# Package 'AlphaMissenseR'

November 1, 2024

```
Title Accessing AlphaMissense Data Resources in R
Version 1.2.0
Description The AlphaMissense publication
      <https://www.science.org/doi/epdf/10.1126/science.adg7492>
      outlines how a variant of AlphaFold / DeepMind was used to predict
      missense variant pathogenicity. Supporting data on Zenodo
      <a href="https://zenodo.org/record/10813168">https://zenodo.org/record/10813168</a> include, for instance, 71M
      variants across hg19 and hg38 genome builds. The 'AlphaMissenseR'
      package allows ready access to the data, downloading individual
      files to DuckDB databases for exploration and integration into *R*
      and *Bioconductor* workflows.
License Artistic-2.0
URL https://mtmorgan.github.io/AlphaMissenseR/
BugReports https://github.com/mtmorgan/AlphaMissenseR/issues
Depends R (>= 4.3.0), dplyr
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Suggests BiocManager, BiocGenerics, GenomicRanges, GenomeInfoDb,
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```
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af\_predictions

AlphaFold Protein Structure Retrieval and Display

# Description

af\_predictions() retrieves information about AlphaFold predictions associated with UniProt accession identifiers.

af\_prediction\_view() summarizes effects of possible amino acid changes in a single UniProt protein. The changes are displayed on the AlphaFold-predicted structure.

af\_colorfunc\_by\_position() generates a Javascript function to be used in rd3mol::m\_set\_style() to color residues by position, e.g., when visualizing median predicted pathogenicity.

# Usage

```
af_predictions(uniprot_ids)
af_prediction_view(tbl, bfc = BiocFileCache())
af_colorfunc_by_position(
   tbl,
   pos,
   value,
   pos_max = NULL,
   palette = colorspace::diverging_hcl(11),
   palette_min = NULL,
   palette_max = NULL
```

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### **Arguments**

uniprot\_ids

	bles).
tbl	A tibble containing information on the UniProt protein and AlphaMissense predicted amino acid effects.
	For av_prediction_view() the tibble must have columns uniprot_id, protein_variant, am_pathogenicity, and am_class, as in tibbles returned by am_data("hg38") or am_data("aa_substitutions"), for instance. The uniprot_id must contain a single unique value.
	For af_colorfunc_by_position() the tibble must have columns pos and value, as described below.
bfc	An object created with BiocFileCache::BiocFileCache(), representing the location used to cache PDB files retrieved by av_prediction_view(). The default is the BiocFileCache installation-wide location.
pos	the symbol or name of the column in tbl containing amino acid residue positions in the protein.
value	the symbol or name of the column in tbl containing values to be used for coloring amino acid residues in the protein.
pos_max	integer(1) the maximum residue position in the protein to be visualized. Default: the maximum value in pos.
palette	character() vector of colors to be used in visualization. The default (colorspace::diverging_hcl(1 produces colors ranging from blue (low) to red (high).

numeric(1) the value bounding the minimum palette color. The default is the minimum of value; a common value when plotting pathogenicity might be  $\emptyset$ . numeric(1) the value bounding the maximum palette color. The default is the

maximum of value; a common value when plotting pathogenicity might be 1.

character() UniProt accession identifiers (uniprot\_id in AlphaMissense ta-

#### **Details**

palette\_min

palette\_max

af\_predictions() queries the prediction endpoint of the AlphaFold API described at <a href="https://alphafold.ebi.ac.uk/api-docs">https://alphafold.ebi.ac.uk/api-docs</a>.

af\_prediction\_view() uses tbl to calculate median pathogenicity at each amino acid position, using am\_aa\_pathogenicity(). Predicted protein structure is retrieved from the unique uniprot\_id using af\_predictions() and the pdbUrl returned by that function. Protein structure is visualized using the r3dmol https://cran.R-project.org/package=r3dmol package. Amino acids are colored using aa\_pathogenicity\_median and af\_colorfunc\_by\_position() with default palette defined on the interval 0, 1.

af\_colorfunc\_by\_position() uses a template mechanism to inject a vector of position-specific colors into a Javascript function used by r3dmol::m\_set\_style()/r3dmol::m\_style\_cartoon() to color residues by position. Positions for which no color is specified are colored 'gray'. The template can be seen with AlphaMissenseR:::js\_template("colorfunc").

#### Value

af\_predictions() returns a tibble. Each row represents the AlphaFold prediction associated with the corresponding uniprot accession. Columns include:

- entryId: AlphaFold identifier.
- gene: gene symbol corresponding to UniProt protein.

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• uniprotAccession, uniprotId, uniprotDescription: UniProt characterization. AlphaMissense's uniprot\_id is AlphaFold's uniprotAccession.

- taxId, organismScientificName: Organism information.
- uniprotStart, uniprotEnd, uniprotSequence: protein sequence information.
- modelCreatedDate, latestVersion, allVersions, isReviewed, isReferenceProteome: AlphaFold provenance information.
- cifUrl, bcifUrl, pdbUrl: URLs to AlphaFold 3-dimensional molecular representations.
- paeImageUrl, paeDocUrl: 'Predicted Aligned Error' heat map and underlying data. These can be used to assess the confidence in relative orientation of residues in different domains, as described in part in the AlphaFold FAQ https://alphafold.ebi.ac.uk/faq

af\_prediction\_view() displays an interactive view of the protein in an RStudio panel or browser tab.

af\_colorfunc\_by\_position() returns a character(1) vector representation of the Javascript function, with color vector injected.

#### **Examples**

