnames=TRUE)
## S4 replacement method for signature 'LinearEmbeddingMatrix'
featureLoadings(x) <- value</pre>
## S4 method for signature 'LinearEmbeddingMatrix'
factorData(x)
## S4 replacement method for signature 'LinearEmbeddingMatrix'
factorData(x) <- value</pre>
## S4 method for signature 'LinearEmbeddingMatrix'
as.matrix(x, ...)
## S4 method for signature 'LinearEmbeddingMatrix'
dim(x)
## S4 method for signature 'LinearEmbeddingMatrix'
dimnames(x)
## S4 replacement method for signature 'LinearEmbeddingMatrix'
dimnames(x) <- value
## S4 method for signature 'LinearEmbeddingMatrix'
x$name
```

## S4 replacement method for signature 'LinearEmbeddingMatrix'
x\$name <- value</pre>

## Arguments

x	A LinearEmbeddingMatrix object.
value	An appropriate value to assign to the relevant slot.
withDimnames	A logical scalar indicating whether dimension names should be attached to the returned object.

name	A string specifying a field of the factorData slot.
	Further arguments, ignored.

## Details

Any value to assign to sampleFactors and featureLoadings should be matrix-like objects, while factorData should be a DataFrame - ee LinearEmbeddingMatrix for details.

The as.matrix method will return the matrix of sample factors, consistent with the fact that the LinearEmbeddingMatrix mimics a sample-factor matrix. However, unlike the sampleFactors method, this is always guaranteed to return an ordinary R matrix, even if an alternative representation was stored in the slot. This ensures consistency with as.matrix methods for other matrix-like S4 classes.

For assignment to dimnames, a list of length 2 should be used containing vectors of row and column names.

## Value

For the getter methods sampleFactors, featureLoadings and factorData, the value of the slot with the same name is returned. For the corresponding setter methods, a LinearEmbeddingMatrix is returned with modifications to the named slot.

For dim, the dimensions of the sampleFactors slot are returned in an integer vector of length 2. For dimnames, a list of length 2 containing the row and column names is returned. For as.matrix, an ordinary matrix derived from sampleFactors is returned.

For \$, the value of the named field of the factorData slot is returned. For \$<-, a LinearEmbeddingMatrix is returned with the modified field in factorData.

#### Author(s)

Keegan Korthauer, Davide Risso and Aaron Lun

## See Also

#### LinearEmbeddingMatrix

#### Examples

example(LinearEmbeddingMatrix, echo=FALSE) # Using the class example

```
sampleFactors(lem)
sampleFactors(lem) <- sampleFactors(lem) * -1</pre>
```

```
featureLoadings(lem)
featureLoadings(lem) <- featureLoadings(lem) * -1</pre>
```

```
factorData(lem)
factorData(lem)$whee <- 1</pre>
```

```
nrow(lem)
ncol(lem)
colnames(lem) <- LETTERS[seq_len(ncol(lem))]
as.matrix(lem)</pre>
```

LinearEmbeddingMatrix LinearEmbeddingMatrix class

## Description

A description of the LinearEmbeddingMatrix class for storing low-dimensional embeddings from linear dimensionality reduction methods.

## Usage

```
LinearEmbeddingMatrix(sampleFactors = matrix(nrow = 0, ncol = 0),
featureLoadings = matrix(nrow = 0, ncol = 0), factorData = NULL,
metadata = list())
```

#### Arguments

sampleFactors	A matrix-like object of sample embeddings, where rows are samples and columns
	are factors.
featureLoadings	6
	A matrix-like object of feature loadings, where rows are features and columns are factors.
factorData	A DataFrame containing factor-level information, with one row per factor.
metadata	An optional list of arbitrary content describing the overall experiment.

#### Details

The LinearEmbeddingMatrix class is a matrix-like object that supports dim, dimnames and as.matrix. It is designed for the storage of results from linear dimensionality reduction methods like principal components analysis (PCA), factor analysis and non-negative matrix factorization.

The sampleFactors slot is intended to store The low-dimensional representation of the samples, such as the principal coordinates from PCA. The feature loadings contributing to each factor are stored in featureLoadings, and should have the same number of columns as sampleFactors. The factorData stores additional factor-level information, such as the percentage of variance explained by each factor, and should have the same number of rows as sampleFactors.

The intended use of this class is to allow PCA and other results to be stored in the reducedDims slot of a SingleCellExperiment object. This means that feature loadings remain attached to the embedding, allowing it to be used in downstream analyses.

#### Value

A LinearEmbeddingMatrix object is returned from the constructor.

## Author(s)

Aaron Lun, Davide Risso and Keegan Korthauer

## Examples

