# Package 'sparklyr'

January 23, 2018

```
Type Package
Title R Interface to Apache Spark
Version 0.7.0
Maintainer Javier Luraschi < javier@rstudio.com>
Description R interface to Apache Spark, a fast and general engine for big data
      processing, see <a href="http://spark.apache.org">http://spark.apache.org</a>. This package supports connecting to
      local and remote Apache Spark clusters, provides a 'dplyr' compatible back-end,
      and provides an interface to Spark's built-in machine learning algorithms.
License Apache License 2.0 | file LICENSE
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BugReports https://github.com/rstudio/sparklyr/issues
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tbl_change_db	
tbl_uncache	

checkpoint\_directory Set/Get Spark checkpoint directory

## **Description**

Set/Get Spark checkpoint directory

## Usage

```
spark_set_checkpoint_dir(sc, dir)
spark_get_checkpoint_dir(sc)
```

## **Arguments**

sc A spark\_connection.

dir checkpoint directory, must be HDFS path of running on cluster

compile\_package\_jars Compile Scala sources into a Java Archive (jar)

## Description

Compile the scala source files contained within an R package into a Java Archive (jar) file that can be loaded and used within a Spark environment.

## Usage

```
compile_package_jars(..., spec = NULL)
```

## **Arguments**

spec

... Optional compilation specifications, as generated by spark\_compilation\_spec. When no arguments are passed, spark\_default\_compilation\_spec is used instead.

An optional list of compilation specifications. When set, this option takes prece-

dence over arguments passed to . . . .

connection\_config

Read configuration values for a connection

## **Description**

Read configuration values for a connection

## Usage

```
connection_config(sc, prefix, not_prefix = list())
```

## **Arguments**

sc spark\_connection

prefix Prefix to read parameters for (e.g. spark.context., spark.sql., etc.)

not\_prefix Prefix to not include.

## Value

Named list of config parameters (note that if a prefix was specified then the names will not include the prefix)

```
copy_to.spark_connection
```

Copy an R Data Frame to Spark

## **Description**

Copy an R data.frame to Spark, and return a reference to the generated Spark DataFrame as a tbl\_spark. The returned object will act as a dplyr-compatible interface to the underlying Spark table.

```
## S3 method for class 'spark_connection'
copy_to(dest, df,
  name = spark_table_name(substitute(df)), overwrite = FALSE,
  memory = TRUE, repartition = 0L, ...)
```

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### **Arguments**

dest A spark\_connection.

df An R data.frame.

name The name to assign to the copied table in Spark.

overwrite Boolean; overwrite a pre-existing table with the name name if one already exists?

memory Boolean; should the table be cached into memory?

repartition The number of partitions to use when distributing the table across the Spark

cluster. The default (0) can be used to avoid partitioning.

. . . Optional arguments; currently unused.

### Value

A tbl\_spark, representing a dplyr-compatible interface to a Spark DataFrame.

## Description

compile\_package\_jars requires several versions of the scala compiler to work, this is to match Spark scala versions. To help setup your environment, this function will download the required compilers under the default search path.

## Usage

```
download_scalac(dest_path = NULL)
```

## **Arguments**

dest\_path The destination path where scalac will be downloaded to.

## **Details**

See find\_scalac for a list of paths searched and used by this function to install the required compilers.

find\_scalac

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Enforce Specific Structure for R Objects

## **Description**

These routines are useful when preparing to pass objects to a Spark routine, as it is often necessary to ensure certain parameters are scalar integers, or scalar doubles, and so on.

## Usage

```
ensure_scalar_integer(object, allow.na = FALSE, allow.null = FALSE,
  default = NULL)

ensure_scalar_double(object, allow.na = FALSE, allow.null = FALSE,
  default = NULL)

ensure_scalar_boolean(object, allow.na = FALSE, allow.null = FALSE,
  default = NULL)

ensure_scalar_character(object, allow.na = FALSE, allow.null = FALSE,
  default = NULL)
```

### **Arguments**

object	An R object.
allow.na	Are NA values permitted for this object?
allow.null	Are NULL values permitted for this object?
default	If object is NULL, what value should be used in its place? If default is specified, allow.null is ignored (and assumed to be TRUE).

find_scalac	Discover the Scala Compiler	

## **Description**

Find the scalac compiler for a particular version of scala, by scanning some common directories containing scala installations.

```
find_scalac(version, locations = NULL)
```

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## **Arguments**

version	The scala version to search for. Versions of the form major.minor will be
	matched against the scalac installation with version major.minor.patch; if

multiple compilers are discovered the most recent one will be used.

locations Additional locations to scan. By default, the directories /opt/scala and /usr/local/scala

will be scanned.

ft_binarizer	$Feature\ Transformation-Binarizer\ (Transformer)$

## **Description**

Apply thresholding to a column, such that values less than or equal to the threshold are assigned the value 0.0, and values greater than the threshold are assigned the value 1.0. Column output is numeric for compatibility with other modeling functions.

### Usage

```
ft_binarizer(x, input_col, output_col, threshold = 0,
  uid = random_string("binarizer_"), ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
threshold	Threshold used to binarize continuous features.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_bucketizer

Feature Transformation – Bucketizer (Transformer)

## **Description**

Similar to R's cut function, this transforms a numeric column into a discretized column, with breaks specified through the splits parameter.

## Usage

```
ft_bucketizer(x, input_col, output_col, splits, handle_invalid = "error",
   uid = random_string("bucketizer_"), ...)
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

input\_col The name of the input column.

output\_col The name of the output column.

splits A numeric vector of cutpoints, indicating the bucket boundaries.

handle\_invalid (Spark 2.1.0+) Param for how to handle invalid entries. Options are 'skip' (filter out rows with invalid values), 'error' (throw an error), or 'keep' (keep invalid values in a special additional bucket). Default: "error"

uid A character string used to uniquely identify the feature transformer.

Optional arguments; currently unused.

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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## See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_chisq\_selector

Feature Tranformation – ChiSqSelector (Estimator)

## **Description**

Chi-Squared feature selection, which selects categorical features to use for predicting a categorical label

## Usage

```
ft_chisq_selector(x, features_col, output_col, label_col,
  selector_type = "numTopFeatures", fdr = 0.05, fpr = 0.05, fwe = 0.05,
  num_top_features = 50L, percentile = 0.1, dataset = NULL,
  uid = random_string("chisq_selector_"), ...)
```

x	A spark_connection, ml_pipeline, or a tbl_spark.
features_col	Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft_r_formula.
output_col	The name of the output column.
label_col	Label column name. The column should be a numeric column. Usually this column is output by ft_r_formula.
selector_type	(Spark 2.1.0+) The selector type of the ChisqSelector. Supported options: "num-TopFeatures" (default), "percentile", "fpr", "fdr", "fwe".
fdr	(Spark 2.2.0+) The upper bound of the expected false discovery rate. Only applicable when selector_type = "fdr". Default value is 0.05.
fpr	(Spark 2.1.0+) The highest p-value for features to be kept. Only applicable when selector_type= "fpr". Default value is 0.05.
fwe	(Spark 2.2.0+) The upper bound of the expected family-wise error rate. Only applicable when selector_type = "fwe". Default value is 0.05.

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num\_top\_features

Number of features that selector will select, ordered by ascending p-value. If the number of features is less than num\_top\_features, then this will select all features. Only applicable when selector\_type = "numTopFeatures". The default

value of num\_top\_features is 50.

percentile (Spark 2.1.0+) Percentile of features that selector will select, ordered by statis-

tics value descending. Only applicable when selector\_type = "percentile". De-

fault value is 0.1.

dataset (Optional) A tbl\_spark. If provided, eagerly fit the (estimator) feature "trans-

former" against dataset. See details.

uid A character string used to uniquely identify the feature transformer.

... Optional arguments; currently unused.

### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

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ft\_count\_vectorizer Feature Tranformation - CountVectorizer (Estimator)

## Description

Extracts a vocabulary from document collections.

## Usage

```
ft_count_vectorizer(x, input_col, output_col, binary = FALSE, min_df = 1,
  min_tf = 1, vocab_size = as.integer(2^18), dataset = NULL,
  uid = random_string("count_vectorizer_"), ...)
```

## **Arguments**

Χ	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
binary	Binary toggle to control the output vector values. If TRUE, all nonzero counts (after min_tf filter applied) are set to 1. This is useful for discrete probabilistic models that model binary events rather than integer counts. Default: FALSE
min_df	Specifies the minimum number of different documents a term must appear in to be included in the vocabulary. If this is an integer greater than or equal to 1, this specifies the number of documents the term must appear in; if this is a double in $[0,1)$ , then this specifies the fraction of documents. Default: 1.
min_tf	Filter to ignore rare words in a document. For each document, terms with frequency/count less than the given threshold are ignored. If this is an integer greater than or equal to 1, then this specifies a count (of times the term must appear in the document); if this is a double in [0,1), then this specifies a fraction (out of the document's token count). Default: 1.
vocab_size	Build a vocabulary that only considers the top vocab_size terms ordered by term frequency across the corpus. Default: 2^18.
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

## **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

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### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_dct Feature Transformation - Discrete Cosine Transform (DCT) (Transformer)

## **Description**

A feature transformer that takes the 1D discrete cosine transform of a real vector. No zero padding is performed on the input vector. It returns a real vector of the same length representing the DCT. The return vector is scaled such that the transform matrix is unitary (aka scaled DCT-II).

## Usage

```
ft_dct(x, input_col, output_col, inverse = FALSE,
    uid = random_string("dct_"), ...)

ft_discrete_cosine_transform(x, input_col, output_col, inverse = FALSE,
    uid = random_string("dct_"), ...)
```

### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.
input\_col The name of the input column.
output\_col The name of the output column.

inverse	Indicates whether to perform the inverse DCT (TRUE) or forward DCT (FALSE).
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### **Details**

ft\_discrete\_cosine\_transform() is an alias for ft\_dct for backwards compatibility.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

```
ft\_elementwise\_product
```

Feature Transformation – ElementwiseProduct (Transformer)

## **Description**

Outputs the Hadamard product (i.e., the element-wise product) of each input vector with a provided "weight" vector. In other words, it scales each column of the dataset by a scalar multiplier.

```
ft_elementwise_product(x, input_col, output_col, scaling_vec,
   uid = random_string("elementwise_product_"), ...)
```

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## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
scaling_vec	the vector to multiply with input vectors
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

## See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

```
ft_hashing_tf Feature Transformation - HashingTF (Transformer)
```

## Description

Maps a sequence of terms to their term frequencies using the hashing trick.

```
ft_hashing_tf(x, input_col, output_col, binary = FALSE,
  num_features = as.integer(2^18), uid = random_string("hashing_tf_"), ...)
```

ft\_idf

## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
binary	Binary toggle to control term frequency counts. If true, all non-zero counts are set to 1. This is useful for discrete probabilistic models that model binary events rather than integer counts. (default = FALSE)
num_features	Number of features. Should be greater than 0. (default = $2^18$ )
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

## See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

ft\_idf

Feature Tranformation – IDF (Estimator)

## **Description**

Compute the Inverse Document Frequency (IDF) given a collection of documents.

```
ft_idf(x, input_col, output_col, min_doc_freq = 0L, dataset = NULL,
    uid = random_string("idf_"), ...)
```

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### **Arguments**

A spark\_connection, ml\_pipeline, or a tbl\_spark.

Input\_col The name of the input column.

output\_col The name of the output column.

min\_doc\_freq The minimum number of documents in which a term should appear. Default: 0

dataset (Optional) A tbl\_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.

uid A character string used to uniquely identify the feature transformer.

Optional arguments; currently unused.

#### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_imputer 19

ft_imputer	Feature Transformation – Imputer (Estimator)	

## **Description**

Imputation estimator for completing missing values, either using the mean or the median of the columns in which the missing values are located. The input columns should be of numeric type. This function requires Spark 2.2.0+.

## Usage

```
ft_imputer(x, input_cols, output_cols, missing_value = NULL,
    strategy = "mean", dataset = NULL, uid = random_string("imputer_"), ...)
```

## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_cols	The names of the input columns
output_cols	The names of the output columns.
missing_value	The placeholder for the missing values. All occurrences of missing_value will be imputed. Note that null values are always treated as missing.
strategy	The imputation strategy. Currently only "mean" and "median" are supported. If "mean", then replace missing values using the mean value of the feature. If "median", then replace missing values using the approximate median value of the feature. Default: mean
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

## **Details**

When dataset is provided for an estimator transformer, the function internally calls  $ml_fit()$  against dataset. Hence, the methods for  $spark_connection$  and  $ml_pipeline$  will then return a  $ml_transformer$  and a  $ml_pipeline$  with a  $ml_transformer$  appended, respectively. When x is a  $tbl_spark$ , the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

20 ft\_index\_to\_string

### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_index\_to\_string Feature Transformation - IndexToString (Transformer)

## Description

A Transformer that maps a column of indices back to a new column of corresponding string values. The index-string mapping is either from the ML attributes of the input column, or from user-supplied labels (which take precedence over ML attributes). This function is the inverse of ft\_string\_indexer.

## Usage

```
ft_index_to_string(x, input_col, output_col, labels = NULL,
    uid = random_string("index_to_string_"), ...)
```

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
labels	Optional param for array of labels specifying index-string mapping.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

ft\_interaction 21

### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

## See Also

See <a href="http://spark.apache.org/docs/latest/ml-features.html">http://spark.apache.org/docs/latest/ml-features.html</a> for more information on the set of transformations available for DataFrame columns in Spark.

```
ft_string_indexer
```

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_interaction

Feature Transformation – Interaction (Transformer)

## Description

Implements the feature interaction transform. This transformer takes in Double and Vector type columns and outputs a flattened vector of their feature interactions. To handle interaction, we first one-hot encode any nominal features. Then, a vector of the feature cross-products is produced.

## Usage

```
ft_interaction(x, input_cols, output_col, uid = random_string("interaction_"),
    ...)
```

X	$A \ spark\_connection,  ml\_pipeline,  or  a   tbl\_spark.$
input_cols	The names of the input columns
output_col	The name of the output column.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

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### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

ft 1sh

Feature Tranformation – LSH (Estimator)

### Description

Locality Sensitive Hashing functions for Euclidean distance (Bucketed Random Projection) and Jaccard distance (MinHash).

### Usage

```
ft_bucketed_random_projection_lsh(x, input_col, output_col, bucket_length,
  num_hash_tables = 1L, seed = NULL, dataset = NULL,
  uid = random_string("bucketed_random_projection_lsh_"), ...)

ft_minhash_lsh(x, input_col, output_col, num_hash_tables = 1L, seed = NULL,
  dataset = NULL, uid = random_string("minhash_lsh_"), ...)
```

```
A spark_connection, ml_pipeline, or a tbl_spark.
input_col
The name of the input column.
output_col
The name of the output column.
```

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bucket\_length The length of each hash bucket, a larger bucket lowers the false negative rate. The number of buckets will be (max L2 norm of input vectors) / bucketLength.

num\_hash\_tables

Number of hash tables used in LSH OR-amplification. LSH OR-amplification can be used to reduce the false negative rate. Higher values for this param lead to a reduced false negative rate, at the expense of added computational complexity.

seed

A random seed. Set this value if you need your results to be reproducible across repeated calls.

(Optional) A tbl\_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.

uid

A character string used to uniquely identify the feature transformer.

#### **Details**

. . .

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

Optional arguments; currently unused.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

ft 1sh utils

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

24 ft\_max\_abs\_scaler

ft_lsh_utils Utility functions for LSH models
-----------------------------------------------

## **Description**

Utility functions for LSH models

## Usage

```
ml_approx_nearest_neighbors(model, dataset, key, num_nearest_neighbors,
    dist_col = "distCol")

ml_approx_similarity_join(model, dataset_a, dataset_b, threshold,
    dist_col = "distCol")
```

## **Arguments**

dist\_col

model	$A\ fitted\ LSH\ model, returned\ by\ either\ ft\_minhash\_lsh()\ or\ ft\_bucketed\_random\_projection\_lsh()$		
dataset	The dataset to search for nearest neighbors of the key.		
key	Feature vector representing the item to search for.		
num_nearest_neighbors			
	The maximum number of nearest neighbors.		

Output column for storing the distance between each result row and the key.

dataset\_a One of the datasets to join.

dataset\_b Another dataset to join.

threshold The threshold for the distance of row pairs.

ft_max_abs_scaler	Feature Tranformation – MaxAbsScaler (Estimator)	

## **Description**

Rescale each feature individually to range [-1, 1] by dividing through the largest maximum absolute value in each feature. It does not shift/center the data, and thus does not destroy any sparsity.

```
ft_max_abs_scaler(x, input_col, output_col, dataset = NULL,
    uid = random_string("max_abs_scaler_"), ...)
```

ft\_max\_abs\_scaler 25

## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
•••	Optional arguments; currently unused.

#### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

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ft_min_max_scaler Feature Tranformation - MinMaxScaler (Estimator)	
--------------------------------------------------------------------	--

## **Description**

Rescale each feature individually to a common range [min, max] linearly using column summary statistics, which is also known as min-max normalization or Rescaling

### Usage

```
ft_min_max_scaler(x, input_col, output_col, min = 0, max = 1,
  dataset = NULL, uid = random_string("min_max_scaler_"), ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
min	Lower bound after transformation, shared by all features Default: 0.0
max	Upper bound after transformation, shared by all features Default: 1.0
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

## **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_ngram

Feature Tranformation – NGram (Transformer)

## **Description**

A feature transformer that converts the input array of strings into an array of n-grams. Null values in the input array are ignored. It returns an array of n-grams where each n-gram is represented by a space-separated string of words.

### Usage

```
ft_ngram(x, input_col, output_col, n = 2L, uid = random_string("ngram_"),
    ...)
```

## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
n	Minimum n-gram length, greater than or equal to 1. Default: 2, bigram features
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### **Details**

When the input is empty, an empty array is returned. When the input array length is less than n (number of elements per n-gram), no n-grams are returned.

## Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

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• ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.

• tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_normalizer

Feature Transformation – Normalizer (Transformer)

## **Description**

Normalize a vector to have unit norm using the given p-norm.

