

Package ‘fuzzylink’

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Title Probabilistic Record Linkage Using Pretrained Text Embeddings

Version 0.2.1

Description

Links datasets through fuzzy string matching using pretrained text embeddings. Produces more accurate record linkage when lexical string distance metrics are a poor guide to match quality (e.g., ‘‘Patricia’’ is more lexically similar to ‘‘Patrick’’ than it is to ‘‘Trish’’). Capable of performing multilingual record linkage. Methods are described in Ornstein (2025) <<https://joeornstein.github.io/publications/fuzzylink.pdf>>.

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Imports stats, utils, dplyr, Rfast, reshape2, stringdist, stringr, httr, jsonlite, httr2, ranger

Depends R (>= 4.1.0)

URL <https://github.com/joeornstein/fuzzylink>

BugReports <https://github.com/joeornstein/fuzzylink/issues>

NeedsCompilation no

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check_match	<i>Test whether two strings match with an LLM prompt.</i>
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Description

Test whether two strings match with an LLM prompt.

Usage

```
check_match(
  string1,
  string2,
  model = "gpt-4o-2024-11-20",
  record_type = "entity",
  instructions = NULL,
  openai_api_key = Sys.getenv("OPENAI_API_KEY"),
  parallel = TRUE
)
```

Arguments

string1	A string or vector of strings
string2	A string or vector of strings
model	Which LLM to prompt; defaults to 'gpt-4o-2024-11-20'
record_type	A character describing what type of entity string1 and string2 represent. Should be a singular noun (e.g. "person", "organization", "interest group", "city").
instructions	A string containing additional instructions to include in the LLM prompt.
openai_api_key	Your OpenAI API key. By default, looks for a system environment variable called "OPENAI_API_KEY" (recommended option). Otherwise, it will prompt you to enter the API key as an argument.
parallel	TRUE to submit API requests in parallel. Setting to FALSE can reduce rate limit errors at the expense of longer runtime.

Value

A vector the same length as string1 and string2. "Yes" if the pair of strings match, "No" otherwise.

Examples

```
## Not run:
check_match('UPS', 'United Parcel Service')
check_match('UPS', 'United States Postal Service')
check_match(c('USPS', 'USPS', 'USPS'),
            c('Post Office', 'United Parcel', 'US Postal Service'))

## End(Not run)
```

dot

Compute the dot product between two vectors

Description

Compute the dot product between two vectors

Usage

```
dot(vec1, vec2)
```

Arguments

vec1	A numeric vector
vec2	Another numeric vector

Value

A numeric

Examples

```
dot(c(0,1), c(1,0))
```

fuzzylink

Probabilistic Record Linkage Using Pretrained Text Embeddings

Description

Probabilistic Record Linkage Using Pretrained Text Embeddings

Usage

```
fuzzylink(
  dfA,
  dfB,
  by,
  blocking.variables = NULL,
  verbose = TRUE,
  record_type = "entity",
  instructions = NULL,
  model = "gpt-4o-2024-11-20",
  openai_api_key = Sys.getenv("OPENAI_API_KEY"),
  embedding_dimensions = 256,
  embedding_model = "text-embedding-3-large",
  learner = "glm",
  fmla = match ~ sim + jw,
  max_labels = 10000,
  parallel = TRUE,
  return_all_pairs = FALSE
)
```

Arguments

<code>dfA, dfB</code>	A pair of data frames or data frame extensions (e.g. tibbles)
<code>by</code>	A character denoting the name of the variable to use for fuzzy matching
<code>blocking.variables</code>	A character vector of variables that must match exactly in order to match two records
<code>verbose</code>	TRUE to print progress updates, FALSE for no output
<code>record_type</code>	A character describing what type of entity the <code>by</code> variable represents. Should be a singular noun (e.g. "person", "organization", "interest group", "city").
<code>instructions</code>	A string containing additional instructions to include in the LLM prompt during validation.
<code>model</code>	Which LLM to prompt when validating matches; defaults to 'gpt-4o-2024-11-20',
<code>openai_api_key</code>	Your OpenAI API key. By default, looks for a system environment variable called "OPENAI_API_KEY" (recommended option). Otherwise, it will prompt you to enter the API key as an argument.
<code>embedding_dimensions</code>	The dimension of the embedding vectors to retrieve. Defaults to 256
<code>embedding_model</code>	Which pretrained embedding model to use; defaults to 'text-embedding-3-large' (OpenAI), but will also accept 'mistral-embed' (Mistral).
<code>learner</code>	Which supervised learner should be used to predict match probabilities. Defaults to logistic regression ('glm'), but will also accept random forest ('ranger').