```
lem <- LinearEmbeddingMatrix(matrix(rnorm(1000), ncol=5),
    matrix(runif(20000), ncol=5))
lem
```

Miscellaneous LEM Miscellaneous LEM methods

## Description

Various methods for the LinearEmbeddingMatrix class.

## Usage

```
## S4 method for signature 'LinearEmbeddingMatrix'
show(object)
```

## Arguments

object A LinearEmbeddingMatrix object.

#### Details

The show method will print out information about the data contained in object. This includes the number of samples, the number of factors, the number of genes and the fields available in factorData.

## Value

A message is printed to screen describing the data stored in object.

## Author(s)

Davide Risso

## See Also

LinearEmbeddingMatrix

## Examples

```
example(LinearEmbeddingMatrix, echo=FALSE) # Using the class example
show(lem)
```

reducedDims

Reduced dimensions methods

#### Description

Methods to get or set dimensionality reduction results in a SingleCellExperiment object. These are typically used to store and retrieve low-dimensional representations of single-cell datasets. Each row of a reduced dimension result is expected to correspond to a column of the SingleCellExperiment object.

#### reducedDims

#### Getters

In the following examples, x is a SingleCellExperiment object.

- reducedDim(x, type, withDimnames=TRUE): Retrieves a matrix (or matrix-like object) containing reduced dimension coordinates for cells (rows) and dimensions (columns). type is either a string specifying the name of the dimensionality reduction result in x to retrieve, or a numeric scalar specifying the index of the desired result. If withDimnames=TRUE, row names of the output matrix are replaced with the column names of x.
- reducedDimNames(x): Returns a character vector containing the names of all dimensionality reduction results in x. This is guaranteed to be of the same length as the number of results, though the names may not be unique.
- reducedDims(x, withDimnames=TRUE): Returns a named List of matrices containing one or more dimensionality reduction results. Each result is a matrix (or matrix-like object) with the same number of rows. If withDimnames=TRUE, row names of each matrix are replaced with the column names of x.

## Single-result setter

reducedDim(x,type) <-value will add or replace a dimensionality reduction result in a Single-CellExperiment object x. The value of type determines how the result is added or replaced:

- If type is missing, value is assigned to the first result. If the result already exists, its name is preserved; otherwise it is given a default name "unnamed1".
- If type is a numeric scalar, it must be within the range of existing results, and value will be assigned to the result at that index.
- If type is a string and a result exists with this name, value is assigned to to that result. Otherwise a new result with this name is append to the existing list of results.

value is expected to be a matrix or matrix-like object with number of rows equal to ncol(x). Alternatively, if value is NULL, the result corresponding to type is removed from the object.

## **Other setters**

In the following examples, x is a SingleCellExperiment object.

reducedDims(x) <- value: Replaces all dimensionality reduction results in x with those in value. The latter should be a list-like object containing any number of matrices or matrix-like objects with number of rows equal to ncol(x).

If value is named, those names will be used to name the dimensionality reduction results in x. Otherwise, unnamed results are assigned default names prefixed with "unnamed".

If value is NULL, all dimensionality reduction results in x are removed.

reducedDimNames(x) <- value: Replaces all names for dimensionality reduction results in x with a character vector value. This should be of length equal to the number of results currently in x.

## Author(s)

Aaron Lun and Kevin Rue-Albrecht

#### Examples