## Usage

```
ft_normalizer(x, input_col, output_col, p = 2,
  uid = random_string("normalizer_"), ...)
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.
input\_col The name of the input column.
output\_col The name of the output column.
p Normalization in L^p space. Must be >= 1. Defaults to 2.
uid A character string used to uniquely identify the feature transformer.
... Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

ft\_one\_hot\_encoder 29

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_one\_hot\_encoder

Feature Transformation – OneHotEncoder (Transformer)

## **Description**

One-hot encoding maps a column of label indices to a column of binary vectors, with at most a single one-value. This encoding allows algorithms which expect continuous features, such as Logistic Regression, to use categorical features. Typically, used with ft\_string\_indexer() to index a column first.

### Usage

```
ft_one_hot_encoder(x, input_col, output_col, drop_last = TRUE,
    uid = random_string("one_hot_encoder_"), ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
drop_last	Whether to drop the last category. Defaults to TRUE.
uid	A character string used to uniquely identify the feature transformer.
•••	Optional arguments; currently unused.

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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## See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

ft\_pca

Feature Tranformation – PCA (Estimator)

## **Description**

PCA trains a model to project vectors to a lower dimensional space of the top k principal components.

## Usage

```
ft_pca(x, input_col, output_col, k, dataset = NULL,
    uid = random_string("pca_"), ...)
ml_pca(x, features = tbl_vars(x), k = length(features), pc_prefix = "PC",
    ...)
```

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
k	The number of principal components
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.
features	The columns to use in the principal components analysis. Defaults to all columns in x.
pc_prefix	Length-one character vector used to prepend names of components.

### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a  $ml_estimator$ , and, in the case where x is a  $tbl_spark$ , the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

ml\_pca() is a wrapper around ft\_pca() that returns a ml\_model.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See <a href="http://spark.apache.org/docs/latest/ml-features.html">http://spark.apache.org/docs/latest/ml-features.html</a> for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_polynomial\_expansion

Feature Transformation – PolynomialExpansion (Transformer)

## **Description**

Perform feature expansion in a polynomial space. E.g. take a 2-variable feature vector as an example: (x, y), if we want to expand it with degree 2, then we get (x, x \* x, y, x \* y, y \* y).

## Usage

```
ft_polynomial_expansion(x, input_col, output_col, degree = 2L,
   uid = random_string("polynomial_expansion_"), ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
degree	The polynomial degree to expand, which should be greater than equal to 1. A value of 1 means no expansion. Default: 2
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

```
ft_quantile_discretizer
```

Feature Transformation – QuantileDiscretizer (Estimator)

## **Description**

ft\_quantile\_discretizer takes a column with continuous features and outputs a column with binned categorical features. The number of bins can be set using the num\_buckets parameter. It is possible that the number of buckets used will be smaller than this value, for example, if there are too few distinct values of the input to create enough distinct quantiles.

## Usage

```
ft_quantile_discretizer(x, input_col, output_col, handle_invalid = "error",
  num_buckets = 2L, relative_error = 0.001, dataset = NULL,
  uid = random_string("quantile_discretizer_"), ...)
```

### **Arguments**

х	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
handle_invalid	(Spark 2.1.0+) Param for how to handle invalid entries. Options are 'skip' (filter out rows with invalid values), 'error' (throw an error), or 'keep' (keep invalid values in a special additional bucket). Default: "error"
num_buckets	Number of buckets (quantiles, or categories) into which data points are grouped. Must be greater than or equal to 2.
relative_error	(Spark 2.0.0+) Relative error (see documentation for org.apache.spark.sql.DataFrameStatFunctions.approper for description). Must be in the range [0, 1]. default: 0.001
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

## **Details**

NaN handling: null and NaN values will be ignored from the column during QuantileDiscretizer fitting. This will produce a Bucketizer model for making predictions. During the transformation, Bucketizer will raise an error when it finds NaN values in the dataset, but the user can also choose to either keep or remove NaN values within the dataset by setting handle\_invalid If the user chooses to keep NaN values, they will be handled specially and placed into their own bucket, for example, if 4 buckets are used, then non-NaN data will be put into buckets[0-3], but NaNs will be counted in a special bucket[4].

Algorithm: The bin ranges are chosen using an approximate algorithm (see the documentation for org.apache.spark.sql.DataFrameStatFunctions.approxQuantile here for a detailed description). The

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precision of the approximation can be controlled with the relative\_error parameter. The lower and upper bin bounds will be -Infinity and +Infinity, covering all real values.

Note that the result may be different every time you run it, since the sample strategy behind it is non-deterministic.

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
ft_bucketizer
```

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_regex\_tokenizer

 $Feature \ Tranformation - RegexTokenizer \ (Transformer)$ 

## **Description**

A regex based tokenizer that extracts tokens either by using the provided regex pattern to split the text (default) or repeatedly matching the regex (if gaps is false). Optional parameters also allow filtering tokens using a minimal length. It returns an array of strings that can be empty.

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## Usage

```
ft_regex_tokenizer(x, input_col, output_col, gaps = TRUE,
  min_token_length = 1L, pattern = "\\s+", to_lower_case = TRUE,
  uid = random_string("regex_tokenizer_"), ...)
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

input\_col The name of the input column.

output\_col The name of the output column.

gaps Indicates whether regex splits on gaps (TRUE) or matches tokens (FALSE).

min\_token\_length

Minimum token length, greater than or equal to 0.

pattern The regular expression pattern to be used.

uid A character string used to uniquely identify the feature transformer.

... Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

### See Also

See <a href="http://spark.apache.org/docs/latest/ml-features.html">http://spark.apache.org/docs/latest/ml-features.html</a> for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

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ft\_r\_formula

Feature Tranformation – RFormula (Estimator)

## **Description**

Implements the transforms required for fitting a dataset against an R model formula. Currently we support a limited subset of the R operators, including ~, ., :, +, and -. Also see the R formula docs here: http://stat.ethz.ch/R-manual/R-patched/library/stats/html/formula.html

## Usage

```
ft_r_formula(x, formula, features_col = "features", label_col = "label",
  force_index_label = FALSE, dataset = NULL,
  uid = random_string("r_formula_"), ...)
```

### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula R formula as a character string or a formula. Formula objects are converted to

character strings directly and the environment is not captured.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

force\_index\_label

(Spark 2.1.0+) Force to index label whether it is numeric or string type. Usually we index label only when it is string type. If the formula was used by classification algorithms, we can force to index label even it is numeric type by setting

this param with true. Default: FALSE.

dataset (Optional) A tbl\_spark. If provided, eagerly fit the (estimator) feature "trans-

former" against dataset. See details.

uid A character string used to uniquely identify the feature transformer.

... Optional arguments; currently unused.

### **Details**

The basic operators in the formula are:

- ~ separate target and terms
- + concat terms, "+ 0" means removing intercept
- - remove a term, "- 1" means removing intercept
- : interaction (multiplication for numeric values, or binarized categorical values)
- · . all columns except target

ft\_r\_formula 37

Suppose a and b are double columns, we use the following simple examples to illustrate the effect of RFormula:

- y ~ a + b means model y ~ w0 + w1 \* a + w2 \* b where w0 is the intercept and w1, w2 are coefficients.
- y ~ a + b + a:b 1 means model y ~ w1 \* a + w2 \* b + w3 \* a \* b where w1, w2, w3 are coefficients.

RFormula produces a vector column of features and a double or string column of label. Like when formulas are used in R for linear regression, string input columns will be one-hot encoded, and numeric columns will be cast to doubles. If the label column is of type string, it will be first transformed to double with StringIndexer. If the label column does not exist in the DataFrame, the output label column will be created from the specified response variable in the formula.

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

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 $ft\_sql\_transformer$  Feature Transformation - SQLTransformer

### Description

Implements the transformations which are defined by SQL statement. Currently we only support SQL syntax like 'SELECT ... FROM \_\_THIS\_\_ ...' where '\_\_THIS\_\_' represents the underlying table of the input dataset. The select clause specifies the fields, constants, and expressions to display in the output, it can be any select clause that Spark SQL supports. Users can also use Spark SQL built-in function and UDFs to operate on these selected columns.

# Usage

```
ft_sql_transformer(x, statement, uid = random_string("sql_transformer_"), ...)
ft_dplyr_transformer(x, tbl, uid = random_string("dplyr_transformer_"), ...)
```

### **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
statement	A SQL statement.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.
tbl	A tbl_spark generated using dplyr transformations.

### **Details**

ft\_dplyr\_transformer() is a wrapper around ft\_sql\_transformer() that takes a tbl\_spark instead of a SQL statement. Internally, the ft\_dplyr\_transformer() extracts the dplyr transformations used to generate tbl as a SQL statement then passes it on to ft\_sql\_transformer(). Note that only single-table dplyr verbs are supported and that the sdf\_family of functions are not.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_standard\_scaler

Feature Tranformation – StandardScaler (Estimator)

## Description

Standardizes features by removing the mean and scaling to unit variance using column summary statistics on the samples in the training set. The "unit std" is computed using the corrected sample standard deviation, which is computed as the square root of the unbiased sample variance.

## Usage

```
ft_standard_scaler(x, input_col, output_col, with_mean = FALSE,
  with_std = TRUE, dataset = NULL,
  uid = random_string("standard_scaler_"), ...)
```

### **Arguments**

Χ	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
with_mean	Whether to center the data with mean before scaling. It will build a dense output, so take care when applying to sparse input. Default: FALSE
with_std	Whether to scale the data to unit standard deviation. Default: TRUE
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

ft\_stop\_words\_remover Feature Transformation - StopWordsRemover (Transformer)

### Description

A feature transformer that filters out stop words from input.

### Usage

```
ft_stop_words_remover(x, input_col, output_col, case_sensitive = FALSE,
  stop_words = ml_default_stop_words(spark_connection(x), "english"),
  uid = random_string("stop_words_remover_"), ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
case_sensitive	Whether to do a case sensitive comparison over the stop words.
stop_words	The words to be filtered out.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

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#### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
ml_default_stop_words
```

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_vector\_slicer, ft\_word2vec

ft\_string\_indexer

Feature Tranformation – StringIndexer (Estimator)

# Description

A label indexer that maps a string column of labels to an ML column of label indices. If the input column is numeric, we cast it to string and index the string values. The indices are in [0, numLabels), ordered by label frequencies. So the most frequent label gets index 0. This function is the inverse of ft\_index\_to\_string.

```
ft_string_indexer(x, input_col, output_col, handle_invalid = "error",
  dataset = NULL, uid = random_string("string_indexer_"), ...)
ml_labels(model)
```

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## Arguments

x	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
handle_invalid	(Spark 2.1.0+) Param for how to handle invalid entries. Options are 'skip' (filter out rows with invalid values), 'error' (throw an error), or 'keep' (keep invalid values in a special additional bucket). Default: "error"
dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.
model	A fitted StringIndexer model returned by ft_string_indexer()

#### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

ml\_labels() returns a vector of labels, corresponding to indices to be assigned.

## See Also

See <a href="http://spark.apache.org/docs/latest/ml-features.html">http://spark.apache.org/docs/latest/ml-features.html</a> for more information on the set of transformations available for DataFrame columns in Spark.

```
ft_index_to_string
```

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer,
```

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```
ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula,
ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover,
ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

ft\_tokenizer Feature Tranformation - Tokenizer (Transformer)

## Description

A tokenizer that converts the input string to lowercase and then splits it by white spaces.

### Usage

```
ft_tokenizer(x, input_col, output_col, uid = random_string("tokenizer_"), ...)
```

#### Arguments

```
x A spark_connection, ml_pipeline, or a tbl_spark.

input_col The name of the input column.

output_col The name of the output column.

uid A character string used to uniquely identify the feature transformer.

... Optional arguments; currently unused.
```

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

# See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

44 ft\_vector\_assembler

### **Description**

Combine multiple vectors into a single row-vector; that is, where each row element of the newly generated column is a vector formed by concatenating each row element from the specified input columns.

## Usage

```
ft_vector_assembler(x, input_cols, output_col,
  uid = random_string("vector_assembler_"), ...)
```

### **Arguments**

```
x A spark_connection, ml_pipeline, or a tbl_spark.
input_cols The names of the input columns
output_col The name of the output column.

uid A character string used to uniquely identify the feature transformer.

Optional arguments; currently unused.
```

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_indexer, ft_vector_slicer, ft_word2vec
```

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ft_vector_indexer Feature Tranformation - VectorIndexer (Estimator)
---------------------------------------------------------------------

### **Description**

Indexing categorical feature columns in a dataset of Vector.

### Usage

```
ft_vector_indexer(x, input_col, output_col, max_categories = 20L,
  dataset = NULL, uid = random_string("vector_indexer_"), ...)
```

## Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
max_categories	Threshold for the number of values a categorical feature can take. If a feature is found to have > max_categories values, then it is declared continuous. Must be greater than or equal to 2. Defaults to 20.
dataset	(Optional) A $tbl\_spark$ . If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

### Details

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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#### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_slicer, ft\_word2vec

ft\_vector\_slicer Feature Transformation - VectorSlicer (Transformer)

#### **Description**

Takes a feature vector and outputs a new feature vector with a subarray of the original features.

#### **Usage**

```
ft_vector_slicer(x, input_col, output_col, indices,
  uid = random_string("vector_slicer_"), ...)
```

### **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
input_col	The name of the input column.
output_col	The name of the output column.
indices	An vector of indices to select features from a vector column. Note that the indices are 0-based.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

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### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

Other feature transformers: ft\_binarizer, ft\_bucketizer, ft\_chisq\_selector, ft\_count\_vectorizer, ft\_dct, ft\_elementwise\_product, ft\_hashing\_tf, ft\_idf, ft\_imputer, ft\_index\_to\_string, ft\_interaction, ft\_lsh, ft\_max\_abs\_scaler, ft\_min\_max\_scaler, ft\_ngram, ft\_normalizer, ft\_one\_hot\_encoder, ft\_pca, ft\_polynomial\_expansion, ft\_quantile\_discretizer, ft\_r\_formula, ft\_regex\_tokenizer, ft\_sql\_transformer, ft\_standard\_scaler, ft\_stop\_words\_remover, ft\_string\_indexer, ft\_tokenizer, ft\_vector\_assembler, ft\_vector\_indexer, ft\_word2vec

ft\_word2vec

Feature Tranformation – Word2Vec (Estimator)

# Description

Word2Vec transforms a word into a code for further natural language processing or machine learning process.

### Usage

```
ft_word2vec(x, input_col, output_col, vector_size = 100L, min_count = 5L,
    max_sentence_length = 1000L, num_partitions = 1L, step_size = 0.025,
    max_iter = 1L, seed = NULL, dataset = NULL,
    uid = random_string("word2vec_"), ...)

ml_find_synonyms(model, word, num)
```

#### Arguments

x	A spark_connection, ml_pipeline, or a tbl_spark.	
input_col	The name of the input column.	
output_col	The name of the output column.	
vector_size	The dimension of the code that you want to transform from words. Default: 100	
min_count	The minimum number of times a token must appear to be included in the word2vec model's vocabulary. Default: 5	
max_sentence_length		
	(Spark 2.0.0+) Sets the maximum length (in words) of each sentence in the input data. Any sentence longer than this threshold will be divided into chunks of up to max_sentence_length size. Default: 1000	
num_partitions	Number of partitions for sentences of words. Default: 1	
step_size	Param for Step size to be used for each iteration of optimization (> 0).	
max_iter	The maximum number of iterations to use.	
seed	A random seed. Set this value if you need your results to be reproducible across repeated calls.	

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dataset	(Optional) A tbl_spark. If provided, eagerly fit the (estimator) feature "transformer" against dataset. See details.
uid	A character string used to uniquely identify the feature transformer.
	Optional arguments; currently unused.
model	A fitted Word2Vec model, returned by ft_word2vec().
word	A word, as a length-one character vector.
num	Number of words closest in similarity to the given word to find.

#### **Details**

When dataset is provided for an estimator transformer, the function internally calls ml\_fit() against dataset. Hence, the methods for spark\_connection and ml\_pipeline will then return a ml\_transformer and a ml\_pipeline with a ml\_transformer appended, respectively. When x is a tbl\_spark, the estimator will be fit against dataset before transforming x.

When dataset is not specified, the constructor returns a ml\_estimator, and, in the case where x is a tbl\_spark, the estimator fits against x then to obtain a transformer, which is then immediately used to transform x.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns a ml\_transformer, a ml\_estimator, or one of their subclasses. The object contains a pointer to a Spark Transformer or Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the transformer or estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a transformer is constructed then immediately applied to the input tbl\_spark, returning a tbl\_spark

ml\_find\_synonyms() returns a DataFrame of synonyms and cosine similarities

### See Also

See http://spark.apache.org/docs/latest/ml-features.html for more information on the set of transformations available for DataFrame columns in Spark.

```
Other feature transformers: ft_binarizer, ft_bucketizer, ft_chisq_selector, ft_count_vectorizer, ft_dct, ft_elementwise_product, ft_hashing_tf, ft_idf, ft_imputer, ft_index_to_string, ft_interaction, ft_lsh, ft_max_abs_scaler, ft_min_max_scaler, ft_ngram, ft_normalizer, ft_one_hot_encoder, ft_pca, ft_polynomial_expansion, ft_quantile_discretizer, ft_r_formula, ft_regex_tokenizer, ft_sql_transformer, ft_standard_scaler, ft_stop_words_remover, ft_string_indexer, ft_tokenizer, ft_vector_assembler, ft_vector_indexer, ft_vector_slicer
```

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hive\_context\_config Runtime conf

Runtime configuration interface for Hive

## Description

Retrieves the runtime configuration interface for Hive.

# Usage

```
hive_context_config(sc)
```

## **Arguments**

sc

A spark\_connection.

invoke

Invoke a Method on a JVM Object

# Description

Invoke methods on Java object references. These functions provide a mechanism for invoking various Java object methods directly from R.

## Usage

```
invoke(jobj, method, ...)
invoke_static(sc, class, method, ...)
invoke_new(sc, class, ...)
```

### **Arguments**

jobj An R object acting as a Java object reference (typically, a spark\_jobj).

method The name of the method to be invoked.

... Optional arguments, currently unused.

sc A spark\_connection.

class The name of the Java class whose methods should be invoked.

#### **Details**

Use each of these functions in the following scenarios:

invoke Execute a method on a Java object reference (typically, a spark\_jobj).

invoke\_static Execute a static method associated with a Java class.
Invoke\_new Invoke a constructor associated with a Java class.

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## **Examples**

```
sc <- spark_connect(master = "spark://HOST:PORT")
spark_context(sc) %>%
  invoke("textFile", "file.csv", 1L) %>%
  invoke("count")
```

livy\_config

Create a Spark Configuration for Livy

# **Description**

Create a Spark Configuration for Livy

## Usage

```
livy_config(config = spark_config(), username = NULL, password = NULL,
  custom_headers = list(`X-Requested-By` = "sparklyr"), ...)
```

## **Arguments**

config Optional base configuration

username The username to use in the Authorization header password The password to use in the Authorization header

 $custom\_headers\ \ List\ of\ custom\ headers\ to\ append\ to\ http\ requests.\ Defaults\ to\ list("X-Requested-By"="sparklyr").$ 

... additional Livy session parameters

### **Details**

Extends a Spark "spark\_config" configuration with settings for Livy. For instance, "username" and "password" define the basic authentication settings for a Livy session.

The default value of "custom\_headers" is set to list("X-Requested-By" = "sparklyr") in order to facilitate connection to Livy servers with CSRF protection enabled.

Additional parameters for Livy sessions are:

proxy\_user User to impersonate when starting the session

jars jars to be used in this session

py\_files Python files to be used in this session

files files to be used in this session

driver\_memory Amount of memory to use for the driver process

driver\_cores Number of cores to use for the driver process

executor\_memory Amount of memory to use per executor process

executor\_cores Number of cores to use for each executor

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```
num_executors Number of executors to launch for this session
archives Archives to be used in this session
queue The name of the YARN queue to which submitted
queue The name of this session
heartbeat_timeout Timeout in seconds to which session be orphaned
```

### Value

Named list with configuration data

```
livy_service_start Start Livy
```

# Description

Starts the livy service.