fm1a	By default, logistic regression model predicts whether two records match as a linear combination of embedding similarity and Jaro-Winkler similarity ($\text{match} \sim \text{sim} + \text{jw}$). Change this input for alternate specifications.
max_labels	The maximum number of LLM prompts to submit when labeling record pairs. Defaults to 10,000
parallel	TRUE to submit API requests in parallel. Setting to FALSE can reduce rate limit errors at the expense of longer runtime.
return_all_pairs	If TRUE, returns <i>every</i> within-block record pair from dfA and dfB, not just validated pairs. Defaults to FALSE.

Value

A dataframe with all rows of dfA joined with any matches from dfB

Examples

```
## Not run:
dfA <- data.frame(state.x77)
dfA$name <- rownames(dfA)
dfB <- data.frame(name = state.abb, state.division)
df <- fuzzylink(dfA, dfB,
               by = 'name',
               record_type = 'US state government',
               instructions = 'The second dataset contains US postal codes.')

## End(Not run)
```

get_embeddings	<i>Get pretrained text embeddings</i>
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Description

Get pretrained text embeddings from the OpenAI or Mistral API. Automatically batches requests to handle rate limits.

Usage

```
get_embeddings(
  text,
  model = "text-embedding-3-large",
  dimensions = 256,
  openai_api_key = Sys.getenv("OPENAI_API_KEY"),
  parallel = TRUE
)
```

Arguments

text	A character vector
model	Which embedding model to use. Defaults to 'text-embedding-3-large'.
dimensions	The dimension of the embedding vectors to return. Defaults to 256. Note that the 'mistral-embed' model will always return 1024 vectors.
openai_api_key	Your OpenAI API key. By default, looks for a system environment variable called "OPENAI_API_KEY".
parallel	TRUE to submit API requests in parallel. Setting to FALSE can reduce rate limit errors at the expense of longer runtime.

Value

A matrix of embedding vectors (one per row).

Examples

```
## Not run:
embeddings <- get_embeddings(c('dog', 'cat', 'canine', 'feline'))
embeddings['dog',] |> dot(embeddings['canine',])
embeddings['dog',] |> dot(embeddings['feline',])

## End(Not run)
```

get_similarity_matrix *Create matrix of embedding similarities*

Description

Create a matrix of pairwise similarities between each string in strings_A and strings_B.

Usage

```
get_similarity_matrix(embeddings, strings_A = NULL, strings_B = NULL)
```

Arguments

embeddings	A matrix of text embeddings
strings_A	A string vector
strings_B	A string vector

Value

A matrix of cosine similarities between the embeddings of strings_A and the embeddings of strings_B

Examples

```
## Not run:
embeddings <- get_embeddings(c('UPS', 'USPS', 'Postal Service'))
get_similarity_matrix(embeddings)
get_similarity_matrix(embeddings, 'Postal Service')
get_similarity_matrix(embeddings, 'Postal Service', c('UPS', 'USPS'))

## End(Not run)
```

get_training_set *Create a training set*

Description

Creates a training set from a list of similarity matrices and labels it using a zero-shot GPT prompt.