```
example(SingleCellExperiment, echo=FALSE)
reducedDim(sce, "PCA")
reducedDim(sce, "tSNE")
reducedDims(sce)
reducedDims(sce, "PCA") <- NULL
reducedDims(sce)
reducedDims(sce) <- SimpleList()
reducedDims(sce)</pre>
```

SCE-assays

Named assay getters and setters

## Description

These are methods for getting or setting assay(sce, i=X,...) where sce is a <u>SingleCellExperiment</u> object and X is the name of the method. For example, counts will get or set X="counts". This provides some convenience for users as well as encouraging standardization of assay names across packages.

## Available methods

In the following code snippets, x is a SingleCellExperiment object, value is a matrix-like object with the same dimensions as x, and ... are further arguments passed to assay (for the getter) or assay <- (for the setter).

- normcounts(x, ...), normcounts(x, ...) <- value: Get or set a matrix of normalized values on the same scale as the original counts. For example, counts divided by cell-specific size factors that are centred at unity.
- $\log counts(x, ...)$ ,  $\log counts(x, ...) <-$  value: Get or set a matrix of log-transformed counts or count-like values. In most cases, this will be defined as log-transformed normcounts, e.g., using log base 2 and a pseudo-count of 1.
- cpm(x, ...), cpm(x, ...) <- value: Get or set a matrix of counts-per-million values. This is the read count for each gene in each cell, divided by the library size of each cell in millions.
- tpm(x, ...), tpm(x, ...) <- value: Get or set a matrix of transcripts-per-million values. This is the number of transcripts for each gene in each cell, divided by the total number of transcripts in that cell (in millions).
- weights(x, ...), weights(x, ...) <- value: Get or set a matrix of weights, e.g., observational weights to be used in differential expression analysis.

## Author(s)

Aaron Lun

#### SCE-combine

#### See Also

assay and assay<-, for the wrapped methods.

#### Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
counts(sce) <- matrix(rnorm(nrow(sce)*ncol(sce)), ncol=ncol(sce))
dim(counts(sce))
# One possible way of computing normalized "counts"
sf <- 2^rnorm(ncol(sce))
sf <- sf/mean(sf)
normcounts(sce) <- t(t(counts(sce))/sf)</pre>
```

```
# One possible way of computing log-counts
logcounts(sce) <- log2(normcounts(sce)+1)
dim(normcounts(sce))
```

```
SCE-combine
```

dim(normcounts(sce))

Combining or subsetting SingleCellExperiment objects

#### Description

An overview of methods to combine multiple SingleCellExperiment objects by row or column, or to subset a SingleCellExperiment by row or column. These methods are useful for ensuring that all data fields remain synchronized when cells or genes are added or removed.

#### Combining

In the following code snippets, ... contains one or more SingleCellExperiment objects.

- rbind(..., deparse.level=1): Returns a SingleCellExperiment where all objects in ... are combined row-wise, i.e., rows in successive objects are appended to the first object. Refer to ?"rbind,SummarizedExperiment-method" for details on how metadata is combined in the output object. Refer to ?rbind for the interpretation of deparse.level. Note that all objects in ... must have the exact same values for reducedDims and altExps. Any sizeFactors should either be NULL or contain the same values across objects.
- cbind(..., deparse.level=1): Returns a SingleCellExperiment where all objects in ... are combined column-wise, i.e., columns in successive objects are appended to the first object.

Each object x in ... must have the same values of reducedDimNames(x) (though they can be unordered). Dimensionality reduction results with the same name across objects will be combined row-wise to create the corresponding entry in the output object.

Each object x in ... must have the same values of altExpNames(x) (though they can be unordered). Alternative Experiments with the same name across objects will be combined column-wise to create the corresponding entry in the output object.

sizeFactors should be either set to NULL in all objects, or set to a numeric vector in all objects.

Refer to ?"cbind, SummarizedExperiment-method" for details on how metadata is combined in the output object. Refer to ?cbind for the interpretation of deparse.level.