Stops the running instances of the livy service.

### Usage

```
livy_service_start(version = NULL, spark_version = NULL, stdout = "",
    stderr = "", ...)
livy_service_stop()
```

## **Arguments**

```
version The version of 'livy' to use.

spark_version The version of 'spark' to connect to.

stdout, stderr where output to 'stdout' or 'stderr' should be sent. Same options as system2.

Optional arguments; currently unused.
```

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ml-params

Spark ML - ML Params

# Description

Helper methods for working with parameters for ML objects.

## Usage

```
ml_is_set(x, param, ...)
ml_param_map(x, ...)
ml_param(x, param, allow_null = FALSE, ...)
ml_params(x, params = NULL, allow_null = FALSE, ...)
```

#### **Arguments**

x A Spark ML object, either a pipeline stage or an evaluator.

param The parameter to extract or set.

... Optional arguments; currently unused.

allow\_null Whether to allow NULL results when extracting parameters. If FALSE, an error

will be thrown if the specified parameter is not found. Defaults to FALSE.

params A vector of parameters to extract.

ml-persistence

Spark ML – Model Persistence

## **Description**

Save/load Spark ML objects

```
ml_save(x, path, overwrite = FALSE, ...)
## S3 method for class 'ml_model'
ml_save(x, path, overwrite = FALSE,
   type = c("pipeline_model", "pipeline"), ...)
ml_load(sc, path)
```

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# **Arguments**

X	A ML object, which could be a $ml_pipeline_stage$ or a $ml_model$
path	The path where the object is to be serialized/deserialized.
overwrite	Whether to overwrite the existing path, defaults to FALSE.
	Optional arguments; currently unused.
type	Whether to save the pipeline model or the pipeline.
sc	A Spark connection.

#### Value

ml\_save() serializes a Spark object into a format that can be read back into sparklyr or by the Scala or PySpark APIs. When called on ml\_model objects, i.e. those that were created via the tbl\_spark - formula signature, the associated pipeline model is serialized. In other words, the saved model contains both the data processing (RFormulaModel) stage and the machine learning stage.

ml\_load() reads a saved Spark object into sparklyr. It calls the correct Scala load method based on parsing the saved metadata. Note that a PipelineModel object saved from a sparklyr ml\_model via ml\_save() will be read back in as an ml\_pipeline\_model, rather than the ml\_model object.

 $\verb|ml-transform-methods| Spark ML-Transform, fit, and predict methods (ml\_interface)|$ 

### **Description**

Methods for transformation, fit, and prediction. These are mirrors of the corresponding sdf-transformmethods.

```
is_ml_transformer(x)
is_ml_estimator(x)
ml_fit(x, dataset, ...)
ml_transform(x, dataset, ...)
ml_fit_and_transform(x, dataset, ...)
ml_predict(x, dataset, ...)
## S3 method for class 'ml_model_classification'
ml_predict(x, dataset,
    probability_prefix = "probability_", ...)
```

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# **Arguments**

```
    x A ml_estimator, ml_transformer, or ml_model object.
    dataset A tbl_spark.
    ... Optional arguments; currently unused.
    probability_prefix
    String used to prepend the class probability output columns.
```

#### **Details**

These methods are

### Value

When x is an estimator, ml\_fit() returns a transformer whereas ml\_fit\_and\_transform() returns a transformed dataset. When x is a transformer, ml\_transform() and ml\_predict() return a transformed dataset. When ml\_predict() is called on a ml\_model object, additional columns (e.g. probabilities in case of classification models) are appended to the transformed output for the user's convenience.

ml-tuning

Spark ML - Tuning

## **Description**

Perform hyper-parameter tuning using either K-fold cross validation or train-validation split.

### Usage

```
ml_cross_validator(x, estimator, estimator_param_maps, evaluator,
    num_folds = 3L, seed = NULL, uid = random_string("cross_validator_"),
    ...)

ml_train_validation_split(x, estimator, estimator_param_maps, evaluator,
    train_ratio = 0.75, seed = NULL,
    uid = random_string("train_validation_split_"), ...)
```

### **Arguments**

```
x A spark_connection, ml_pipeline, or a tbl_spark.

estimator A ml_estimator object.

estimator_param_maps
A named list of stages and hyper-parameter sets to tune. See details.

evaluator A ml_evaluator object, see ml_evaluator.

num_folds Number of folds for cross validation. Must be >= 2. Default: 3
```

seed	A random seed. Set this value if you need your results to be reproducible across repeated calls.
uid	A character string used to uniquely identify the ML estimator.
	Optional arguments; currently unused.
train_ratio	Ratio between train and validation data. Must be between 0 and 1. Default: 0.75

#### **Details**

ml\_cross\_validator() performs k-fold cross validation while ml\_train\_validation\_split() performs tuning on one pair of train and validation datasets.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_cross\_validator or ml\_traing\_validation\_split object.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the tuning estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a tuning estimator is constructed then immediately fit with the input tbl\_spark, returning a ml\_cross\_validation\_model or a ml\_train\_validation\_split\_model object.

```
{\it ml\_aft\_survival\_regression} \\ {\it Spark\ ML-Survival\ Regression}
```

## **Description**

Fit a parametric survival regression model named accelerated failure time (AFT) model (see Accelerated failure time model (Wikipedia)) based on the Weibull distribution of the survival time.

```
ml_aft_survival_regression(x, formula = NULL, censor_col = "censor",
    quantile_probabilities = list(0.01, 0.05, 0.1, 0.25, 0.5, 0.75, 0.9, 0.95,
    0.99), fit_intercept = TRUE, max_iter = 100L, tol = 1e-06,
    aggregation_depth = 2L, quantiles_col = NULL, features_col = "features",
    label_col = "label", prediction_col = "prediction",
    uid = random_string("aft_survival_regression_"), ...)

ml_survival_regression(x, formula = NULL, censor_col = "censor",
    quantile_probabilities = list(0.01, 0.05, 0.1, 0.25, 0.5, 0.75, 0.9, 0.95,
    0.99), fit_intercept = TRUE, max_iter = 100L, tol = 1e-06,
    aggregation_depth = 2L, quantiles_col = NULL, features_col = "features",
    label_col = "label", prediction_col = "prediction",
    uid = random_string("aft_survival_regression_"), response = NULL,
    features = NULL, ...)
```

#### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula.

This is used to transform the input dataframe before fitting, see ft\_r\_formula for

details.

censor\_col Censor column name. The value of this column could be 0 or 1. If the value is

1, it means the event has occurred i.e. uncensored; otherwise censored.

quantile\_probabilities

Quantile probabilities array. Values of the quantile probabilities array should be

in the range (0, 1) and the array should be non-empty.

fit\_intercept Boolean; should the model be fit with an intercept term?

max\_iter The maximum number of iterations to use.

tol Param for the convergence tolerance for iterative algorithms.

aggregation\_depth

(Spark 2.1.0+) Suggested depth for treeAggregate (>= 2).

quantiles\_col Quantiles column name. This column will output quantiles of corresponding

quantileProbabilities if it is set.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

response (Deprecated) The name of the response column (as a length-one character vec-

tor.)

features (Deprecated) The name of features (terms) to use for the model fit.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

ml\_survival\_regression() is an alias for ml\_aft\_survival\_regression() for backwards compatibility.

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#### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

ml\_als

Spark ML – ALS

# Description

Perform recommendation using Alternating Least Squares (ALS) matrix factorization.

```
ml_als(x, rating_col = "rating", user_col = "user", item_col = "item",
    rank = 10L, reg_param = 0.1, implicit_prefs = FALSE, alpha = 1,
    nonnegative = FALSE, max_iter = 10L, num_user_blocks = 10L,
    num_item_blocks = 10L, checkpoint_interval = 10L,
    cold_start_strategy = "nan",
    intermediate_storage_level = "MEMORY_AND_DISK",
    final_storage_level = "MEMORY_AND_DISK", uid = random_string("als_"), ...)

ml_recommend(model, type = c("items", "users"), n = 1)

ml_als_factorization(x, rating_col = "rating", user_col = "user",
    item_col = "item", rank = 10L, reg_param = 0.1,
    implicit_prefs = FALSE, alpha = 1, nonnegative = FALSE,
    max_iter = 10L, num_user_blocks = 10L, num_item_blocks = 10L,
```

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```
checkpoint_interval = 10L, cold_start_strategy = "nan",
intermediate_storage_level = "MEMORY_AND_DISK",
final_storage_level = "MEMORY_AND_DISK", uid = random_string("als_"), ...)
```

#### **Arguments**

Х A spark\_connection, ml\_pipeline, or a tbl\_spark.

Column name for ratings. Default: "rating" rating\_col

Column name for user ids. Ids must be integers. Other numeric types are supuser\_col

ported for this column, but will be cast to integers as long as they fall within the

integer value range. Default: "user"

Column name for item ids. Ids must be integers. Other numeric types are supitem\_col

ported for this column, but will be cast to integers as long as they fall within the

integer value range. Default: "item"

Rank of the matrix factorization (positive). Default: 10 rank

reg\_param Regularization parameter.

implicit\_prefs Whether to use implicit preference. Default: FALSE.

alpha Alpha parameter in the implicit preference formulation (nonnegative).

nonnegative Whether to apply nonnegativity constraints. Default: FALSE.

max\_iter Maximum number of iterations.

num\_user\_blocks

Number of user blocks (positive). Default: 10

num\_item\_blocks

Number of item blocks (positive). Default: 10

checkpoint\_interval

Set checkpoint interval (>= 1) or disable checkpoint (-1). E.g. 10 means that the

cache will get checkpointed every 10 iterations, defaults to 10.

cold\_start\_strategy

(Spark 2.2.0+) Strategy for dealing with unknown or new users/items at prediction time. This may be useful in cross-validation or production scenarios, for handling user/item ids the model has not seen in the training data. Supported values: - "nan": predicted value for unknown ids will be NaN. - "drop": rows in the input DataFrame containing unknown ids will be dropped from the output DataFrame containing predictions. Default: "nan".

intermediate\_storage\_level

(Spark 2.0.0+) StorageLevel for intermediate datasets. Pass in a string representation of StorageLevel. Cannot be "NONE". Default: "MEMORY\_AND\_DISK".

final\_storage\_level

(Spark 2.0.0+) StorageLevel for ALS model factors. Pass in a string representation of StorageLevel. Default: "MEMORY\_AND\_DISK".

uid A character string used to uniquely identify the ML estimator.

Optional arguments; currently unused.

mode1 An ALS model object

What to recommend, one of items or users type Maximum number of recommendations to return n

ml\_bisecting\_kmeans 59

#### **Details**

ml\_recommend() returns the top n users/items recommended for each item/user, for all items/users. The output has been transformed (exploded and separated) from the default Spark outputs to be more user friendly.

ml\_als\_factorization() is an alias for ml\_als() for backwards compatibility.

#### Value

ALS attempts to estimate the ratings matrix R as the product of two lower-rank matrices, X and Y, i.e. X \* Yt = R. Typically these approximations are called 'factor' matrices. The general approach is iterative. During each iteration, one of the factor matrices is held constant, while the other is solved for using least squares. The newly-solved factor matrix is then held constant while solving for the other factor matrix.

This is a blocked implementation of the ALS factorization algorithm that groups the two sets of factors (referred to as "users" and "products") into blocks and reduces communication by only sending one copy of each user vector to each product block on each iteration, and only for the product blocks that need that user's feature vector. This is achieved by pre-computing some information about the ratings matrix to determine the "out-links" of each user (which blocks of products it will contribute to) and "in-link" information for each product (which of the feature vectors it receives from each user block it will depend on). This allows us to send only an array of feature vectors between each user block and product block, and have the product block find the users' ratings and update the products based on these messages.

For implicit preference data, the algorithm used is based on "Collaborative Filtering for Implicit Feedback Datasets", available at http://dx.doi.org/10.1109/ICDM.2008.22, adapted for the blocked approach used here.

Essentially instead of finding the low-rank approximations to the rating matrix R, this finds the approximations for a preference matrix P where the elements of P are 1 if r is greater than 0 and 0 if r is less than or equal to 0. The ratings then act as 'confidence' values related to strength of indicated user preferences rather than explicit ratings given to items.

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_als recommender object, which is an Estimator.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the recommender appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a recommender estimator is constructed then immediately fit with the input tbl\_spark, returning a recommendation model, i.e. ml\_als\_model.

### **Description**

A bisecting k-means algorithm based on the paper "A comparison of document clustering techniques" by Steinbach, Karypis, and Kumar, with modification to fit Spark. The algorithm starts from a single cluster that contains all points. Iteratively it finds divisible clusters on the bottom level and bisects each of them using k-means, until there are k leaf clusters in total or no leaf clusters are divisible. The bisecting steps of clusters on the same level are grouped together to increase parallelism. If bisecting all divisible clusters on the bottom level would result more than k leaf clusters, larger clusters get higher priority.

#### Usage

```
ml_bisecting_kmeans(x, formula = NULL, k = 4L, max_iter = 20L,
    seed = NULL, min_divisible_cluster_size = 1, features_col = "features",
    prediction_col = "prediction",
    uid = random_string("bisecting_bisecting_kmeans_"), ...)
```

### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula.

This is used to transform the input dataframe before fitting, see ft\_r\_formula for

details.

k The number of clusters to create

max\_iter The maximum number of iterations to use.

seed A random seed. Set this value if you need your results to be reproducible across

repeated calls.

min\_divisible\_cluster\_size

The minimum number of points (if greater than or equal to 1.0) or the minimum proportion of points (if less than 1.0) of a divisible cluster (default: 1.0).

proportion of points (if less than 1.0) of a divisible cluster (default, 1.0).

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

 $ft_r_formula.$ 

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; currently unused.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_estimator object. The object contains a pointer to a Spark Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the clustering estimator appended to the pipeline.

- tbl\_spark: When x is a tbl\_spark, an estimator is constructed then immediately fit with the input tbl\_spark, returning a clustering model.
- tbl\_spark, with formula or features specified: When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the estimator. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model. This signature does not apply to ml\_lda().

#### See Also

See http://spark.apache.org/docs/latest/ml-clustering.html for more information on the set of clustering algorithms.

Other ml clustering algorithms: ml\_gaussian\_mixture, ml\_kmeans, ml\_lda

```
{\tt ml\_decision\_tree\_classifier} \\ Spark\ ML-Decision\ Trees
```

# **Description**

Perform classification and regression using decision trees.