```
## af_predictions
uniprot_ids <-
    am_data("aa_substitutions") |>
    dplyr::filter(uniprot_id %like% "P3555%") |>
    dplyr::distinct(uniprot_id) |>
    pull(uniprot_id)
af_predictions(uniprot_ids)
## af_prediction_view()
P35557 <-
    am_data("hg38") |>
    dplyr::filter(uniprot_id == "P35557")
af_prediction_view(P35557)
## no AlphaFold prediction for this protein
P35555 <-
    am_data("aa_substitutions") |>
    dplyr::filter(uniprot_id == "P35555")
tryCatch({
    af_prediction_view(P35555)
}, error = identity)
## af_colorfunc_by_position()
df <- tibble(</pre>
    pos = 1 + 1:10, # no color information for position 1
    value = 10:1 / 10
colorfunc <- af_colorfunc_by_position(</pre>
    df,
    "pos", "value",
    pos_max = 12
                    # no color information for position 12
```

```
)
cat(colorfunc)
## template used for Javascript function
cat(
    AlphaMissenseR:::js_template("colorfunc", colors = "..."),
    "\n"
)
```

ALPHAMISSENSE\_RECORD Retrieve AlphaMissense Resources as DuckDB Databases

## **Description**

ALPHAMISSENSE\_RECORD is a constant identifier corresponding to the default version of the AlphaMissense resource to use.

am\_browse() opens a web browser at the Zenodo record for the AlphaMissense data.

am\_available() reports available datasets in the record.

am\_data() retrieves a single key from the the AlpahMissense Zenodo site and parses the file into a DuckDB database.

## Usage