#### Subsetting

In the following code snippets, x is a SingleCellExperiment object.

x[i, j, ..., drop=TRUE]: Returns a SingleCellExperiment containing the specified rows i and columns j.

i and j can be a logical, integer or character vector of subscripts, indicating the rows and columns respectively to retain. Either can be missing, in which case subsetting is only performed in the specified dimension. If both are missing, no subsetting is performed. Arguments in ... and drop are passed to to [,SummarizedExperiment-method.

- x[i, j, ...] <- value: Replaces all data for rows i and columns j with the corresponding fields in a SingleCellExperiment value.

i and j can be a logical, integer or character vector of subscripts, indicating the rows and columns respectively to replace. Either can be missing, in which case replacement is only performed in the specified dimension. If both are missing, x is replaced entirely with value.

If j is specified, value is expected to have the same name and order of reducedDimNames and altExpNames as x. If sizeFactors is set for x, it should also be set for value.

Arguments in . . . are passed to the corresponding SummarizedExperiment method.

## Author(s)

Aaron Lun

#### Examples

example(SingleCellExperiment, echo=FALSE) # using the class example

```
# Combining:
rbind(sce, sce)
cbind(sce, sce)
# Subsetting:
sce[1:10,]
sce[1:10,]
sce[1:5]
sce2 <- sce
sce2[1:10,] <- sce[11:20,]
# Can also use subset()
sce$WHEE <- sample(LETTERS, ncol(sce), replace=TRUE)
subset(sce, , WHEE=="A")
# Can also use split()
split(sce, sample(LETTERS, nrow(sce), replace=TRUE))
```

SCE-internals Internal SingleCellExperiment functions

## Description

Methods to get or set internal fields from the SingleCellExperiment class. This functions are intended for package developers who want to add protected fields to a SingleCellExperiment. They should *not* be used by ordinary users of the **SingleCellExperiment** package.

#### SCE-internals

#### Getters

In the following code snippets, x is a SingleCellExperiment.

- int\_elementMetadata(x): Returns a DataFrame of internal row metadata, with number of rows
  equal to nrow(x). This is analogous to the user-visible colData.
- int\_colData(x): Returns a DataFrame of internal column metadata, with number of rows equal to ncol(x). This is analogous to the user-visible rowData.
- int\_metadata(x): Returns a list of internal metadata, analogous to the user-visible metadata.

It may occasionally be useful to return both the visible and the internal colData in a single DataFrame. This is facilitated by the following methods:

- rowData(x, ..., internal=FALSE): Returns a DataFrame of the user-visible row metadata. If internal=TRUE, the internal row metadata is added column-wise to the user-visible metadata. A warning is emitted if the user-visible metadata column names overlap with the internal fields. Any arguments in ... are passed to rowData, SummarizedExperiment-method.
- colData(x, ..., internal=FALSE): Returns a DataFrame of the user-visible column metadata. If internal=TRUE, the internal column metadata is added column-wise to the user-visible metadata. A warning is emitted if the user-visible metadata column names overlap with the internal fields. Any arguments in ... are passed to colData,SummarizedExperiment-method.

#### Setters

In the following code snippets, x is a SingleCellExperiment.

- int\_elementMetadata(x) <- value: Replaces the internal row metadata with value, a DataFrame
  with number of rows equal to nrow(x). This is analogous to the user-visible colData<-.</pre>
- int\_colData(x) <- value: Replaces the internal column metadata with value, a DataFrame with
   number of rows equal to ncol(x). This is analogous to the user-visible rowData<-.</pre>
- int\_metadata(x) <- value: Replaces the internal metadata with value, analogous to the uservisible metadata<-.</pre>

## Comments

The internal metadata fields allow easy and extensible storage of additional elements that are parallel to the rows or columns of a SingleCellExperiment class. This avoids the need to specify new slots and adjust the subsetting/combining code for a new data element. For example, altExps and reducedDims are implemented as fields in the internal column metadata.