```
ml_decision_tree_classifier(x, formula = NULL, max_depth = 5L,
 max_bins = 32L, min_instances_per_node = 1L, min_info_gain = 0,
  impurity = "gini", seed = NULL, thresholds = NULL,
  cache_node_ids = FALSE, checkpoint_interval = 10L,
 max_memory_in_mb = 256L, features_col = "features", label_col = "label",
 prediction_col = "prediction", probability_col = "probability",
  raw_prediction_col = "rawPrediction",
  uid = random_string("decision_tree_classifier_"), ...)
ml_decision_tree(x, formula = NULL, type = c("auto", "regression",
  "classification"), features_col = "features", label_col = "label",
  prediction_col = "prediction", variance_col = NULL,
  probability_col = "probability", raw_prediction_col = "rawPrediction",
  checkpoint_interval = 10L, impurity = "auto", max_bins = 32L,
 max_depth = 5L, min_info_gain = 0, min_instances_per_node = 1L,
  seed = NULL, thresholds = NULL, cache_node_ids = FALSE,
 max_memory_in_mb = 256L, uid = random_string("decision_tree_"),
  response = NULL, features = NULL, ...)
ml_decision_tree_regressor(x, formula = NULL, max_depth = 5L,
 max_bins = 32L, min_instances_per_node = 1L, min_info_gain = 0,
  impurity = "variance", seed = NULL, cache_node_ids = FALSE,
  checkpoint_interval = 10L, max_memory_in_mb = 256L, variance_col = NULL,
```

```
features_col = "features", label_col = "label",
prediction_col = "prediction",
uid = random_string("decision_tree_regressor_"), ...)
```

#### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula.

This is used to transform the input dataframe before fitting, see ft r formula for

details.

max\_depth Maximum depth of the tree (>= 0); that is, the maximum number of nodes sep-

arating any leaves from the root of the tree.

max\_bins The maximum number of bins used for discretizing continuous features and for

choosing how to split on features at each node. More bins give higher granular-

ity.

min\_instances\_per\_node

Minimum number of instances each child must have after split.

min\_info\_gain Minimum information gain for a split to be considered at a tree node. Should be

>= 0, defaults to 0.

impurity Criterion used for information gain calculation. Supported: "entropy" and "gini"

(default) for classification and "variance" (default) for regression. For ml\_decision\_tree,

setting "auto" will default to the appropriate criterion based on model type.

seed Seed for random numbers.

thresholds Thresholds in multi-class classification to adjust the probability of predicting

each class. Array must have length equal to the number of classes, with values > 0 excepting that at most one value may be 0. The class with largest value p/t is predicted, where p is the original probability of that class and t is the class's

threshold.

cache\_node\_ids If FALSE, the algorithm will pass trees to executors to match instances with

nodes. If TRUE, the algorithm will cache node IDs for each instance. Caching

can speed up training of deeper trees. Defaults to FALSE.

checkpoint\_interval

Set checkpoint interval (>= 1) or disable checkpoint (-1). E.g. 10 means that the

cache will get checkpointed every 10 iterations, defaults to 10.

max\_memory\_in\_mb

Maximum memory in MB allocated to histogram aggregation. If too small, then 1 node will be split per iteration, and its aggregates may exceed this size.

Defaults to 256.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

type The type of model to fit. "regression" treats the response as a continuous

variable, while "classification" treats the response as a categorical variable. When "auto" is used, the model type is inferred based on the response variable type – if it is a numeric type, then regression is used; classification otherwise.

variance\_col (Optional) Column name for the biased sample variance of prediction.

response (Deprecated) The name of the response column (as a length-one character vec-

tor.)

features (Deprecated) The name of features (terms) to use for the model fit.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

ml\_decision\_tree is a wrapper around ml\_decision\_tree\_regressor.tbl\_spark and ml\_decision\_tree\_classifier and calls the appropriate method based on model type.

# Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

```
ml_default_stop_words Default stop words
```

### **Description**

Loads the default stop words for the given language.

### Usage

```
ml_default_stop_words(sc, language = c("danish", "dutch", "english",
    "finnish", "french", "german", "hungarian", "italian", "norwegian",
    "portuguese", "russian", "spanish", "swedish", "turkish"), ...)
```

## **Arguments**

```
sc A spark_connection
language A character string.
... Optional arguments; currently unused.
```

### **Details**

Supported languages: danish, dutch, english, finnish, french, german, hungarian, italian, norwegian, portuguese, russian, spanish, swedish, turkish. See http://anoncvs.postgresql.org/cvsweb.cgi/pgsql/src/backend/snowball/stopwords/ for more details

## Value

A list of stop words.

#### See Also

```
ft_stop_words_remover
```

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ml\_evaluate

Spark ML – Evaluate prediction frames with evaluators

## **Description**

Evaluate a prediction dataset with a Spark ML evaluator

### Usage

```
ml_evaluate(x, dataset)
```

## Arguments

x A ml\_evaluator object.dataset A spark\_tbl with columns as specified in the evaluator object.

ml\_evaluator

Spark ML - Evaluators

### **Description**

A set of functions to calculate performance metrics for prediction models. Also see the Spark ML Documentation https://spark.apache.org/docs/latest/api/scala/index.html#org.apache.spark.ml.evaluation.package

```
ml_binary_classification_evaluator(x, label_col = "label",
    raw_prediction_col = "rawPrediction", metric_name = "areaUnderROC",
    uid = random_string("binary_classification_evaluator_"), ...)

ml_binary_classification_eval(x, label_col = "label",
    prediction_col = "prediction", metric_name = "areaUnderROC")

ml_multiclass_classification_evaluator(x, label_col = "label",
    prediction_col = "prediction", metric_name = "f1",
    uid = random_string("multiclass_classification_evaluator_"), ...)

ml_classification_eval(x, label_col = "label",
    prediction_col = "prediction", metric_name = "f1")

ml_regression_evaluator(x, label_col = "label",
    prediction_col = "prediction", metric_name = "rmse",
    uid = random_string("regression_evaluator_"), ...)
```

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## Arguments

A spark\_connection object or a tbl\_spark containing label and prediction columns. The latter should be the output of sdf\_predict.

label\_col Name of column string specifying which column contains the true labels or values.

raw\_prediction\_col Name of column contains the scored probability of a success

metric\_name The performance metric. See details.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; currently unused.

prediction\_col Name of the column that contains the predicted label or value NOT the scored probability. Column should be of type Double.

#### **Details**

The following metrics are supported

- Binary Classification: areaUnderROC (default) or areaUnderPR (not available in Spark 2.X.)
- Multiclass Classification: f1 (default), precision, recall, weightedPrecision, weightedRecall or accuracy; for Spark 2.X: f1 (default), weightedPrecision, weightedRecall or accuracy.
- Regression: rmse (root mean squared error, default), mse (mean squared error), r2, or mae (mean absolute error.)

ml\_binary\_classification\_eval() is an alias for ml\_binary\_classification\_evaluator() for backwards compatibility.

ml\_classification\_eval() is an alias for ml\_multiclass\_classification\_evaluator() for backwards compatibility.

### Value

The calculated performance metric

ml\_fpgrowth

Frequent Pattern Mining - FPGrowth

## **Description**

A parallel FP-growth algorithm to mine frequent itemsets.

```
ml_fpgrowth(x, items_col = "items", min_confidence = 0.8,
    min_support = 0.3, prediction_col = "prediction",
    uid = random_string("fpgrowth_"), ...)
ml_association_rules(model)
ml_freq_itemsets(model)
```

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# Arguments

X	A spark_connection, ml_pipeline, or a tbl_spark.
items_col	Items column name. Default: "items"
min_confidence	Minimal confidence for generating Association Rule. min_confidence will not affect the mining for frequent itemsets, but will affect the association rules generation. Default: 0.8
min_support	Minimal support level of the frequent pattern. [0.0, 1.0]. Any pattern that appears more than (min_support * size-of-the-dataset) times will be output in the frequent itemsets. Default: 0.3
<pre>prediction_col</pre>	Prediction column name.
uid	A character string used to uniquely identify the ML estimator.
	Optional arguments; currently unused.
model	A fitted FPGrowth model returned by ml_fpgrowth()

 $ml_gaussian_mixture$  Spark ML-Gaussian Mixture clustering.

# Description

This class performs expectation maximization for multivariate Gaussian Mixture Models (GMMs). A GMM represents a composite distribution of independent Gaussian distributions with associated "mixing" weights specifying each's contribution to the composite. Given a set of sample points, this class will maximize the log-likelihood for a mixture of k Gaussians, iterating until the log-likelihood changes by less than tol, or until it has reached the max number of iterations. While this process is generally guaranteed to converge, it is not guaranteed to find a global optimum.

## Usage

```
ml_gaussian_mixture(x, formula = NULL, k = 2L, max_iter = 100L,
  tol = 0.01, seed = NULL, features_col = "features",
  prediction_col = "prediction", probability_col = "probability",
  uid = random_string("gaussian_mixture_"), ...)
```

### **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.
k	The number of clusters to create
max_iter	The maximum number of iterations to use.
tol	Param for the convergence tolerance for iterative algorithms.

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seed A random seed. Set this value if you need your results to be reproducible across

repeated calls.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities. Note: Not all models output well-calibrated probability estimates! These probabilities should be

treated as confidences, not precise probabilities.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; currently unused.

### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_estimator object. The object contains a pointer to a Spark Estimator object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the clustering estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, an estimator is constructed then immediately fit with the input tbl\_spark, returning a clustering model.
- tbl\_spark, with formula or features specified: When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the estimator. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model. This signature does not apply to ml\_lda().

### See Also

See http://spark.apache.org/docs/latest/ml-clustering.html for more information on the set of clustering algorithms.

Other ml clustering algorithms: ml\_bisecting\_kmeans, ml\_kmeans, ml\_lda

ml\_gbt\_classifier Spark ML - Gradient Boosted Trees

# **Description**

Perform classification and regression using gradient boosted trees.

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#### Usage

```
ml_gbt_classifier(x, formula = NULL, max_iter = 20L, max_depth = 5L,
 step_size = 0.1, subsampling_rate = 1, min_instances_per_node = 1L,
 max_bins = 32L, min_info_gain = 0, loss_type = "logistic",
 seed = NULL, thresholds = NULL, checkpoint_interval = 10L,
 cache_node_ids = FALSE, max_memory_in_mb = 256L,
 features_col = "features", label_col = "label",
 prediction_col = "prediction", probability_col = "probability",
 raw_prediction_col = "rawPrediction",
 uid = random_string("gbt_classifier_"), ...)
ml_gradient_boosted_trees(x, formula = NULL, type = c("auto", "regression",
 "classification"), features_col = "features", label_col = "label",
 prediction_col = "prediction", probability_col = "probability",
 raw_prediction_col = "rawPrediction", checkpoint_interval = 10L,
 loss_type = c("auto", "logistic", "squared", "absolute"), max_bins = 32L,
 max_depth = 5L, max_iter = 20L, min_info_gain = 0,
 min_instances_per_node = 1L, step_size = 0.1, subsampling_rate = 1,
 seed = NULL, thresholds = NULL, cache_node_ids = FALSE,
 max_memory_in_mb = 256L, uid = random_string("gradient_boosted_trees_"),
 response = NULL, features = NULL, ...)
ml_gbt_regressor(x, formula = NULL, max_iter = 20L, max_depth = 5L,
 step_size = 0.1, subsampling_rate = 1, min_instances_per_node = 1L,
 max_bins = 32L, min_info_gain = 0, loss_type = "squared", seed = NULL,
 checkpoint_interval = 10L, cache_node_ids = FALSE,
 max_memory_in_mb = 256L, features_col = "features", label_col = "label",
 prediction_col = "prediction", uid = random_string("gbt_regressor_"), ...)
```

# Arguments

A spark\_connection, ml\_pipeline, or a tbl\_spark. Χ formula Used when x is a tbl\_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft\_r\_formula for details. max\_iter Maxmimum number of iterations. Maximum depth of the tree (>= 0); that is, the maximum number of nodes sepmax\_depth arating any leaves from the root of the tree. Step size (a.k.a. learning rate) in interval (0, 1] for shrinking the contribution of step\_size each estimator. (default = 0.1) subsampling\_rate Fraction of the training data used for learning each decision tree, in range (0, 1]. (default = 1.0)min\_instances\_per\_node

Minimum number of instances each child must have after split.

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max\_bins The maximum number of bins used for discretizing continuous features and for

choosing how to split on features at each node. More bins give higher granular-

ity.

min\_info\_gain Minimum information gain for a split to be considered at a tree node. Should be

>= 0, defaults to 0.

loss\_type Loss function which GBT tries to minimize. Supported: "squared" (L2) and

"absolute" (L1) (default = squared) for regression and "logistic" (default) for classification. For  $ml_gradient_boosted_trees$ , setting "auto" will de-

fault to the appropriate loss type based on model type.

seed Seed for random numbers.

thresholds Thresholds in multi-class classification to adjust the probability of predicting

each class. Array must have length equal to the number of classes, with values > 0 excepting that at most one value may be 0. The class with largest value p/t is predicted, where p is the original probability of that class and t is the class's

threshold.

checkpoint\_interval

Set checkpoint interval (>= 1) or disable checkpoint (-1). E.g. 10 means that the

cache will get checkpointed every 10 iterations, defaults to 10.

cache\_node\_ids If FALSE, the algorithm will pass trees to executors to match instances with nodes. If TRUE, the algorithm will cache node IDs for each instance. Caching

can speed up training of deeper trees. Defaults to FALSE.

max\_memory\_in\_mb

Maximum memory in MB allocated to histogram aggregation. If too small, then 1 node will be split per iteration, and its aggregates may exceed this size.

Defaults to 256.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

type The type of model to fit. "regression" treats the response as a continuous

variable, while "classification" treats the response as a categorical variable. When "auto" is used, the model type is inferred based on the response variable type – if it is a numeric type, then regression is used; classification otherwise.

response (Deprecated) The name of the response column (as a length-one character vec-

tor.)

features (Deprecated) The name of features (terms) to use for the model fit.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

ml\_gradient\_boosted\_trees is a wrapper around ml\_gbt\_regressor.tbl\_spark and ml\_gbt\_classifier.tbl\_spark and calls the appropriate method based on model type.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_generalized\_linear\_regre ml\_isotonic\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

```
ml\_generalized\_linear\_regression Spark ML-Generalized\ Linear\ Regression
```

### **Description**

Perform regression using Generalized Linear Model (GLM).

## Usage

```
ml_generalized_linear_regression(x, formula = NULL, family = "gaussian",
    link = NULL, fit_intercept = TRUE, link_power = NULL,
    link_prediction_col = NULL, reg_param = 0, max_iter = 25L,
    weight_col = NULL, solver = "irls", tol = 1e-06, variance_power = 0,
    features_col = "features", label_col = "label",
    prediction_col = "prediction",
    uid = random_string("generalized_linear_regression_"), ...)
```

## Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula.

This is used to transform the input dataframe before fitting, see ft\_r\_formula for

details.

family Name of family which is a description of the error distribution to be used in

the model. Supported options: "gaussian", "binomial", "poisson", "gamma" and

"tweedie". Default is "gaussian".

link Name of link function which provides the relationship between the linear predic-

tor and the mean of the distribution function. See for supported link functions.

fit\_intercept Boolean; should the model be fit with an intercept term?

link\_power Index in the power link function. Only applicable to the Tweedie family. Note

that link power 0, 1, -1 or 0.5 corresponds to the Log, Identity, Inverse or Sqrt link, respectively. When not set, this value defaults to 1 - variancePower, which

matches the R "statmod" package.

link\_prediction\_col

Link prediction (linear predictor) column name. Default is not set, which means

we do not output link prediction.

reg\_param Regularization parameter (aka lambda)
max\_iter The maximum number of iterations to use.

weight\_col The name of the column to use as weights for the model fit.

solver Solver algorithm for optimization.

tol Param for the convergence tolerance for iterative algorithms.

variance\_power Power in the variance function of the Tweedie distribution which provides the

relationship between the variance and mean of the distribution. Only applicable to the Tweedie family. (see Tweedie Distribution (Wikipedia)) Supported values: 0 and [1, Inf). Note that variance power 0, 1, or 2 corresponds to the Gaussian,

Poisson or Gamma family, respectively.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

Valid link functions for each family is listed below. The first link function of each family is the default one.

```
• gaussian: "identity", "log", "inverse"
```

- binomial: "logit", "probit", "loglog"
- poisson: "log", "identity", "sqrt"
- gamma: "inverse", "identity", "log"
- tweedie: power link function specified through link\_power. The default link power in the tweedie family is 1 variance\_power.

## Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

```
Other ml algorithms: ml_aft_survival_regression, ml_decision_tree_classifier, ml_gbt_classifier, ml_isotonic_regression, ml_linear_regression, ml_linear_svc, ml_logistic_regression, ml_multilayer_perceptron_classifier, ml_naive_bayes, ml_one_vs_rest, ml_random_forest_classifier
```

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ml\_glm\_tidiers

Tidying methods for Spark ML linear models

### **Description**

These methods summarize the results of Spark ML models into tidy forms.

# Usage

#### **Arguments**

a Spark ML model.
exponentiate For GLM, whether to exponentiate the coefficient estimates (typical for logistic regression.)
extra arguments (not used.)
a tbl\_spark of new data to use for prediction.
type.residuals type of residuals, defaults to "working". Must be set to "working" when newdata is supplied.

#### **Details**

The residuals attached by augment are of type "working" by default, which is different from the default of "deviance" for residuals() or sdf\_residuals().

ml\_isotonic\_regression 75

```
ml_isotonic_regression
```

Spark ML – Isotonic Regression

### **Description**

Currently implemented using parallelized pool adjacent violators algorithm. Only univariate (single feature) algorithm supported.

### Usage

```
ml_isotonic_regression(x, formula = NULL, feature_index = 0L,
  isotonic = TRUE, weight_col = NULL, features_col = "features",
  label_col = "label", prediction_col = "prediction",
  uid = random_string("isotonic_regression_"), ...)
```

## Arguments

x	A spark_connection, ml_pipeline, or a tbl_spark.
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.
feature_index	Index of the feature if features_col is a vector column (default: 0), no effect otherwise.
isotonic	Whether the output sequence should be isotonic/increasing (true) or antitonic/decreasing (false). Default: true
weight_col	The name of the column to use as weights for the model fit.
features_col	Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft_r_formula.
label_col	Label column name. The column should be a numeric column. Usually this column is output by ft_r_formula.
prediction_col	Prediction column name.
uid	A character string used to uniquely identify the ML estimator.
	Optional arguments; see Details.

### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

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#### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

ml\_kmeans

Spark ML - K-Means Clustering

#### **Description**

K-means clustering with support for k-means initialization proposed by Bahmani et al. Using 'ml kmeans()' with the formula interface requires Spark 2.0+.

### Usage

```
ml_kmeans(x, formula = NULL, k = 2L, max_iter = 20L, tol = 1e-04,
  init_steps = 2L, init_mode = "k-means||", seed = NULL,
  features_col = "features", prediction_col = "prediction",
  uid = random_string("kmeans_"), ...)
ml_compute_cost(model, dataset)
```

#### Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula

Used when x is a tbl\_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft\_r\_formula for details.

ml kmeans 77

k The number of clusters to create

max\_iter The maximum number of iterations to use.

tol Param for the convergence tolerance for iterative algorithms.

init\_steps Number of steps for the k-means|| initialization mode. This is an advanced set-

ting – the default of 2 is almost always enough. Must be > 0. Default: 2.

init\_mode Initialization algorithm. This can be either "random" to choose random points

as initial cluster centers, or "k-meansll" to use a parallel variant of k-means++

(Bahmani et al., Scalable K-Means++, VLDB 2012). Default: k-means||.

seed A random seed. Set this value if you need your results to be reproducible across

repeated calls.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; currently unused.

model A fitted K-means model returned by ml\_kmeans()

dataset Dataset on which to calculate K-means cost

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_estimator object. The object contains a pointer to a Spark Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the clustering estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, an estimator is constructed then immediately fit with the input tbl\_spark, returning a clustering model.
- tbl\_spark, with formula or features specified: When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the estimator. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model. This signature does not apply to ml\_lda().

ml\_compute\_cost() returns the K-means cost (sum of squared distances of points to their nearest center) for the model on the given data.

#### See Also

See http://spark.apache.org/docs/latest/ml-clustering.html for more information on the set of clustering algorithms.

Other ml clustering algorithms: ml\_bisecting\_kmeans, ml\_gaussian\_mixture, ml\_lda

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 $ml_lda$ 

Spark ML – Latent Dirichlet Allocation

### **Description**

Latent Dirichlet Allocation (LDA), a topic model designed for text documents.

## Usage