```
ALPHAMISSENSE_RECORD
am_browse(record = ALPHAMISSENSE_RECORD)
am_available(record = ALPHAMISSENSE_RECORD, bfc = BiocFileCache())
am_data(
    key,
    record = ALPHAMISSENSE_RECORD,
    bfc = BiocFileCache(),
    as = c("tbl", "tsv")
)
```

# **Arguments**

record	character(1) Zenodo record for the AlphaMissense data resources.
bfc	an object returned by BiocFileCache() representing the location where downloaded files and the parsed database will be stored. The default is the 'global' BiocFileCache.
key	a character(1) 'key' from the result of $am_available()$ , or a single row of the tibble returned by $am_available()$ .
as	chracter(1) type of return value.

- "tbl": a dbplyr tbl representation of the database resource.
- "tsv": path to the tsv.gz file representing the resource and downloaded from Zenodo

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#### **Format**

An object of class character of length 1.

#### **Details**

ALPHAMISSENSE\_RECORD can be set **before the package is loaded** with the environment variable of the same name, e.g., Sys.setenv(ALPHAMISSENSE\_RECORD = "10813168"). The default is the most recent version (version 3) as checked on 11 April, 2024.

am\_data() uses BiocFileCache to download and store the file and the corresponding DuckDB database.

#### Value

am\_available() returns a tibble with columns key, size, and link. The meaning of key must be determined with reference to the information at am\_browse().

am\_data() returns a dbplyr (database) tibble represented the downloaded and parsed file. Fields in the database are as described on the Zenodo resource page.

# **Examples**

```
ALPHAMISSENSE_RECORD

if (interactive())
    am_browse()

am_available()

am_data("hg38")

## close the connection opened when adding the data db_disconnect()
```

 $am\_aa\_pos$ 

Common Amino Acid-level Transformations

# Description

am\_aa\_pos() separates protein\_variant columns into amino acide 'pos', 'ref', and 'alt' columns. am\_aa\_pathogenicity() summarizes pathogenicity scores at each protein amino acid position.

# Usage

```
am_aa_pos(tbl)
am_aa_pathogenicity(tbl)
```

# Arguments

tbl

a tibble, usually derived from am\_data("aa\_substitutions"), 'am\_data("hg38"), etc. See details.

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#### **Details**

tbl is collect()ed before computation, so all rows must fit into memory.

For am\_aa\_pos(), tbl must contain a column protein\_variant with entries in the form "Q465H", as in the AlphaMissense data.

For am\_aa\_pathogenicity(), tbl must contain columns uniprot\_id, protein\_variant, am\_pathogenicity and am\_class. If am\_pos and friends are not already calculated, then am\_aa\_pos() is called.

#### Value

am\_aa\_pos() returns the original table with additional columns

- aa\_pos: the position of the protein variant, as an integer().
- aa\_ref: the single-character reference amino acid in the protein variant.
- aa\_alt: the single-character alternate amino acid in the protein variant.

am\_aa\_pathogenicity() returns a tibble with columns

- uniprot\_id, aa\_pos, aa\_ref: the UniProt id, and the position and reference amino acid being summarized
- aa\_pathogenicity\_n, aa\_pathogenicity\_mean, aa\_pathogenicity\_median, aa\_pathogenicity\_min, aa\_pathogenicity\_max: the number, average, median, minimum, and maximum of the pathogenicity scores at each amino acid position.
- aa\_pathogenicity\_mode: the modal am\_class at the amino acid position, as a factor. Tied mode is assigned to lower pathogenicity.

# **Examples**

```
P35557 <-
    am_data("hg38") |>
    filter(uniprot_id %in% "P35557")

am_aa_pos(P35557)

am_aa_pos(P35557) |>
    select(
        uniprot_id, POS, REF, ALT, protein_variant, starts_with("aa_"), am_pathogenicity, am_class
) |>
    arrange(aa_pos)

am_aa_pathogenicity(P35557)
```

clinvar\_data

Integrate ClinVar Labels with AlphaMissense Pathogenicity Scores

### **Description**

clinvar\_data() loads ClinVar information from the supplemental table of the AlphaMissense [2023] paper.

clinvar\_plot() integrates ClinVar classifications with AlphaMissense predicted scores derived from am\_data("aa\_substitutions") and returns a ggplot object for visualization.

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#### Usage