That these elements are internal is important as this ensures that the implementation details are abstracted away. Any user interaction with these internal fields should be done via the designated getter and setter methods, e.g., reducedDim and friends for retrieving or modifying reduced dimensions. This provides developers with more freedom to change the internal representation without breaking user code.

Package developers intending to use these methods to store their own content should read the development vignette for guidance.

#### Author(s)

Aaron Lun

## See Also

colData, rowData and metadata for the user-visible equivalents.

## Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
int_metadata(sce)$whee <- 1</pre>
```

SCE-miscellaneous Miscellaneous SingleCellExperiment methods

#### Description

Miscellaneous methods for the SingleCellExperiment class that do not fit in any other documentation category.

#### Available methods

In the following code snippets, x and object are SingleCellExperiment objects.

show(object): Print a message to screen describing the contents of object.

- objectVersion(x): Return the version of the package with which x was constructed.
- sizeFactors(object): Return a numeric vector of size factors of length equal to ncol(object).
  If no size factors are available in object, return NULL instead.
- sizeFactors(object) <- value: Replace the size factors with value, usually expected to be a
  numeric vector or vector-like object. Alternatively, value can be NULL in which case any size
  factors in object are removed.</pre>

## Author(s)

Aaron Lun

## See Also

updateObject, where objectVersion is used.

#### Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
```

show(sce)

```
objectVersion(sce)
```

```
# Setting/getting size factors.
sizeFactors(sce) <- runif(ncol(sce))
sizeFactors(sce)</pre>
```

```
sizeFactors(sce) <- NULL
sizeFactors(sce)</pre>
```

SingleCellExperiment-class

The SingleCellExperiment class

## Description

The SingleCellExperiment class is designed to represent single-cell sequencing data. It inherits from the RangedSummarizedExperiment class and is used in the same manner. In addition, the class supports storage of dimensionality reduction results (e.g., PCA, t-SNE) via reducedDims, and storage of alternative feature types (e.g., spike-ins) via altExps.

## Usage

```
SingleCellExperiment(..., reducedDims = list(), altExps = list())
```

#### Arguments

	Arguments passed to the SummarizedExperiment constructor to fill the slots of the base class.
reducedDims	A list of any number of matrix-like objects containing dimensionality reduc- tion results, each of which should have the same number of rows as the output SingleCellExperiment object.
altExps	A list of any number of SummarizedExperiment objects containing alternative Experiments, each of which should have the same number of columns as the output SingleCellExperiment object.

#### Details

In this class, rows should represent genomic features (e.g., genes) while columns represent samples generated from single cells. As with any SummarizedExperiment derivative, different quantifications (e.g., counts, CPMs, log-expression) can be stored simultaneously in the assays slot, and row and column metadata can be attached using rowData and colData, respectively.

The reducedDims and altExps concepts are the main extensions of the SingleCellExperiment class. This enables formalized representation of data structures that are commonly encountered during single-cell data analysis. Readers are referred to the specific documentation pages for more details.

A SingleCellExperiment can also be created by coercing from a SummarizedExperiment or Ranged-SummarizedExperiment instance.

## Value

A SingleCellExperiment object.

## Author(s)

Aaron Lun and Davide Risso

## See Also

reducedDims, for representation of dimensionality reduction results.

altExps, for representation of data for alternative feature sets.

sizeFactors, to store size factors for normalization.

?"SCE-combine", to combine or subset a SingleCellExperiment object.

?"SCE-internals", for developer use.

## Examples

```
ncells <- 100
u <- matrix(rpois(20000, 5), ncol=ncells)
v <- log2(u + 1)
pca <- matrix(runif(ncells*5), ncells)
tsne <- matrix(rnorm(ncells*2), ncells)
sce <- SingleCellExperiment(assays=list(counts=u, logcounts=v),
reducedDims=SimpleList(PCA=pca, tSNE=tsne))
sce
## coercion from SummarizedExperiment
se <- SummarizedExperiment(assays=list(counts=u, logcounts=v))
as(se, "SingleCellExperiment")
```

## Description

Gets or sets the size factors for all cells in a SingleCellExperiment object.