```
ml_lda(x, k = 10L, max_iter = 20L, doc_concentration = NULL,
    topic_concentration = NULL, subsampling_rate = 0.05,
    optimizer = "online", checkpoint_interval = 10L,
    keep_last_checkpoint = TRUE, learning_decay = 0.51,
    learning_offset = 1024, optimize_doc_concentration = TRUE, seed = NULL,
    features_col = "features", topic_distribution_col = "topicDistribution",
    uid = random_string("lda_"), ...)

ml_describe_topics(model, max_terms_per_topic = 10L)

ml_log_likelihood(model, dataset)

ml_log_perplexity(model, dataset)
```

#### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

k The number of clusters to create

max iter The maximum number of iterations to use.

doc\_concentration

Concentration parameter (commonly named "alpha") for the prior placed on documents' distributions over topics ("theta"). See details.

topic\_concentration

Concentration parameter (commonly named "beta" or "eta") for the prior placed on topics' distributions over terms.

subsampling\_rate

(For Online optimizer only) Fraction of the corpus to be sampled and used in each iteration of mini-batch gradient descent, in range (0, 1]. Note that this should be adjusted in synch with max\_iter so the entire corpus is used. Specifically, set both so that maxIterations \* miniBatchFraction greater than or equal to 1.

optimizer

Optimizer or inference algorithm used to estimate the LDA model. Supported: "online" for Online Variational Bayes (default) and "em" for Expectation-Maximization.

checkpoint\_interval

Set checkpoint interval (>= 1) or disable checkpoint (-1). E.g. 10 means that the cache will get checkpointed every 10 iterations, defaults to 10.

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keep\_last\_checkpoint

(Spark 2.0.0+) (For EM optimizer only) If using checkpointing, this indicates whether to keep the last checkpoint. If FALSE, then the checkpoint will be deleted. Deleting the checkpoint can cause failures if a data partition is lost, so set this bit with care. Note that checkpoints will be cleaned up via reference counting, regardless.

learning\_decay

(For Online optimizer only) Learning rate, set as an exponential decay rate. This should be between (0.5, 1.0] to guarantee asymptotic convergence. This is called "kappa" in the Online LDA paper (Hoffman et al., 2010). Default: 0.51, based on Hoffman et al.

learning\_offset

(For Online optimizer only) A (positive) learning parameter that downweights early iterations. Larger values make early iterations count less. This is called "tau0" in the Online LDA paper (Hoffman et al., 2010) Default: 1024, following Hoffman et al.

optimize\_doc\_concentration

(For Online optimizer only) Indicates whether the doc\_concentration (Dirichlet parameter for document-topic distribution) will be optimized during training. Setting this to true will make the model more expressive and fit the training data better. Default: FALSE

seed

A random seed. Set this value if you need your results to be reproducible across repeated calls.

features\_col

Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft\_r\_formula.

 $topic\_distribution\_col$ 

Output column with estimates of the topic mixture distribution for each document (often called "theta" in the literature). Returns a vector of zeros for an empty document.

uid

A character string used to uniquely identify the ML estimator.

• • •

Optional arguments; currently unused.

model

A fitted LDA model returned by ml\_lda().

max\_terms\_per\_topic

Maximum number of terms to collect for each topic. Default value of 10.

dataset

test corpus to use for calculating log likelihood or log perplexity

## Details

Terminology for LDA:

- "term" = "word": an element of the vocabulary
- "token": instance of a term appearing in a document
- "topic": multinomial distribution over terms representing some concept
- "document": one piece of text, corresponding to one row in the input data

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Original LDA paper (journal version): Blei, Ng, and Jordan. "Latent Dirichlet Allocation." JMLR, 2003.

Input data (features\_col): LDA is given a collection of documents as input data, via the features\_col parameter. Each document is specified as a Vector of length vocab\_size, where each entry is the count for the corresponding term (word) in the document. Feature transformers such as ft\_tokenizer and ft\_count\_vectorizer can be useful for converting text to word count vectors

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_estimator object. The object contains a pointer to a Spark Estimator object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the clustering estimator appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, an estimator is constructed then immediately fit with the input tbl\_spark, returning a clustering model.
- tbl\_spark, with formula or features specified: When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the estimator. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model. This signature does not apply to ml\_lda().

ml\_describe\_topics returns a DataFrame with topics and their top-weighted terms.

ml\_log\_likelihood calculates a lower bound on the log likelihood of the entire corpus

### Parameter details

doc\_concentration: This is the parameter to a Dirichlet distribution, where larger values mean more smoothing (more regularization). If not set by the user, then doc\_concentration is set automatically. If set to singleton vector [alpha], then alpha is replicated to a vector of length k in fitting. Otherwise, the doc\_concentration vector must be length k. (default = automatic)

Optimizer-specific parameter settings:

#### EM

- Currently only supports symmetric distributions, so all values in the vector should be the same.
- Values should be greater than 1.0
- default = uniformly (50 / k) + 1, where 50/k is common in LDA libraries and +1 follows from Asuncion et al. (2009), who recommend a +1 adjustment for EM.

### Online

- Values should be greater than or equal to 0
- default = uniformly (1.0 / k), following the implementation from here

topic\_concentration:

This is the parameter to a symmetric Dirichlet distribution.

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Note: The topics' distributions over terms are called "beta" in the original LDA paper by Blei et al., but are called "phi" in many later papers such as Asuncion et al., 2009.

If not set by the user, then topic\_concentration is set automatically. (default = automatic) Optimizer-specific parameter settings:

#### **EM**

- Value should be greater than 1.0
- default = 0.1 + 1, where 0.1 gives a small amount of smoothing and +1 follows Asuncion et al. (2009), who recommend a +1 adjustment for EM.

#### Online

- Value should be greater than or equal to 0
- default = (1.0 / k), following the implementation from here.

topic\_distribution\_col: This uses a variational approximation following Hoffman et al. (2010), where the approximate distribution is called "gamma." Technically, this method returns this approximation "gamma" for each document.

#### See Also

See http://spark.apache.org/docs/latest/ml-clustering.html for more information on the set of clustering algorithms.

Other ml clustering algorithms: ml\_bisecting\_kmeans, ml\_gaussian\_mixture, ml\_kmeans

```
ml_linear_regression Spark ML - Linear Regression
```

### Description

Perform regression using linear regression.

#### Usage

```
ml_linear_regression(x, formula = NULL, fit_intercept = TRUE,
    elastic_net_param = 0, reg_param = 0, max_iter = 100L,
    weight_col = NULL, solver = "auto", standardization = TRUE,
    tol = 1e-06, features_col = "features", label_col = "label",
    prediction_col = "prediction", uid = random_string("linear_regression_"),
    ...)
```

#### **Arguments**

```
x A spark_connection, ml_pipeline, or a tbl_spark.

formula Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.

fit_intercept Boolean; should the model be fit with an intercept term?
```

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elastic\_net\_param

ElasticNet mixing parameter, in range [0, 1]. For alpha = 0, the penalty is an L2

penalty. For alpha = 1, it is an L1 penalty.

reg\_param Regularization parameter (aka lambda)

max\_iter The maximum number of iterations to use.

weight\_col The name of the column to use as weights for the model fit.

solver Solver algorithm for optimization.

standardization

Whether to standardize the training features before fitting the model.

tol Param for the convergence tolerance for iterative algorithms.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

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#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

ml\_linear\_svc

Spark ML - LinearSVC

### **Description**

Perform classification using linear support vector machines (SVM). This binary classifier optimizes the Hinge Loss using the OWLQN optimizer. Only supports L2 regularization currently.

## Usage

```
ml_linear_svc(x, formula = NULL, fit_intercept = TRUE, reg_param = 0,
    max_iter = 100L, standardization = TRUE, weight_col = NULL,
    tol = 1e-06, threshold = 0, aggregation_depth = 2L,
    features_col = "features", label_col = "label",
    prediction_col = "prediction", raw_prediction_col = "rawPrediction",
    uid = random_string("linear_svc_"), ...)
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula.

This is used to transform the input dataframe before fitting, see ft\_r\_formula for

details.

fit\_intercept Boolean; should the model be fit with an intercept term?

reg\_param Regularization parameter (aka lambda)

max\_iter The maximum number of iterations to use.

standardization

Whether to standardize the training features before fitting the model.

weight\_col The name of the column to use as weights for the model fit.

tol Param for the convergence tolerance for iterative algorithms.

threshold in binary classification prediction, in range [0, 1].

aggregation\_depth

(Spark 2.1.0+) Suggested depth for treeAggregate ( $\geq$  2).

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

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label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

```
ml_logistic_regression
```

Spark ML – Logistic Regression

### **Description**

Perform classification using logistic regression.

## Usage

```
ml_logistic_regression(x, formula = NULL, fit_intercept = TRUE,
    elastic_net_param = 0, reg_param = 0, max_iter = 100L,
    threshold = 0.5, thresholds = NULL, tol = 1e-06, weight_col = NULL,
    aggregation_depth = 2L, lower_bounds_on_coefficients = NULL,
    lower_bounds_on_intercepts = NULL, upper_bounds_on_coefficients = NULL,
    upper_bounds_on_intercepts = NULL, features_col = "features",
    label_col = "label", family = "auto", prediction_col = "prediction",
    probability_col = "probability", raw_prediction_col = "rawPrediction",
    uid = random_string("logistic_regression_"), ...)
```

## **Arguments**

x	A spark_connection, ml_pipeline, or a tbl_spark.	
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.	
fit_intercept	Boolean; should the model be fit with an intercept term?	
elastic_net_pa	ram	
	ElasticNet mixing parameter, in range $[0, 1]$ . For alpha = 0, the penalty is an L2 penalty. For alpha = 1, it is an L1 penalty.	
reg_param	Regularization parameter (aka lambda)	
max_iter	The maximum number of iterations to use.	
threshold	in binary classification prediction, in range [0, 1].	
thresholds	Thresholds in multi-class classification to adjust the probability of predicting each class. Array must have length equal to the number of classes, with values > 0 excepting that at most one value may be 0. The class with largest value p/t is predicted, where p is the original probability of that class and t is the class's threshold.	
tol	Param for the convergence tolerance for iterative algorithms.	
weight_col	The name of the column to use as weights for the model fit.	
aggregation_depth		
	(Spark 2.1.0+) Suggested depth for treeAggregate (>= 2).	

lower\_bounds\_on\_coefficients

(Spark 2.2.0+) Lower bounds on coefficients if fitting under bound constrained optimization. The bound matrix must be compatible with the shape (1, number of features) for binomial regression, or (number of classes, number of features) for multinomial regression.

lower\_bounds\_on\_intercepts

(Spark 2.2.0+) Lower bounds on intercepts if fitting under bound constrained optimization. The bounds vector size must be equal with 1 for binomial regression, or the number of classes for multinomial regression.

upper\_bounds\_on\_coefficients

(Spark 2.2.0+) Upper bounds on coefficients if fitting under bound constrained optimization. The bound matrix must be compatible with the shape (1, number of features) for binomial regression, or (number of classes, number of features) for multinomial regression.

upper\_bounds\_on\_intercepts

(Spark 2.2.0+) Upper bounds on intercepts if fitting under bound constrained optimization. The bounds vector size must be equal with 1 for binomial regression, or the number of classes for multinomial regression.

features\_col Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by  $ft_r_formula$ .

family (Spark 2.1.0+) Param for the name of family which is a description of the label distribution to be used in the model. Supported options: "auto", "binomial", and

"multinomial."

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

## Details

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

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#### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

ml\_model\_data

Extracts data associated with a Spark ML model

### **Description**

Extracts data associated with a Spark ML model

### Usage

```
ml_model_data(object)
```

### **Arguments**

object

a Spark ML model

#### Value

A tbl\_spark

```
\label{eq:multilayer_perceptron_classifier} {\it Spark\ ML-Multilayer\ Perceptron}
```

## **Description**

Classification model based on the Multilayer Perceptron. Each layer has sigmoid activation function, output layer has softmax.

### Usage

```
ml_multilayer_perceptron_classifier(x, formula = NULL, layers,
    max_iter = 100L, step_size = 0.03, tol = 1e-06, block_size = 128L,
    solver = "l-bfgs", seed = NULL, initial_weights = NULL,
    features_col = "features", label_col = "label",
    prediction_col = "prediction",
    uid = random_string("multilayer_perceptron_classifier_"), ...)

ml_multilayer_perceptron(x, formula = NULL, layers, max_iter = 100L,
    step_size = 0.03, tol = 1e-06, block_size = 128L, solver = "l-bfgs",
    seed = NULL, initial_weights = NULL, features_col = "features",
    label_col = "label", prediction_col = "prediction",
    uid = random_string("multilayer_perceptron_classifier_"), response = NULL,
    features = NULL, ...)
```

## **Arguments**

x	A spark_connection, ml_pipeline, or a tbl_spark.
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.
layers	A numeric vector describing the layers – each element in the vector gives the size of a layer. For example, c(4, 5, 2) would imply three layers, with an input (feature) layer of size 4, an intermediate layer of size 5, and an output (class) layer of size 2.
max_iter	The maximum number of iterations to use.
step_size	Step size to be used for each iteration of optimization (> 0).
tol	Param for the convergence tolerance for iterative algorithms.
block_size	Block size for stacking input data in matrices to speed up the computation. Data is stacked within partitions. If block size is more than remaining data in a partition then it is adjusted to the size of this data. Recommended size is between 10 and 1000. Default: 128
solver	The solver algorithm for optimization. Supported options: "gd" (minibatch gradient descent) or "l-bfgs". Default: "l-bfgs"

seed A random seed. Set this value if you need your results to be reproducible across

repeated calls.

initial\_weights

The initial weights of the model.

features\_col Features column name, as a length-one character vector. The column should

be single vector column of numeric values. Usually this column is output by

ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this

column is output by ft\_r\_formula.

prediction\_col Prediction column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

response (Deprecated) The name of the response column (as a length-one character vec-

tor.)

features (Deprecated) The name of features (terms) to use for the model fit.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

ml\_multilayer\_perceptron() is an alias for ml\_multilayer\_perceptron\_classifier() for backwards compatibility.

### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

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## See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_naive\_bayes, ml\_one\_vs\_rest, ml\_random\_forest\_classifier

ml\_naive\_bayes

Spark ML - Naive-Bayes

## **Description**

Naive Bayes Classifiers. It supports Multinomial NB (see here) which can handle finitely supported discrete data. For example, by converting documents into TF-IDF vectors, it can be used for document classification. By making every vector a binary (0/1) data, it can also be used as Bernoulli NB (see here). The input feature values must be nonnegative.

## Usage

```
ml_naive_bayes(x, formula = NULL, model_type = "multinomial",
    smoothing = 1, thresholds = NULL, weight_col = NULL,
    features_col = "features", label_col = "label",
    prediction_col = "prediction", probability_col = "probability",
    raw_prediction_col = "rawPrediction", uid = random_string("naive_bayes_"),
    ...)
```

## **Arguments**

X	A spark_connection, ml_pipeline, or a tbl_spark.
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.
model_type	The model type. Supported options: "multinomial" and "bernoulli". (default = $multinomial$ )
smoothing	The (Laplace) smoothing parameter. Defaults to 1.
thresholds	Thresholds in multi-class classification to adjust the probability of predicting each class. Array must have length equal to the number of classes, with values > 0 excepting that at most one value may be 0. The class with largest value p/t is predicted, where p is the original probability of that class and t is the class's threshold.
weight_col	(Spark 2.1.0+) Weight column name. If this is not set or empty, we treat all instance weights as 1.0.
features_col	Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft_r_formula.

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label\_col Label column name. The column should be a numeric column. Usually this column is output by ft\_r\_formula.

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other mlalgorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_one\_vs\_rest, ml\_random\_forest\_classificer.

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ml\_one\_vs\_rest

Spark ML - OneVsRest

### **Description**

Reduction of Multiclass Classification to Binary Classification. Performs reduction using one against all strategy. For a multiclass classification with k classes, train k models (one per class). Each example is scored against all k models and the model with highest score is picked to label the example.

#### Usage

```
ml_one_vs_rest(x, formula = NULL, classifier, features_col = "features",
  label_col = "label", prediction_col = "prediction",
  uid = random_string("one_vs_rest_"), ...)
```

#### **Arguments**

x	A spark_connection, ml_pipeline, or a tbl_spark.
formula	Used when x is a tbl_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft_r_formula for details.
classifier	Object of class ml_estimator. Base binary classifier that we reduce multiclass classification into.
features_col	Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft_r_formula.
label_col	Label column name. The column should be a numeric column. Usually this column is output by ft_r_formula.
prediction_col	Prediction column name.
uid	A character string used to uniquely identify the ML estimator.
	Optional arguments; see Details.

# **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

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#### Value

The object returned depends on the class of x.

• spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.

- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.
- tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.
- tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_random\_forest\_classifier

ml\_pipeline

Spark ML - Pipelines

# **Description**

Create Spark ML Pipelines

### Usage

```
ml_pipeline(x, ..., uid = random_string("pipeline_"))
```

#### **Arguments**

```
x Either a spark_connection or ml_pipeline_stage objects
... ml_pipeline_stage objects.
uid A character string used to uniquely identify the ML estimator.
```

### Value

When x is a spark\_connection, ml\_pipeline() returns an empty pipeline object. When x is a ml\_pipeline\_stage, ml\_pipeline() returns an ml\_pipeline with the stages set to x and any transformers or estimators given in ....

```
ml_random_forest_classifier 
 Spark\ ML-Random\ Forest
```

#### **Description**

Perform classification and regression using random forests.