Usage

```
get_training_set(
  sim,
  num_bins = 50,
  samples_per_bin = 10,
  n = 500,
  record_type = "entity",
  instructions = NULL,
  model = "gpt-3.5-turbo-instruct",
  openai_api_key = Sys.getenv("OPENAI_API_KEY"),
  parallel = TRUE
)
```

Arguments

sim	A matrix of similarity scores
num_bins	Number of bins to split similarity scores for stratified random sampling (defaults to 50)
samples_per_bin	Number of string pairs to sample from each bin (defaults to 5)
n	Sample size for the training dataset
record_type	A character describing what type of entity the rows and columns of sim represent. Should be a singular noun (e.g. "person", "organization", "interest group", "city").
instructions	A string containing additional instructions to include in the LLM prompt during validation.
model	Which OpenAI model to prompt; defaults to 'gpt-3.5-turbo-instruct'

openai_api_key	Your OpenAI API key. By default, looks for a system environment variable called "OPENAI_API_KEY" (recommended option). Otherwise, it will prompt you to enter the API key as an argument.
parallel	TRUE to submit API requests in parallel. Setting to FALSE can reduce rate limit errors at the expense of longer runtime.

Value

A dataset with string pairs A and B, along with a match column indicating whether they match.

hand_label	<i>Hand Label A Dataset</i>
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Description

This function prompts the user to manually label a set of name pairs through the R console.

Usage

```
hand_label(df)
```

Arguments

df	A dataframe with a column called A and a column called B
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Value

A labeled dataframe (match column)

mistral_api_key	<i>Install a MISTRAL API KEY in Your .Renvirom File for Repeated Use</i>
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Description

This function will add your Mistral API key to your .Renvirom file so it can be called securely without being stored in your code. After you have installed your key, it can be called any time by typing `Sys.getenv("MISTRAL_API_KEY")` and will be automatically called in package functions. If you do not have an .Renvirom file, the function will create one for you. If you already have an .Renvirom file, the function will append the key to your existing file, while making a backup of your original file for disaster recovery purposes.

Usage

```
mistral_api_key(key, overwrite = FALSE, install = FALSE)
```


Arguments

key	The API key provided to you from Mistral formatted in quotes. A key can be acquired at https://console.mistral.ai/api-keys/
overwrite	If this is set to TRUE, it will overwrite an existing MISTRAL_API_KEY that you already have in your .Renvirom file.
install	if TRUE, will install the key in your .Renvirom file for use in future sessions. Defaults to FALSE.

Value

No return value, called for side effects.

Examples

```
## Not run:
mistral_api_key("111111abc", install = TRUE)
# First time, reload your environment so you can use the key without restarting R.
readRenvirom("~/Renvirom")
# You can check it with:
Sys.getenv("MISTRAL_API_KEY")

## End(Not run)

## Not run:
# If you need to overwrite an existing key:
mistral_api_key("111111abc", overwrite = TRUE, install = TRUE)
# First time, reload your environment so you can use the key without restarting R.
readRenvirom("~/Renvirom")
# You can check it with:
Sys.getenv("MISTRAL_API_KEY")

## End(Not run)
```

openai_api_key

Install an OPENAI API KEY in Your .Renvirom File for Repeated Use

Description

This function will add your OpenAI API key to your .Renvirom file so it can be called securely without being stored in your code. After you have installed your key, it can be called any time by typing `Sys.getenv("OPENAI_API_KEY")` and will be automatically called in package functions. If you do not have an .Renvirom file, the function will create one for you. If you already have an .Renvirom file, the function will append the key to your existing file, while making a backup of your original file for disaster recovery purposes.

Usage

```
openai_api_key(key, overwrite = FALSE, install = FALSE)
```

Arguments

key	The API key provided to you from OpenAI formatted in quotes.
overwrite	If this is set to TRUE, it will overwrite an existing OPENAI_API_KEY that you already have in your .Renvirom file.
install	if TRUE, will install the key in your .Renvirom file for use in future sessions. Defaults to FALSE.

Value

No return value, called for side effects.

Examples

```
## Not run:
openai_api_key("111111abc", install = TRUE)
# First time, reload your environment so you can use the key without restarting R.
readRenvirom("~/Renvirom")
# You can check it with:
Sys.getenv("OPENAI_API_KEY")

## End(Not run)

## Not run:
# If you need to overwrite an existing key:
openai_api_key("111111abc", overwrite = TRUE, install = TRUE)
# First time, reload your environment so you can use the key without restarting R.
readRenvirom("~/Renvirom")
# You can check it with:
Sys.getenv("OPENAI_API_KEY")

## End(Not run)
```

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