## Usage

```
## S4 method for signature 'SingleCellExperiment'
sizeFactors(object, onAbsence = "none")
```

```
## S4 replacement method for signature 'SingleCellExperiment'
sizeFactors(object, ...) <- value</pre>
```

## Arguments

object	A SingleCellExperiment object.
onAbsence	String indicating an additional action to take when size factors are absent: noth- ing ("none"), a warning ("warn") or an error ("error").
	Additional arguments, currently ignored.
value	A numeric vector of length equal to ncol(object), containing size factors for all cells.

#### splitAltExps

#### Details

A size factor is a scaling factor used to divide the raw counts of a particular cell to obtain normalized expression values, thus allowing downstream comparisons between cells that are not affected by differences in library size or total RNA content. The sizeFactors methods can be used to get or set size factors for all cells in a SingleCellExperiment object.

When setting size factors, the values are stored in the colData as the sizeFactors field. This name is chosen for general consistency with other packages (e.g., **DESeq2**) and to allow the size factors to be easily extracted from the colData for use as covariates.

For developers, onAbsence is provided to make it easier to mandate that object has size factors. This avoids silent NULL values that flow to the rest of the function and make debugging difficult.

#### Value

For sizeFactors, a numeric vector is returned containing size factors for all cells. If no size factors are available, a NULL is returned (and/or a warning or error, depending on onAbsence).

For sizeFactors<-, a modified object is returned with size factors in its colData.

## Author(s)

Aaron Lun

## See Also

SingleCellExperiment, for the underlying class definition.

librarySizeFactors from the **scater** package or computeSumFactors from the **scran** package, as examples of functions that compute the size factors.

#### Examples

```
example(SingleCellExperiment, echo=FALSE) # Using the class example
sizeFactors(sce) <- runif(ncol(sce))
sizeFactors(sce)
```

splitAltExps

Split off alternative features

## Description

Split a SingleCellExperiment based on the feature type, creating alternative Experiments to hold features that are not in the majority set.

#### Usage

splitAltExps(x, f, ref = NULL)

#### Arguments

Х	A SingleCellExperiment object.
f	A character vector or factor of length equal to nrow(x), specifying the feature
	type of each row.
ref	String indicating which level of f should be treated as the main set.

## Details

This function provides a convenient way to create a SingleCellExperiment with alternative Experiments. For example, a SingleCellExperiment with rows corresponding to all features can be quickly split into endogenous genes (main) and other alternative features like spike-in transcripts and antibody tags.

By default, the most frequent level of f is treated as the ref if the latter is not specified.

## Value

A SingleCellExperiment where each row corresponds to a feature in the main set. Each other feature type is stored as an alternative Experiment, accessible by altExp.

## Author(s)

Aaron Lun

## See Also

altExp, to access and manipulate the alternative Experiment fields.

#### Examples

```
example(SingleCellExperiment, echo=FALSE)
feat.type <- sample(c("endog", "ERCC", "CITE"), nrow(sce),
    replace=TRUE, p=c(0.8, 0.1, 0.1))
sce2 <- splitAltExps(sce, feat.type)
sce2</pre>
```

Subsetting LEMs LEM subsetting methods

## Description

Methods to subset LinearEmbeddingMatrix objects.

#### Usage

```
## S4 method for signature 'LinearEmbeddingMatrix,ANY,ANY'
x[i, j, ..., drop=TRUE]
## S4 replacement method for signature
## 'LinearEmbeddingMatrix,ANY,ANY,LinearEmbeddingMatrix'
x[i, j] <- value</pre>
```

## Arguments

х	A LinearEmbeddingMatrix object.
i, j	A vector of logical or integer subscripts, indicating the rows and columns to be subsetted for i and j, respectively.
	Extra arguments that are ignored.
drop	A logical scalar indicating whether the result should be coerced to the lowest possible dimension.
value	A LinearEmbeddingMatrix object with number of rows equal to length of i (or that of x, if i is not specified). The number of columns must be equal to the length of j (or number of columns in x, if j is not specified).