#### **Usage**

```
ml_random_forest_classifier(x, formula = NULL, num_trees = 20L,
  subsampling_rate = 1, max_depth = 5L, min_instances_per_node = 1L,
  feature_subset_strategy = "auto", impurity = "gini", min_info_gain = 0,
 max_bins = 32L, seed = NULL, thresholds = NULL,
  checkpoint_interval = 10L, cache_node_ids = FALSE,
 max_memory_in_mb = 256L, features_col = "features", label_col = "label",
  prediction_col = "prediction", probability_col = "probability",
  raw_prediction_col = "rawPrediction",
  uid = random_string("random_forest_classifier_"), ...)
ml_random_forest(x, formula = NULL, type = c("auto", "regression",
  "classification"), features_col = "features", label_col = "label",
  prediction_col = "prediction", probability_col = "probability",
  raw_prediction_col = "rawPrediction", feature_subset_strategy = "auto",
  impurity = "auto", checkpoint_interval = 10L, max_bins = 32L,
 max_depth = 5L, num_trees = 20L, min_info_gain = 0,
 min_instances_per_node = 1L, subsampling_rate = 1, seed = NULL,
  thresholds = NULL, cache_node_ids = FALSE, max_memory_in_mb = 256L,
  uid = random_string("random_forest_"), response = NULL, features = NULL,
  ...)
ml_random_forest_regressor(x, formula = NULL, num_trees = 20L,
  subsampling_rate = 1, max_depth = 5L, min_instances_per_node = 1L,
  feature_subset_strategy = "auto", impurity = "variance",
 min_info_gain = 0, max_bins = 32L, seed = NULL,
  checkpoint_interval = 10L, cache_node_ids = FALSE,
 max_memory_in_mb = 256L, features_col = "features", label_col = "label",
  prediction_col = "prediction",
  uid = random_string("random_forest_regressor_"), ...)
```

## Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula Used when x is a tbl\_spark. R formula as a character string or a formula. This is used to transform the input dataframe before fitting, see ft\_r\_formula for details.

num\_trees Number of trees to train (>= 1). If 1, then no bootstrapping is used. If > 1, then

bootstrapping is done.

subsampling\_rate

Fraction of the training data used for learning each decision tree, in range (0, 1]. (default = 1.0)

max\_depth Maximum depth of the tree (>= 0); that is, the maximum number of nodes separating any leaves from the root of the tree.

min\_instances\_per\_node

Minimum number of instances each child must have after split.

feature\_subset\_strategy

The number of features to consider for splits at each tree node. See details for options.

impurity Criterion used for information gain calculation. Supported: "entropy" and "gini" (default) for classification and "variance" (default) for regression. For ml\_decision\_tree, setting "auto" will default to the appropriate criterion based on model type.

min\_info\_gain Minimum information gain for a split to be considered at a tree node. Should be >= 0, defaults to 0.

max\_bins The maximum number of bins used for discretizing continuous features and for choosing how to split on features at each node. More bins give higher granularity

seed Seed for random numbers.

thresholds Thresholds in multi-class classification to adjust the probability of predicting each class. Array must have length equal to the number of classes, with values > 0 excepting that at most one value may be 0. The class with largest value p/t is predicted, where p is the original probability of that class and t is the class's threshold.

checkpoint\_interval

Set checkpoint interval (>= 1) or disable checkpoint (-1). E.g. 10 means that the cache will get checkpointed every 10 iterations, defaults to 10.

cache\_node\_ids If FALSE, the algorithm will pass trees to executors to match instances with nodes. If TRUE, the algorithm will cache node IDs for each instance. Caching can speed up training of deeper trees. Defaults to FALSE.

max\_memory\_in\_mb

Maximum memory in MB allocated to histogram aggregation. If too small, then 1 node will be split per iteration, and its aggregates may exceed this size. Defaults to 256.

features\_col Features column name, as a length-one character vector. The column should be single vector column of numeric values. Usually this column is output by ft\_r\_formula.

label\_col Label column name. The column should be a numeric column. Usually this column is output by ft\_r\_formula.

prediction\_col Prediction column name.

probability\_col

Column name for predicted class conditional probabilities.

raw\_prediction\_col

Raw prediction (a.k.a. confidence) column name.

uid A character string used to uniquely identify the ML estimator.

... Optional arguments; see Details.

type The type of model to fit. "regression" treats the response as a continuous

variable, while "classification" treats the response as a categorical variable. When "auto" is used, the model type is inferred based on the response variable type – if it is a numeric type, then regression is used; classification otherwise.

response (Deprecated) The name of the response column (as a length-one character vec-

tor.)

features (Deprecated) The name of features (terms) to use for the model fit.

#### **Details**

When x is a tbl\_spark and formula (alternatively, response and features) is specified, the function returns a ml\_model object wrapping a ml\_pipeline\_model which contains data pre-processing transformers, the ML predictor, and, for classification models, a post-processing transformer that converts predictions into class labels. For classification, an optional argument predicted\_label\_col (defaults to "predicted\_label") can be used to specify the name of the predicted label column. In addition to the fitted ml\_pipeline\_model, ml\_model objects also contain a ml\_pipeline object where the ML predictor stage is an estimator ready to be fit against data. This is utilized by ml\_save with type = "pipeline" to faciliate model refresh workflows.

The supported options for feature\_subset\_strategy are

- "auto": Choose automatically for task: If num\_trees == 1, set to "all". If num\_trees > 1 (forest), set to "sqrt" for classification and to "onethird" for regression.
- "all": use all features
- "onethird": use 1/3 of the features
- "sqrt": use use sqrt(number of features)
- "log2": use log2(number of features)
- "n": when n is in the range (0, 1.0], use n \* number of features. When n is in the range (1, number of features), use n features. (default = "auto")

ml\_random\_forest is a wrapper around ml\_random\_forest\_regressor.tbl\_spark and ml\_random\_forest\_classifier and calls the appropriate method based on model type.

#### Value

The object returned depends on the class of x.

- spark\_connection: When x is a spark\_connection, the function returns an instance of a ml\_predictor object. The object contains a pointer to a Spark Predictor object and can be used to compose Pipeline objects.
- ml\_pipeline: When x is a ml\_pipeline, the function returns a ml\_pipeline with the predictor appended to the pipeline.

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• tbl\_spark: When x is a tbl\_spark, a predictor is constructed then immediately fit with the input tbl\_spark, returning a prediction model.

• tbl\_spark, with formula: specified When formula is specified, the input tbl\_spark is first transformed using a RFormula transformer before being fit by the predictor. The object returned in this case is a ml\_model which is a wrapper of a ml\_pipeline\_model.

#### See Also

See http://spark.apache.org/docs/latest/ml-classification-regression.html for more information on the set of supervised learning algorithms.

Other ml algorithms: ml\_aft\_survival\_regression, ml\_decision\_tree\_classifier, ml\_gbt\_classifier, ml\_generalized\_linear\_regression, ml\_isotonic\_regression, ml\_linear\_regression, ml\_linear\_svc, ml\_logistic\_regression, ml\_multilayer\_perceptron\_classifier, ml\_naive\_bayes, ml\_one\_vs\_rest

ml\_stage

Spark ML - Pipeline stage extraction

## **Description**

Extraction of stages from a Pipeline or PipelineModel object.

### Usage

```
ml_stage(x, stage)
ml_stages(x, stages = NULL)
```

# **Arguments**

x A ml\_pipeline or a ml\_pipeline\_model object

stage The UID of a stage in the pipeline.

stages The UIDs of stages in the pipeline as a character vector.

#### Value

For ml\_stage(): The stage specified.

For ml\_stages(): A list of stages. If stages is not set, the function returns all stages of the pipeline in a list.

ml\_summary

Spark ML – Extraction of summary metrics

# Description

Extracts a metric from the summary object of a Spark ML model.

## Usage

```
ml_summary(x, metric = NULL, allow_null = FALSE)
```

## **Arguments**

x A Spark ML model that has a summary.

metric The name of the metric to extract. If not set, returns the summary object.

allow\_null Whether null results are allowed when the metric is not found in the summary.

ml\_tree\_feature\_importance

Spark ML - Feature Importance for Tree Models

## **Description**

Spark ML - Feature Importance for Tree Models

# Usage

```
ml_tree_feature_importance(model, ...)
```

## **Arguments**

model A decision tree-based ml\_model

... Optional arguments; currently unused.

# Value

A sorted data frame with feature labels and their relative importance.

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ml\_uid

 $Spark\ ML-UID$ 

## **Description**

Extracts the UID of an ML object.

## Usage

```
ml_uid(x)
```

## **Arguments**

Х

A Spark ML object

na.replace

Replace Missing Values in Objects

### **Description**

This S3 generic provides an interface for replacing NA values within an object.

# Usage

```
na.replace(object, ...)
```

# Arguments

object

An R object.

. . .

Arguments passed along to implementing methods.

random\_string

Random string generation

## **Description**

Generate a random string with a given prefix.

## Usage

```
random_string(prefix = "table")
```

# Arguments

prefix

A length-one character vector.

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register\_extension

Register a Package that Implements a Spark Extension

## **Description**

Registering an extension package will result in the package being automatically scanned for spark dependencies when a connection to Spark is created.

# Usage

```
register_extension(package)
registered_extensions()
```

### **Arguments**

package

The package(s) to register.

### Note

Packages should typically register their extensions in their .onLoad hook – this ensures that their extensions are registered when their namespaces are loaded.

sdf-saveload

Save / Load a Spark DataFrame

## **Description**

Routines for saving and loading Spark DataFrames.

# Usage

```
sdf_save_table(x, name, overwrite = FALSE, append = FALSE)
sdf_load_table(sc, name)
sdf_save_parquet(x, path, overwrite = FALSE, append = FALSE)
sdf_load_parquet(sc, path)
```

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## **Arguments**

Χ	A spark_connection, ml_pipeline, or a tbl_spark.
name	The table name to assign to the saved Spark DataFrame.
overwrite	Boolean; overwrite a pre-existing table of the same name?
append	Boolean; append to a pre-existing table of the same name?
sc	A spark_connection object.
path	The path where the Spark DataFrame should be saved.

sdf-transform-methods *Spark ML - Transform, fit, and predict methods (sdf\_interface)* 

## **Description**

Methods for transformation, fit, and prediction. These are mirrors of the corresponding ml-transformmethods.

## Usage

```
sdf_predict(x, model, ...)
sdf_transform(x, transformer, ...)
sdf_fit(x, estimator, ...)
sdf_fit_and_transform(x, estimator, ...)
```

### **Arguments**

```
x A tbl_spark.

model A ml_transformer or a ml_model object.

... Optional arguments passed to the corresponding ml_ methods.

transformer A ml_transformer object.

estimator A ml_estimator object.
```

# Value

 $sdf\_predict()$ ,  $sdf\_transform()$ , and  $sdf\_fit\_and\_transform()$  return a transformed dataframe whereas  $sdf\_fit()$  returns a  $ml\_transformer$ .

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sdf\_along

Create DataFrame for along Object

## Description

Creates a DataFrame along the given object.

## Usage

```
sdf_along(sc, along, repartition = NULL)
```

## Arguments

sc The associated Spark connection.

along Takes the length from the length of this argument.

repartition The number of partitions to use when distributing the data across the Spark

cluster.

sdf\_bind

Bind multiple Spark DataFrames by row and column

## Description

sdf\_bind\_rows() and sdf\_bind\_cols() are implementation of the common pattern of do.call(rbind, sdfs) or do.call(cbind, sdfs) for binding many Spark DataFrames into one.

# Usage

```
sdf_bind_rows(..., id = NULL)
sdf_bind_cols(...)
```

# **Arguments**

... Spark tbls to combine.

Each argument can either be a Spark DataFrame or a list of Spark DataFrames When row-binding, columns are matched by name, and any missing columns with be filled with NA.

When column-binding, rows are matched by position, so all data frames must have the same number of rows.

id Data frame identifier.

When id is supplied, a new column of identifiers is created to link each row to its original Spark DataFrame. The labels are taken from the named arguments to sdf\_bind\_rows(). When a list of Spark DataFrames is supplied, the labels are taken from the names of the list. If no names are found a numeric sequence

is used instead.

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## **Details**

The output of sdf\_bind\_rows() will contain a column if that column appears in any of the inputs.

#### Value

```
sdf_bind_rows() and sdf_bind_cols() return tbl_spark
```

sdf\_broadcast

Broadcast hint

# **Description**

Used to force broadcast hash joins.

## Usage

```
sdf_broadcast(x)
```

# Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

sdf\_checkpoint

Checkpoint a Spark DataFrame

# Description

Checkpoint a Spark DataFrame

## Usage

```
sdf_checkpoint(x, eager = TRUE)
```

# Arguments

x an object coercible to a Spark DataFrame

eager whether to truncate the lineage of the DataFrame

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	-	
sdf	coalesce	

Coalesces a Spark DataFrame

### **Description**

Coalesces a Spark DataFrame

## Usage

```
sdf_coalesce(x, partitions)
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

partitions number of partitions

sdf\_copy\_to

Copy an Object into Spark

## **Description**

Copy an object into Spark, and return an R object wrapping the copied object (typically, a Spark DataFrame).

## Usage

```
sdf_copy_to(sc, x, name, memory, repartition, overwrite, ...)
sdf_import(x, sc, name, memory, repartition, overwrite, ...)
```

## **Arguments**

sc The associated Spark connection.

x An R object from which a Spark DataFrame can be generated.

name The name to assign to the copied table in Spark.

memory Boolean; should the table be cached into memory?

repartition The number of partitions to use when distributing the table across the Spark

cluster. The default (0) can be used to avoid partitioning.

overwrite Boolean; overwrite a pre-existing table with the name name if one already exists?

. . . Optional arguments, passed to implementing methods.

sdf\_describe 105

## **Advanced Usage**

sdf\_copy\_to is an S3 generic that, by default, dispatches to sdf\_import. Package authors that would like to implement sdf\_copy\_to for a custom object type can accomplish this by implementing the associated method on sdf\_import.

#### See Also

```
Other Spark data frames: sdf_partition, sdf_register, sdf_sample, sdf_sort
```

## **Examples**

```
sc <- spark_connect(master = "spark://HOST:PORT")
sdf_copy_to(sc, iris)</pre>
```

sdf\_describe

Compute summary statistics for columns of a data frame

## **Description**

Compute summary statistics for columns of a data frame

### Usage

```
sdf_describe(x, cols = colnames(x))
```

### **Arguments**

x An object coercible to a Spark DataFramecols Columns to compute statistics for, given as a character vector

sdf\_dim

Support for Dimension Operations

# Description

```
sdf_dim(), sdf_nrow() and sdf_ncol() provide similar functionality to dim(), nrow() and
ncol().
```

### Usage

```
sdf_dim(x)
sdf_nrow(x)
sdf_ncol(x)
```

106 sdf\_len

## **Arguments**

x An object (usually a spark\_tbl).

sdf\_last\_index

Returns the last index of a Spark DataFrame

# Description

Returns the last index of a Spark DataFrame. The Spark mapPartitionsWithIndex function is used to iterate through the last nonempty partition of the RDD to find the last record.

# Usage

```
sdf_{last_{index}(x, id = "id")}
```

## **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

id The name of the index column.

sdf\_len

Create DataFrame for Length

## **Description**

Creates a DataFrame for the given length.

## Usage

```
sdf_len(sc, length, repartition = NULL)
```

## **Arguments**

sc The associated Spark connection.

length The desired length of the sequence.

repartition The number of partitions to use when distributing the data across the Spark

cluster.

sdf\_mutate 107

sdf\_mutate

Mutate a Spark DataFrame

### Description

Use Spark's feature transformers to mutate a Spark DataFrame.

## Usage

```
sdf_mutate(.data, ...)
sdf_mutate_(.data, ..., .dots)
```

## Arguments

.data A spark\_tbl.
... Named arguments, mapping new column names to the transformation to be applied.
.dots A named list, mapping output names to transformations.

## **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

### **Examples**

```
## Not run:
# using the 'beaver1' dataset, binarize the 'temp' column
data(beavers, package = "datasets")
beaver_tbl <- copy_to(sc, beaver1, "beaver")
beaver_tbl %>%
    mutate(squared = temp ^ 2) %>%
    sdf_mutate(warm = ft_binarizer(squared, 1000)) %>%
    sdf_register("mutated")

# view our newly constructed tbl
head(beaver_tbl)

# note that we have two separate tbls registered
dplyr::src_tbls(sc)

## End(Not run)
```

108 sdf\_partition

sdf\_num\_partitions

Gets number of partitions of a Spark DataFrame

### **Description**

Gets number of partitions of a Spark DataFrame

### Usage

```
sdf_num_partitions(x)
```

## **Arguments**

Х

A spark\_connection, ml\_pipeline, or a tbl\_spark.

sdf\_partition

Partition a Spark Dataframe

### **Description**

Partition a Spark DataFrame into multiple groups. This routine is useful for splitting a DataFrame into, for example, training and test datasets.

### Usage

```
sdf_partition(x, ..., weights = NULL, seed = sample(.Machine$integer.max, 1))
```

#### **Arguments**

x An object coercable to a Spark DataFrame.

... Named parameters, mapping table names to weights. The weights will be nor-

malized such that they sum to 1.

weights An alternate mechanism for supplying weights – when specified, this takes

precedence over the ... arguments.

seed Random seed to use for randomly partitioning the dataset. Set this if you want

your partitioning to be reproducible on repeated runs.

#### **Details**

The sampling weights define the probability that a particular observation will be assigned to a particular partition, not the resulting size of the partition. This implies that partitioning a DataFrame with, for example,

```
sdf_partition(x, training = 0.5, test = 0.5)
```

is not guaranteed to produce training and test partitions of equal size.

sdf\_persist 109

#### Value

An R list of tbl\_sparks.

### **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

### See Also

```
Other Spark data frames: sdf_copy_to, sdf_register, sdf_sample, sdf_sort
```

### **Examples**

```
## Not run:
# randomly partition data into a 'training' and 'test'
# dataset, with 60% of the observations assigned to the
# 'training' dataset, and 40% assigned to the 'test' dataset
data(diamonds, package = "ggplot2")
diamonds_tbl <- copy_to(sc, diamonds, "diamonds")
partitions <- diamonds_tbl %>%
    sdf_partition(training = 0.6, test = 0.4)
print(partitions)

# alternate way of specifying weights
weights <- c(training = 0.6, test = 0.4)
diamonds_tbl %>% sdf_partition(weights = weights)

## End(Not run)
```

sdf\_persist

Persist a Spark DataFrame

### **Description**

Persist a Spark DataFrame, forcing any pending computations and (optionally) serializing the results to disk.

### Usage