```
clinvar_data(record = ALPHAMISSENSE_RECORD, bfc = BiocFileCache())
clinvar_plot(uniprotId, alphamissense_table, clinvar_table)
```

#### **Arguments**

record character(1) Zenodo record for the AlphaMissense data resources.

bfc an object returned by BiocFileCache() representing the location of the Al-

phaMissenseR database. The default is the 'global' BiocFileCache.

uniprotId character() a valid UniProt accession identifier.

alphamissense\_table

a table containing AlphaMissense predictions for protein variants. By default, the table is derived from am\_data("aa\_substitution"). Alternatively, a user-

defined tibble::tbl\_df or data.frame can be supplied.

clinvar\_table a table containing ClinVar information. By default, the table is derived from

the supplemental data of the AlphaMissense paper. Alternatively, a user-defined

tibble::tbl\_df or data.frame can be supplied.

#### **Details**

For clinvar\_plot(), alphamissense\_table columns must include:

- uniprot\_id: UniProt accession identifier.
- protein\_variant: variant identifier string, with protein position in the middle, and the reference and mutant amino acid residues to the left and right of the position, respectively.
- am\_class: AlphaMissense classification of either "benign", "ambiguous", or "pathogenic".
- am\_pathogenicity: AlphaMissense predicted score.

clinvar\_table columns must include:

- uniprot\_id: UniProt accession identifier, matching alphamissense\_table.
- protein\_variant: variant identifier string, matching alphamissense\_table format.
- cv\_class: binary ClinVar classification of "benign" or "pathogenic".

### Value

clinvar\_data() returns a tbl with 82872 rows and 5 variables:

- variant\_id: ClinVar variant identifier.
- transcript\_id: Ensembl transcript identifier.
- protein\_variant: UniProt accession:protein variant identifier.
- AlphaMissense: AlphaMissense pathogenicity score.
- label: Binary ClinVar class, either "benign" or "pathogenic".

clinvar\_plot() returns a ggplot object which overlays ClinVar classifications onto AlphaMissense predicted scores. Blue, gray, and red colors represent pathogenicity classifications for "likely benign", "ambiguous", or "likely pathogenic", respectively. Large, bolded points are ClinVar variants colored according to their clinical classification, while smaller points in the background are AlphaMissense predictions.

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#### References

Cheng et al., Accurate proteome-wide missense variant effect prediction with AlphaMissense. *Science* 381, eadg7492. DOI:10.1126/science.adg7492.

## **Examples**

```
clinvar_data()
alphamissense_table <- am_data("aa_substitutions")
clinvar_plot(
   uniprotId = "P37023",
   alphamissense_table = alphamissense_table
)</pre>
```

db\_connect

Manipulate the Database of Missense Mutations

# **Description**

db\_connect() manages connections to AlphaMissense record-specific databases. By default, connections are created once and reused.

db\_tables() queries for the names of temporary and regular tables defined in the database.

db\_temporary\_table() creates a temporary (for the duration of the duckdb connection) table from a tibble.

db\_range\_join() performs a range join, finding all positions in key within ranges defined by join. The result is stored in table to.

db\_disconnect() disconnects the duckdb database and shuts down the DuckDB server associated with the connection. Temporary tables are lost.

db\_disconnect\_all() disconnects all managed duckdb database connection.

# Usage

```
db_connect(
    record = ALPHAMISSENSE_RECORD,
    bfc = BiocFileCache(),
    read_only = TRUE,
    managed = read_only
)

db_tables(db = db_connect())

db_temporary_table(db, value, to)

db_range_join(db, key, join, to)