## Details

Subsetting yields a LinearEmbeddingMatrix object containing the specified rows (samples) and columns (factors). If column subsetting is performed, values of featureLoadings and factorData will be modified to retain only the selected factors.

If drop=TRUE and the subsetting would produce dimensions of length 1, those dimensions are dropped and a vector is returned directly from sampleFactors. This mimics the expected behaviour from a matrix-like object. Users should set drop=FALSE to ensure that a LinearEmbeddingMatrix is returned.

For subset replacement, if neither i or j are set, x will be effectively replaced by value. However, row and column names will *not* change, consistent with replacement in ordinary matrices.

## Value

For [, a subsetted LinearEmbeddingMatrix object is returned.

For [<-, a modified LinearEmbeddingMatrix object is returned.

## Author(s)

Aaron Lun

## See Also

LinearEmbeddingMatrix-class

## Examples

example(LinearEmbeddingMatrix, echo=FALSE) # using the class example

lem[1:10,]
lem[,1:5]
lem2 <- lem</pre>

lem2[1:10,] <- lem[11:20,]</pre>

swapAltExp

## Description

Swap the main Experiment for an alternative Experiment in a SingleCellExperiment object.

## Usage

swapAltExp(x, name, saved = NULL, withColData = TRUE)

#### Arguments

x	A SingleCellExperiment object.
name	String or integer scalar specifying the alternative Experiment to use to replace the main Experiment.
saved	String specifying the name to use to save the original x as an alternative experi- ment in the output. If NULL, the original is not saved.
withColData	Logical scalar specifying whether the column metadata of x should be preserved in the output.

### Details

During the course of an analysis, we may need to perform operations on each of the alternative Experiments in turn. This would require us to repeatedly call altExp(x,name) prior to running downstream functions on those Experiments. In such cases, it may be more convenient to switch the main Experiment with the desired alternative Experiments, allowing a particular section of the analysis to be performed on the latter by default.

For example, the initial phases of the analysis might use the entire set of features. At some point, we might want to focus only on a subset of features of interest, but we do not want to discard the rest of the features. This can be achieved by storing the subset as an alternative Experiment and swapping it with the main Experiment, as shown in the Examples below.

## Value

A SingleCellExperiment derived from altExp(x, name). This contains all alternative Experiments in altExps(x), with an additional entry containing x if saved is specified. If withColData=TRUE, the column metadata is set to colData(x).

## Author(s)

Aaron Lun

## See Also

altExps, for a description of the alternative Experiment concept.

#### updateObject

#### Examples

```
example(SingleCellExperiment, echo=FALSE) # using the class example
# Let's say we defined a subset of genes of interest.
# We can save the feature set as its own altExp.
hvgs <- 1:10
altExp(sce, "subset") <- sce[hvgs,]
# At some point, we want to do our analysis on the HVGs only,
# but we want to hold onto the other features for later reference.
sce <- swapAltExp(sce, name="subset", saved="all")
sce
# Once we're done, it is straightforward to switch back.
swapAltExp(sce, "all")
```

updateObject

Update a SingleCellExperiment object

## Description

Update SingleCellExperiment objects to the latest version of the class structure. This is usually called by methods in the SingleCellExperiment package rather than by users or downstream packages.

## Usage

## S4 method for signature 'SingleCellExperiment'
updateObject(object, ..., verbose = FALSE)

## Arguments

object	A old SingleCellExperiment object.
	Additional arguments that are ignored.
verbose	Logical scalar indicating whether a message should be emitted as the object is updated.

## Details

This function updates the SingleCellExperiment to match changes in the internal class representation. Changes are as follows:

- Objects created before 1.7.1 are modified to include altExps and reducedDims fields in their internal column metadata. Reduced dimension results previously in the reducedDims slot are transferred to the reducedDims field.

## Value

An updated version of object.

## Author(s)

Aaron Lun

## See Also

objectVersion, which is used to determine if the object is up-to-date.

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