```
sdf_persist(x, storage.level = "MEMORY_AND_DISK")
```

110 sdf\_pivot

### Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

storage.level The storage level to be used. Please view the Spark Documentation for informa-

tion on what storage levels are accepted.

#### **Details**

Spark DataFrames invoke their operations lazily – pending operations are deferred until their results are actually needed. Persisting a Spark DataFrame effectively 'forces' any pending computations, and then persists the generated Spark DataFrame as requested (to memory, to disk, or otherwise).

Users of Spark should be careful to persist the results of any computations which are non-deterministic – otherwise, one might see that the values within a column seem to 'change' as new operations are performed on that data set.

sdf\_pivot

Pivot a Spark DataFrame

### **Description**

Construct a pivot table over a Spark Dataframe, using a syntax similar to that from reshape2::dcast.

### Usage

```
sdf_pivot(x, formula, fun.aggregate = "count")
```

# **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

formula A two-sided R formula of the form  $x_1 + x_2 + ... \sim y_1$ . The left-hand

side of the formula indicates which variables are used for grouping, and the right-hand side indicates which variable is used for pivoting. Currently, only a

single pivot column is supported.

fun.aggregate How should the grouped dataset be aggregated? Can be a length-one character

vector, giving the name of a Spark aggregation function to be called; a named  $\mathsf{R}$  list mapping column names to an aggregation method, or an  $\mathsf{R}$  function that is

invoked on the grouped dataset.

sdf\_project 111

sdf_project	Project features onto principal components	

### **Description**

Project features onto principal components

### Usage

```
sdf_project(object, newdata, features = dimnames(object$pc)[[1]],
  feature_prefix = NULL, ...)
```

### **Arguments**

object A Spark PCA model object

newdata An object coercible to a Spark DataFrame

features A vector of names of columns to be projected

feature\_prefix The prefix used in naming the output features

. . . Optional arguments; currently unused.

### **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

### Description

Given a numeric column within a Spark DataFrame, compute approximate quantiles (to some relative error).

### Usage

```
sdf_quantile(x, column, probabilities = c(0, 0.25, 0.5, 0.75, 1), relative.error = 1e-05)
```

sdf\_register

# **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.
column The column for which quantiles should be computed.

probabilities A numeric vector of probabilities, for which quantiles should be computed.

relative.error The relative error – lower values imply more precision in the computed quan-

tiles.

sdf\_read\_column

Read a Column from a Spark DataFrame

### **Description**

Read a single column from a Spark DataFrame, and return the contents of that column back to R.

### Usage

```
sdf_read_column(x, column)
```

# **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

column The name of a column within x.

#### **Details**

It is expected for this operation to preserve row order.

sdf\_register

Register a Spark DataFrame

### Description

Registers a Spark DataFrame (giving it a table name for the Spark SQL context), and returns a tbl\_spark.

### Usage

```
sdf_register(x, name = NULL)
```

### **Arguments**

x A Spark DataFrame.

name A name to assign this table.

sdf\_repartition 113

### **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

#### See Also

Other Spark data frames: sdf\_copy\_to, sdf\_partition, sdf\_sample, sdf\_sort

sdf\_repartition

Repartition a Spark DataFrame

#### **Description**

Repartition a Spark DataFrame

#### Usage

```
sdf_repartition(x, partitions = NULL, partition_by = NULL)
```

#### **Arguments**

```
x A spark_connection, ml_pipeline, or a tbl_spark.
partitions number of partitions
partition_by vector of column names used for partitioning, only supported for Spark 2.0+
```

```
{\it sdf\_residuals.ml\_model\_generalized\_linear\_regression} \\ {\it Model Residuals}
```

### **Description**

This generic method returns a Spark DataFrame with model residuals added as a column to the model training data.

### Usage

```
## S3 method for class 'ml_model_generalized_linear_regression'
sdf_residuals(object,
   type = c("deviance", "pearson", "working", "response"), ...)
## S3 method for class 'ml_model_linear_regression'
sdf_residuals(object, ...)
sdf_residuals(object, ...)
```

114 sdf\_sample

# Arguments

object Spark ML model object.

type type of residuals which should be returned.

... additional arguments

sdf\_sample Randomly Sample Rows from a Spark DataFrame

### **Description**

Draw a random sample of rows (with or without replacement) from a Spark DataFrame.

### Usage

```
sdf_sample(x, fraction = 1, replacement = TRUE, seed = NULL)
```

### **Arguments**

x An object coercable to a Spark DataFrame.

fraction The fraction to sample.

replacement Boolean; sample with replacement?

seed An (optional) integer seed.

### **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

# See Also

Other Spark data frames: sdf\_copy\_to, sdf\_partition, sdf\_register, sdf\_sort

sdf\_schema 115

sdf\_schema

Read the Schema of a Spark DataFrame

### **Description**

Read the schema of a Spark DataFrame.

# Usage

```
sdf_schema(x)
```

### **Arguments**

Χ

A spark\_connection, ml\_pipeline, or a tbl\_spark.

#### **Details**

The type column returned gives the string representation of the underlying Spark type for that column; for example, a vector of numeric values would be returned with the type "DoubleType". Please see the Spark Scala API Documentation for information on what types are available and exposed by Spark.

### Value

An R list, with each list element describing the name and type of a column.

sdf\_separate\_column

Separate a Vector Column into Scalar Columns

### **Description**

Given a vector column in a Spark DataFrame, split that into n separate columns, each column made up of the different elements in the column column.

### Usage

```
sdf_separate_column(x, column, into = NULL)
```

# Arguments

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

column The name of a (vector-typed) column.

into A specification of the columns that should be generated from column. This can

either be a vector of column names, or an R list mapping column names to the

(1-based) index at which a particular vector element should be extracted.

116 sdf\_sort

sd	f	sec

Create DataFrame for Range

### Description

Creates a DataFrame for the given range

### Usage

```
sdf_seq(sc, from = 1L, to = 1L, by = 1L, repartition = NULL)
```

### **Arguments**

sc The associated Spark connection.

from, to The start and end to use as a range
by The increment of the sequence.

repartition The number of partitions to use when distributing the data across the Spark

cluster.

sdf\_sort

Sort a Spark DataFrame

### **Description**

Sort a Spark DataFrame by one or more columns, with each column sorted in ascending order.

#### Usage

```
sdf_sort(x, columns)
```

### **Arguments**

x An object coercable to a Spark DataFrame.

columns The column(s) to sort by.

### **Transforming Spark DataFrames**

The family of functions prefixed with sdf\_ generally access the Scala Spark DataFrame API directly, as opposed to the dplyr interface which uses Spark SQL. These functions will 'force' any pending SQL in a dplyr pipeline, such that the resulting tbl\_spark object returned will no longer have the attached 'lazy' SQL operations. Note that the underlying Spark DataFrame *does* execute its operations lazily, so that even though the pending set of operations (currently) are not exposed at the R level, these operations will only be executed when you explicitly collect() the table.

### See Also

Other Spark data frames: sdf\_copy\_to, sdf\_partition, sdf\_register, sdf\_sample

sdf\_with\_sequential\_id

```
sdf_with_sequential_id
```

Add a Sequential ID Column to a Spark DataFrame

### **Description**

Add a sequential ID column to a Spark DataFrame. The Spark zipWithIndex function is used to produce these. This differs from sdf\_with\_unique\_id in that the IDs generated are independent of partitioning.

### Usage

```
sdf_with_sequential_id(x, id = "id", from = 1L)
```

### **Arguments**

x A spark\_connection, ml\_pipeline, or a tbl\_spark.

The name of the column to host the generated IDs.

from The starting value of the id column

sdf\_with\_unique\_id Add a Unique ID Column to a Spark DataFrame

### **Description**

Add a unique ID column to a Spark DataFrame. The Spark monotonicallyIncreasingId function is used to produce these and is guaranteed to produce unique, monotonically increasing ids; however, there is no guarantee that these IDs will be sequential. The table is persisted immediately after the column is generated, to ensure that the column is stable – otherwise, it can differ across new computations.

#### Usage

```
sdf_with_unique_id(x, id = "id")
```

### **Arguments**

- x A spark\_connection, ml\_pipeline, or a tbl\_spark.
- id The name of the column to host the generated IDs.

118 spark-api

spark-api

Access the Spark API

### **Description**

Access the commonly-used Spark objects associated with a Spark instance. These objects provide access to different facets of the Spark API.

### Usage

```
spark_context(sc)
java_context(sc)
hive_context(sc)
spark_session(sc)
```

### Arguments

sc

A spark\_connection.

#### **Details**

The Scala API documentation is useful for discovering what methods are available for each of these objects. Use invoke to call methods on these objects.

### **Spark Context**

The main entry point for Spark functionality. The **Spark Context** represents the connection to a Spark cluster, and can be used to create RDDs, accumulators and broadcast variables on that cluster.

# Java Spark Context

A Java-friendly version of the aforementioned **Spark Context**.

### **Hive Context**

An instance of the Spark SQL execution engine that integrates with data stored in Hive. Configuration for Hive is read from hive-site.xml on the classpath.

Starting with Spark >= 2.0.0, the **Hive Context** class has been deprecated – it is superceded by the **Spark Session** class, and hive\_context will return a **Spark Session** object instead. Note that both classes share a SQL interface, and therefore one can invoke SQL through these objects.

spark-connections 119

### **Spark Session**

Available since Spark 2.0.0, the **Spark Session** unifies the **Spark Context** and **Hive Context** classes into a single interface. Its use is recommended over the older APIs for code targeting Spark 2.0.0 and above.

spark-connections

Manage Spark Connections

### **Description**

These routines allow you to manage your connections to Spark.

### Usage

```
spark_connect(master = "local", spark_home = Sys.getenv("SPARK_HOME"),
  method = c("shell", "livy", "databricks", "test"), app_name = "sparklyr",
  version = NULL, hadoop_version = NULL, config = spark_config(),
  extensions = sparklyr::registered_extensions(), ...)

spark_connection_is_open(sc)

spark_disconnect(sc, ...)

spark_disconnect_all()
```

### **Arguments**

master	Spark cluster url to connect to. Use "local" to connect to a local instance of Spark installed via spark_install.
spark_home	The path to a Spark installation. Defaults to the path provided by the SPARK_HOME environment variable. If SPARK_HOME is defined, it will be always be used unless the version parameter is specified to force the use of a locally installed version.
method	The method used to connect to Spark. Currently, only "shell" is supported.
app_name	The application name to be used while running in the Spark cluster.
version	The version of Spark to use. Only applicable to "local" Spark connections.
hadoop_version	The version of Hadoop to use. Only applicable to "local" Spark connections.
config	Custom configuration for the generated Spark connection. See spark_config for details.
extensions	Extension packages to enable for this connection. By default, all packages enabled through the use of sparklyr::register_extension will be passed here.
	Optional arguments; currently unused.
sc	A spark_connection.

120 spark\_apply

### **Examples**

```
sc <- spark_connect(master = "spark://HOST:PORT")
connection_is_open(sc)
spark_disconnect(sc)</pre>
```

spark\_apply

Apply an R Function in Spark

### **Description**

Applies an R function to a Spark object (typically, a Spark DataFrame).

### Usage

```
spark_apply(x, f, columns = colnames(x), memory = TRUE, group_by = NULL,
    packages = TRUE, context = NULL, ...)
```

### Arguments

x An object (usually a spark\_tbl) coercable to a Spark DataFrame.

f A function that transforms a data frame partition into a data frame. The function f has signature f(df, context, group1, group2, ...) where df is a data frame with the data to be processed, context is an optional object passed as the context parameter and group1 to groupN contain the values of the group\_by

values. When group\_by is not specified, f takes only one argument.

columns A vector of column names or a named vector of column types for the trans-

formed object. Defaults to the names from the original object and adds indexed

column names when not enough columns are specified.

memory Boolean; should the table be cached into memory?

group\_by Column name used to group by data frame partitions.

packages Boolean to distribute .libPaths() packages to each node, a list of packages to

distribute, or a package bundle created with spark\_apply\_bundle().

For clusters using Livy or Yarn cluster mode, packages must point to a package bundle created using spark\_apply\_bundle() and made available as a Spark

file using config\$sparklyr.shell.files.

For offline clusters where available.packages() is not available, manually

download the packages database from https://cran.r-project.org/web/packages/packages.rds

and set Sys.setenv(sparklyr.apply.packagesdb = "<pathl-to-rds>").

Otherwise, all packages will be used by default.

context Optional object to be serialized and passed back to f().

... Optional arguments; currently unused.

spark\_apply\_bundle 121

spark\_apply\_bundle

Create Bundle for Spark Apply

# Description

Creates a bundle of packages for spark\_apply().

# Usage

```
spark_apply_bundle(packages = TRUE, base_path = getwd())
```

# Arguments

packages List of packages to pack or TRUE to pack all.

base\_path Base path used to store the resulting bundle.

spark\_apply\_log

Log Writer for Spark Apply

# Description

Writes data to log under spark\_apply().

# Usage

```
spark_apply_log(..., level = "INFO")
```

# Arguments

Arguments to write to log.

level Severity level for this entry; recommended values: INFO, ERROR or WARN.

```
spark_compilation_spec
```

Define a Spark Compilation Specification

# Description

For use with compile\_package\_jars. The Spark compilation specification is used when compiling Spark extension Java Archives, and defines which versions of Spark, as well as which versions of Scala, should be used for compilation.

# Usage

```
spark_compilation_spec(spark_version = NULL, spark_home = NULL,
    scalac_path = NULL, scala_filter = NULL, jar_name = NULL,
    jar_path = NULL, jar_dep = NULL)
```

### **Arguments**

spark_version	The Spark version to build against. This can be left unset if the path to a suitable Spark home is supplied.
spark_home	The path to a Spark home installation. This can be left unset if spark_version is supplied; in such a case, sparklyr will attempt to discover the associated Spark installation using spark_home_dir.
scalac_path	The path to the scalac compiler to be used during compilation of your Spark extension. Note that you should ensure the version of scalac selected matches the version of scalac used with the version of Spark you are compiling against.
scala_filter	An optional R function that can be used to filter which scala files are used during compilation. This can be useful if you have auxiliary files that should only be included with certain versions of Spark.
jar_name	The name to be assigned to the generated jar.
jar_path	The path to the jar tool to be used during compilation of your Spark extension.
jar_dep	An optional list of additional jar dependencies.

### **Details**

Most Spark extensions won't need to define their own compilation specification, and can instead rely on the default behavior of compile\_package\_jars.

spark\_config 123

spark\_config

Read Spark Configuration

# Description

Read Spark Configuration

### Usage

```
spark_config(file = "config.yml", use_default = TRUE)
```

### **Arguments**

file Name of the configuration file

use\_default TRUE to use the built-in defaults provided in this package

### **Details**

Read Spark configuration using the **config** package.

#### Value

Named list with configuration data

spark\_connection

Retrieve the Spark Connection Associated with an R Object

### **Description**

Retrieve the spark\_connection associated with an R object.

### Usage

```
spark\_connection(x, ...)
```

# **Arguments**

x An R object from which a spark\_connection can be obtained.

... Optional arguments; currently unused.

spark\_dataframe

spark\_context\_config Runtime configuration interface for Spark.

# Description

Retrieves the runtime configuration interface for Spark.

# Usage

```
spark_context_config(sc)
```

# Arguments

sc

A spark\_connection.

spark\_dataframe

Retrieve a Spark DataFrame

# **Description**

This S3 generic is used to access a Spark DataFrame object (as a Java object reference) from an R object.

### Usage

```
spark_dataframe(x, ...)
```

# Arguments

x An R object wrapping, or containing, a Spark DataFrame.

... Optional arguments; currently unused.

# Value

A spark\_jobj representing a Java object reference to a Spark DataFrame.

```
spark\_default\_compilation\_spec
```

Default Compilation Specification for Spark Extensions

### **Description**

This is the default compilation specification used for Spark extensions, when used with compile\_package\_jars.

### Usage

```
spark_default_compilation_spec(pkg = infer_active_package_name(),
  locations = NULL)
```

### Arguments

pkg The package containing Spark extensions to be compiled.

locations Additional locations to scan. By default, the directories /opt/scala and /usr/local/scala

will be scanned.

spark\_dependency

Define a Spark dependency

# Description

Define a Spark dependency consisting of a set of custom JARs and Spark packages.

# Usage

```
spark_dependency(jars = NULL, packages = NULL)
```

### **Arguments**

jars Character vector of full paths to JAR files
packages Character vector of Spark packages names

#### Value

An object of type 'spark\_dependency'

spark\_install\_sync

spark\_home\_set

Set the SPARK\_HOME environment variable

### **Description**

Set the SPARK\_HOME environment variable. This slightly speeds up some operations, including the connection time.

### Usage

```
spark_home_set(path = NULL, verbose = getOption("sparklyr.verbose",
  is.null(path)))
```

### **Arguments**

path A string containing the path to the installation location of Spark. If NULL, the

path to the most latest Spark/Hadoop versions is used.

verbose Logical. Should the function explain what is it doing?

### Value

The function is mostly invoked for the side-effect of setting the SPARK\_HOME environment variable. It also returns TRUE if the environment was successfully set, and FALSE otherwise.

### **Examples**

```
## Not run:
# Not run due to side-effects
spark_home_set()
## End(Not run)
```

spark\_install\_sync

helper function to sync sparkinstall project to sparklyr

### **Description**

See: https://github.com/rstudio/spark-install

### Usage

```
spark_install_sync(project_path)
```

# Arguments

project\_path The path to the sparkinstall project

spark\_jobj 127

### **Description**

This S3 generic is used for accessing the underlying Java Virtual Machine (JVM) Spark objects associated with R objects. These objects act as references to Spark objects living in the JVM. Methods on these objects can be called with the invoke family of functions.

## Usage

```
spark_jobj(x, ...)
```

# Arguments

x An R object containing, or wrapping, a spark\_jobj.
... Optional arguments; currently unused.

### See Also

invoke, for calling methods on Java object references.

```
spark_load_table Reads from a Spark Table into a Spark DataFrame.
```

# Description

Reads from a Spark Table into a Spark DataFrame.

### Usage

```
spark_load_table(sc, name, path, options = list(), repartition = 0,
  memory = TRUE, overwrite = TRUE)
```

# Arguments

SC	A spark_connection.
name	The name to assign to the newly generated table.
path	The path to the file. Needs to be accessible from the cluster. Supports the '"hdfs://", '"s3a://" and '"file://" protocols.
options	A list of strings with additional options. See http://spark.apache.org/docs/latest/sql-programming-guide.html#configuration.
repartition	The number of partitions used to distribute the generated table. Use 0 (the default) to avoid partitioning.
memory	Boolean; should the data be loaded eagerly into memory? (That is, should the table be cached?)
overwrite	Boolean; overwrite the table with the given name if it already exists?

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### See Also

Other Spark serialization routines: spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_log

View Entries in the Spark Log

### **Description**

View the most recent entries in the Spark log. This can be useful when inspecting output / errors produced by Spark during the invocation of various commands.

### Usage

```
spark_log(sc, n = 100, filter = NULL, ...)
```

### **Arguments**

sc	A spark_connection.
n	The max number of log entries to retrieve. Use NULL to retrieve all entries within the log.
filter	Character string to filter log entries.
	Optional arguments; currently unused.

spark\_read\_csv

Read a CSV file into a Spark DataFrame

### **Description**

Read a tabular data file into a Spark DataFrame.

### Usage

```
spark_read_csv(sc, name, path, header = TRUE, columns = NULL,
infer_schema = TRUE, delimiter = ",", quote = "\"", escape = "\\",
charset = "UTF-8", null_value = NULL, options = list(),
repartition = 0, memory = TRUE, overwrite = TRUE, ...)
```

spark\_read\_csv 129

### **Arguments**

sc A spark\_connection.

name The name to assign to the newly generated table.

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

header Boolean; should the first row of data be used as a header? Defaults to TRUE.

columns A vector of column names or a named vector of column types.

infer\_schema Boolean; should column types be automatically inferred? Requires one extra

pass over the data. Defaults to TRUE.

delimiter The character used to delimit each column. Defaults to '', ''.

quote The character used as a quote. Defaults to """.

escape The character used to escape other characters. Defaults to ''\''.

charset The character set. Defaults to "UTF-8".

null\_value The character to use for null, or missing, values. Defaults to NULL.

options A list of strings with additional options.

repartition The number of partitions used to distribute the generated table. Use 0 (the de-

fault) to avoid partitioning.

memory Boolean; should the data be loaded eagerly into memory? (That is, should the

table be cached?)

overwrite Boolean; overwrite the table with the given name if it already exists?

... Optional arguments; currently unused.

#### **Details**

You can read data from HDFS (hdfs://), S3 (s3a://), as well as the local file system (file://).

If you are reading from a secure S3 bucket be sure to set the following in your spark-defaults.conf spark.hadoop.fs.s3a.access.key, spark.hadoop.fs.s3a.secret.key or any of the methods outlined in the aws-sdk documentation Working with AWS credentials In order to work with the newer s3a:// protocol also set the values for spark.hadoop.fs.s3a.impl and spark.hadoop.fs.s3a.endpoint . In addition, to support v4 of the S3 api be sure to pass the -Dcom.amazonaws.services.s3.enableV4 driver options for the config key spark.driver.extraJavaOptions For instructions on how to configure s3n:// check the hadoop documentation: s3n authentication properties

When header is FALSE, the column names are generated with a V prefix; e.g. V1, V2, ....

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_read\_json

spark_read_jdbc Read from JDBC connection into a Spark DataFrame.	
-------------------------------------------------------------------	--

# Description

Read from JDBC connection into a Spark DataFrame.

# Usage

```
spark_read_jdbc(sc, name, options = list(), repartition = 0,
  memory = TRUE, overwrite = TRUE, columns = NULL, ...)
```

### **Arguments**

sc	A spark_connection.
name	The name to assign to the newly generated table.
options	A list of strings with additional options. See http://spark.apache.org/docs/latest/sql-programming-guide.html#configuration.
repartition	The number of partitions used to distribute the generated table. Use $0$ (the default) to avoid partitioning.
memory	Boolean; should the data be loaded eagerly into memory? (That is, should the table be cached?)
overwrite	Boolean; overwrite the table with the given name if it already exists?
columns	A vector of column names or a named vector of column types.
	Optional arguments; currently unused.

### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark_read_json	Read a JSON file into a Spark DataFrame	
-----------------	-----------------------------------------	--

# **Description**

Read a table serialized in the JavaScript Object Notation format into a Spark DataFrame.

# Usage

```
spark_read_json(sc, name, path, options = list(), repartition = 0,
  memory = TRUE, overwrite = TRUE, columns = NULL, ...)
```

spark\_read\_libsvm 131

#### **Arguments**

sc A spark\_connection.

name The name to assign to the newly generated table.

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

options A list of strings with additional options.

repartition The number of partitions used to distribute the generated table. Use 0 (the de-

fault) to avoid partitioning.

memory Boolean; should the data be loaded eagerly into memory? (That is, should the

table be cached?)

overwrite Boolean; overwrite the table with the given name if it already exists?

columns A vector of column names or a named vector of column types.

... Optional arguments; currently unused.

#### **Details**

You can read data from HDFS (hdfs://), S3 (s3a://), as well as the local file system (file://).

If you are reading from a secure S3 bucket be sure to set the following in your spark-defaults.conf spark.hadoop.fs.s3a.access.key, spark.hadoop.fs.s3a.secret.key or any of the methods outlined in the aws-sdk documentation Working with AWS credentials In order to work with the newer s3a:// protocol also set the values for spark.hadoop.fs.s3a.impl and spark.hadoop.fs.s3a.endpoint . In addition, to support v4 of the S3 api be sure to pass the -Dcom.amazonaws.services.s3.enableV4 driver options for the config key spark.driver.extraJavaOptions For instructions on how to configure s3n:// check the hadoop documentation: s3n authentication properties

# See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_read\_libsvm Read libsvm file into a Spark DataFrame.

# Description

Read libsym file into a Spark DataFrame.

### Usage

```
spark_read_libsvm(sc, name, path, repartition = 0, memory = TRUE,
  overwrite = TRUE, ...)
```

132 spark\_read\_parquet

#### **Arguments**

sc A spark\_connection.

name The name to assign to the newly generated table.

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

repartition The number of partitions used to distribute the generated table. Use 0 (the de-

fault) to avoid partitioning.

memory Boolean; should the data be loaded eagerly into memory? (That is, should the

table be cached?)

overwrite Boolean; overwrite the table with the given name if it already exists?

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_read\_parquet Read a Parquet file into a Spark DataFrame

#### **Description**

Read a Parquet file into a Spark DataFrame.

### Usage

```
spark_read_parquet(sc, name, path, options = list(), repartition = 0,
memory = TRUE, overwrite = TRUE, columns = NULL, schema = NULL, ...)
```

### **Arguments**

sc A spark\_connection.

name The name to assign to the newly generated table.

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

options A list of strings with additional options. See http://spark.apache.org/

docs/latest/sql-programming-guide.html#configuration.

repartition The number of partitions used to distribute the generated table. Use 0 (the de-

fault) to avoid partitioning.

memory Boolean; should the data be loaded eagerly into memory? (That is, should the

table be cached?)

spark\_read\_source 133

overwrite Boolean; overwrite the table with the given name if it already exists?

columns A vector of column names or a named vector of column types.

schema A (java) read schema. Useful for optimizing read operation on nested data.

... Optional arguments; currently unused.

#### **Details**

You can read data from HDFS (hdfs://), S3 (s3a://), as well as the local file system (file://).

If you are reading from a secure S3 bucket be sure to set the following in your spark-defaults.conf spark.hadoop.fs.s3a.access.key, spark.hadoop.fs.s3a.secret.key or any of the methods outlined in the aws-sdk documentation Working with AWS credentials In order to work with the newer s3a:// protocol also set the values for spark.hadoop.fs.s3a.impl and spark.hadoop.fs.s3a.endpoint . In addition, to support v4 of the S3 api be sure to pass the -Dcom.amazonaws.services.s3.enableV4 driver options for the config key spark.driver.extraJavaOptions For instructions on how to configure s3n:// check the hadoop documentation: s3n authentication properties

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark_read_source	Read from a generic source into a Spark DataFrame.	

#### **Description**

Read from a generic source into a Spark DataFrame.

### Usage

```
spark_read_source(sc, name, source, options = list(), repartition = 0,
memory = TRUE, overwrite = TRUE, columns = NULL, ...)
```

### **Arguments**

SC	A spark_connection.
name	The name to assign to the newly generated table.
source	A data source capable of reading data.
options	A list of strings with additional options. See http://spark.apache.org/docs/latest/sql-programming-guide.html#configuration.
repartition	The number of partitions used to distribute the generated table. Use 0 (the default) to avoid partitioning.

134 spark\_read\_table

memory Boolean; should the data be loaded eagerly into memory? (That is, should the table be cached?)

overwrite Boolean; overwrite the table with the given name if it already exists?

A vector of column names or a named vector of column types.

Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_read\_table Reads from a Spark Table into a Spark DataFrame.

### **Description**

Reads from a Spark Table into a Spark DataFrame.

#### Usage

```
spark_read_table(sc, name, options = list(), repartition = 0,
  memory = TRUE, overwrite = TRUE, columns = NULL, ...)
```

### Arguments

sc A spark\_connection. name The name to assign to the newly generated table. options A list of strings with additional options. See http://spark.apache.org/ docs/latest/sql-programming-guide.html#configuration. The number of partitions used to distribute the generated table. Use 0 (the derepartition fault) to avoid partitioning. Boolean; should the data be loaded eagerly into memory? (That is, should the memory table be cached?) Boolean; overwrite the table with the given name if it already exists? overwrite A vector of column names or a named vector of column types. columns Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_read\_text 135

spark_read_text Read a Text file into a Spark DataFrame
---------------------------------------------------------

# Description

Read a text file into a Spark DataFrame.

#### Usage

```
spark_read_text(sc, name, path, repartition = 0, memory = TRUE,
  overwrite = TRUE, ...)
```

### **Arguments**

sc	A spark_connection.
name	The name to assign to the newly generated table.
path	The path to the file. Needs to be accessible from the cluster. Supports the '"hdfs://"', '"s3a://"' and '"file://"' protocols.
repartition	The number of partitions used to distribute the generated table. Use $0$ (the default) to avoid partitioning.
memory	Boolean; should the data be loaded eagerly into memory? (That is, should the table be cached?)
overwrite	Boolean; overwrite the table with the given name if it already exists?
	Optional arguments; currently unused.

### **Details**

You can read data from HDFS (hdfs://), S3 (s3a://), as well as the local file system (file://).

If you are reading from a secure S3 bucket be sure to set the following in your spark-defaults.conf spark.hadoop.fs.s3a.access.key, spark.hadoop.fs.s3a.secret.key or any of the methods outlined in the aws-sdk documentation Working with AWS credentials In order to work with the newer s3a:// protocol also set the values for spark.hadoop.fs.s3a.impl and spark.hadoop.fs.s3a.endpoint . In addition, to support v4 of the S3 api be sure to pass the -Dcom.amazonaws.services.s3.enableV4 driver options for the config key spark.driver.extraJavaOptions For instructions on how to configure s3n:// check the hadoop documentation: s3n authentication properties

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_table\_name

spark_save_table Saves a Spark DataFrame as a Spark table
-----------------------------------------------------------

#### **Description**

Saves a Spark DataFrame and as a Spark table.

### Usage

```
spark_save_table(x, path, mode = NULL, options = list())
```

### **Arguments**

x A Spark DataFrame or dplyr operation

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

options A list of strings with additional options.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark_table_name	Generate a Table Name from Expression	
------------------	---------------------------------------	--

### Description

Attempts to generate a table name from an expression; otherwise, assigns an auto-generated generic name with "sparklyr\_" prefix.

#### Usage

```
spark_table_name(expr)
```

### **Arguments**

expr The expression to attempt to use as name

spark\_version 137

spark\_version

Get the Spark Version Associated with a Spark Connection

### **Description**

Retrieve the version of Spark associated with a Spark connection.

### Usage

```
spark_version(sc)
```

### **Arguments**

sc

A spark\_connection.

#### **Details**

Suffixes for e.g. preview versions, or snapshotted versions, are trimmed – if you require the full Spark version, you can retrieve it with invoke(spark\_context(sc), "version").

### Value

The Spark version as a numeric\_version.

```
spark_version_from_home
```

Get the Spark Version Associated with a Spark Installation

# Description

Retrieve the version of Spark associated with a Spark installation.

### Usage

```
spark_version_from_home(spark_home, default = NULL)
```

# Arguments

spark\_home

The path to a Spark installation.

default

The default version to be inferred, in case version lookup failed, e.g. no Spark

installation was found at spark\_home.

spark\_write\_csv

spa	rk_	_web

Open the Spark web interface

### **Description**

Open the Spark web interface

### Usage

```
spark_web(sc, ...)
```

### **Arguments**

sc A spark\_connection.

... Optional arguments; currently unused.

spark\_write\_csv

Write a Spark DataFrame to a CSV

### Description

Write a Spark DataFrame to a tabular (typically, comma-separated) file.

# Usage

```
spark_write_csv(x, path, header = TRUE, delimiter = ",", quote = "\"",
  escape = "\\", charset = "UTF-8", null_value = NULL,
  options = list(), mode = NULL, partition_by = NULL, ...)
```

# **Arguments**

x A Spark DataFrame or dplyr operation

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

header Should the first row of data be used as a header? Defaults to TRUE.

delimiter The character used to delimit each column, defaults to ,.

quote The character used as a quote, defaults to "hdfs://".

escape The character used to escape other characters, defaults to \.

The character asea to escape other characters, actualts to

charset The character set, defaults to "UTF-8".

null\_value The character to use for default values, defaults to NULL.

options A list of strings with additional options.

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mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_write\_jdbc

Writes a Spark DataFrame into a JDBC table

### **Description**

Writes a Spark DataFrame into a JDBC table.

### Usage

```
spark_write_jdbc(x, name, mode = NULL, options = list(),
   partition_by = NULL, ...)
```

### **Arguments**

x A Spark DataFrame or dplyr operation

name The name to assign to the newly generated table.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

options A list of strings with additional options.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

. . . Optional arguments; currently unused.

spark\_write\_json

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_write\_json Write a Spark DataFrame to a JSON file

**Description** 

Serialize a Spark DataFrame to the JavaScript Object Notation format.

#### Usage

```
spark_write_json(x, path, mode = NULL, options = list(),
  partition_by = NULL, ...)
```

### Arguments

x A Spark DataFrame or dplyr operation

The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

options A list of strings with additional options.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_parquet, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark\_write\_parquet 141

spark_write_parquet W	Vrite a Spark	DataFrame to a	Parquet file
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# Description

Serialize a Spark DataFrame to the Parquet format.

### Usage

```
spark_write_parquet(x, path, mode = NULL, options = list(),
   partition_by = NULL, ...)
```

### **Arguments**

X	A Spark DataFrame or dplyr operation
path	The path to the file. Needs to be accessible from the cluster. Supports the "hdfs://", "s3a://" and "file://" protocols.
mode	A character element. Specifies the behavior when data or table already exists. Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that 'overwrite' will also change the column structure.
	For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.html#save-modes for your version of Spark.
options	A list of strings with additional options. See http://spark.apache.org/docs/latest/sql-programming-guide.html#configuration.
partition_by	A character vector. Partitions the output by the given columns on the file system.
	Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_source, spark\_write\_table, spark\_write\_text

spark_write_source	Writes a Spark DataFrame into a generic source	
--------------------	------------------------------------------------	--

# Description

Writes a Spark DataFrame into a generic source.

spark\_write\_table

#### Usage

```
spark_write_source(x, source, mode = NULL, options = list(),
   partition_by = NULL, ...)
```

#### **Arguments**

x A Spark DataFrame or dplyr operationsource A data source capable of reading data.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

options A list of strings with additional options.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_table, spark\_write\_text

spark\_write\_table

Writes a Spark DataFrame into a Spark table

#### **Description**

Writes a Spark DataFrame into a Spark table.

#### Usage

```
spark_write_table(x, name, mode = NULL, options = list(),
  partition_by = NULL, ...)
```

# Arguments

x A Spark DataFrame or dplyr operation

name The name to assign to the newly generated table.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

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options A list of strings with additional options.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_text

spark\_write\_text

Write a Spark DataFrame to a Text file

#### **Description**

Serialize a Spark DataFrame to the plain text format.

#### Usage

```
spark_write_text(x, path, mode = NULL, options = list(),
  partition_by = NULL, ...)
```

### **Arguments**

x A Spark DataFrame or dplyr operation

path The path to the file. Needs to be accessible from the cluster. Supports the

"hdfs://", "s3a://" and "file://" protocols.

mode A character element. Specifies the behavior when data or table already exists.

Supported values include: 'error', 'append', 'overwrite' and ignore. Notice that

'overwrite' will also change the column structure.

For more details see also http://spark.apache.org/docs/latest/sql-programming-guide.

html#save-modes for your version of Spark.

options A list of strings with additional options.

partition\_by A character vector. Partitions the output by the given columns on the file

system.

... Optional arguments; currently unused.

#### See Also

Other Spark serialization routines: spark\_load\_table, spark\_read\_csv, spark\_read\_jdbc, spark\_read\_json, spark\_read\_libsvm, spark\_read\_parquet, spark\_read\_source, spark\_read\_table, spark\_read\_text, spark\_save\_table, spark\_write\_csv, spark\_write\_jdbc, spark\_write\_json, spark\_write\_parquet, spark\_write\_source, spark\_write\_table

tbl\_cache

src\_databases

Show database list

### **Description**

Show database list

### Usage

```
src_databases(sc, ...)
```

### **Arguments**

sc A spark\_connection.

... Optional arguments; currently unused.

tbl\_cache

Cache a Spark Table

# Description

Force a Spark table with name name to be loaded into memory. Operations on cached tables should normally (although not always) be more performant than the same operation performed on an uncached table.

# Usage

```
tbl_cache(sc, name, force = TRUE)
```

# **Arguments**

sc  $A \, spark\_connection.$ 

name The table name.

force Force the data to be loaded into memory? This is accomplished by calling the

count API on the associated Spark DataFrame.

tbl\_change\_db

tbl\_change\_db

Use specific database

# Description

Use specific database

# Usage

```
tbl_change_db(sc, name)
```

# Arguments

sc A spark\_connection. name The database name.

tbl\_uncache

Uncache a Spark Table

# Description

Force a Spark table with name name to be unloaded from memory.

# Usage

```
tbl_uncache(sc, name)
```

# Arguments

sc A spark\_connection.

name The table name.

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