db_disconnect(db = db_connect())
```

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### **Arguments**

character(1) Zenodo record for the AlphaMissense data resources. record bfc an object returned by BiocFileCache() representing the location where downloaded files and the parsed database will be stored. The default is the 'global' BiocFileCache. logical(1) open the connection 'read only'. TRUE protects against overwriting read\_only existing data and is the default. logical(1) when TRUE, re-use an existing managed connection to the same database. managed db duckdb\_connection object, returned by db\_connect(). a data. frame / tibble containing data to be placed in a temporary table, e.g., value from a GenomicRanges object to be used in a range join.

the character(1) name of the table to be created

key a character(1) table name in db containing missense mutation coordinates.

join a character(1) table name in db containing ranges to be used for joining with

(filtering) key.

#### **Details**

to

For db\_connect(), set managed = FALSE when, for instance, accessing a database in a separate process. Remember to capture the database connection db\_unmanaged <- db\_connect(managed = FALSE) and disconnect when done 'db\_disconnect(db\_unmanaged). Connections are managed by default.

db\_temporary\_table() **overwrites** an existing table with name to.

db\_range\_join() **overwrites** an existing table to. The table key is usually "hg19" or "hg38" and must have CHROM and POS columns. The table join must have columns CHROM, start and end. Following *Bioconductor* convention and as reported in am\_browse(), coordinates are 1-based and ranges defined by start and end are closed. All columns from both key and join are included, so column names (other than CHROM) cannot be duplicated.

db\_disconnect() should be called on each unmanaged connection, and once (to free the default managed connection) at the end of a session.

### Value

db\_connect() returns an open duckdb\_connection to the AlphaMissense record-specific database.

db\_tables() returns a character vector of database table names.

db\_temporary\_table() returns the temporary table as a dbplyr tibble.

db\_range\_join() returns to (the temporary table created from the join) as a dbplyr tibble.

db\_disconnect() returns FALSE if the connection has already been closed or is not valid (via dbIsValid()) or TRUE if disconnection is successful. Values are returned invisibly.

db\_disconnect\_all() returns the db\_disconnect() value for each connection, invisibly.

#### **Examples**

```
db_connect()  # default 'read-only' connection

db_rw <- db_connect(read_only = FALSE)

am_data("hg38")  # uses the default, 'read-only' connection</pre>
```

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```
db_tables()
                      # connections initially share the same tables
db_tables(db_rw)
## ranges of interest -- the first 200000 bases on chromsomes 1-4.
ranges <- tibble(</pre>
   CHROM = paste0("chr", 1:4),
    start = rep(1, 4),
    end = rep(200000, 4)
db_temporary_table(db_rw, ranges, "ranges")
db_tables(db_rw)
                      # temporary table available to the db_rw connection...
db_tables()
                      # ...but not to the read-only connection
rng <- db_range_join(db_rw, "hg38", "ranges", "ranges_overlaps")</pre>
rng
rng |>
    count(CHROM) |>
    arrange(CHROM)
db_disconnect(db_rw) # explicit read-write connection
db_disconnect()
                      # implicit read-only connection
db_disconnect_all()
```

gosling\_plot

Plot a GPos or GRanges Object Using Shiny and Gosling

# **Description**

plot\_granges() creates a Shiny app that displays a Gosling plot of a given GRanges object. It visualizes genomic ranges with both rectangle and point representations, and allows for customization of the plot title and subtitle.

## Usage

```
gosling_plot(
  granges,
  title = "GRanges Plot",
  subtitle = "Stacked nucleotide example",
  plot_type = c("bar", "lollipop"),
  create_app = interactive()
)
```

## **Arguments**

granges	A GenomicRanges::GRanges (e.g., GenomicRanges::GPos) object containing the genomic ranges to be plotted.
title	character(1) Title of the plot. Default is "GRanges Plot".
subtitle	character(1) The subtitle of the plot. Default is "Stacked nucleotide example".
plot_type	character(1) Select the type of gosling plot. Default is "bar"; available types are described in Details.

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create\_app logical(1) Produce a Shiny app for Gosling visualization. Default TRUE when used interactively.

## **Details**

The function supports 2 types of plots as selected through the plot\_type argument: (1) "bar": a barplot-like view of the pathogenicity score at each position, similar to a sequencing coverage plot, and (2) "lollipop": a lollipop plot focusing on the pathogenicity classification (ambiguous, benign, pathogenic) at each position. It requires that the GenomicRanges::GRanges object has the following metadata columns: 'am\_class' (effect classification), 'am\_pathogenicity' (pathogenicity score), 'ALT' (alternative allele) and 'REF' (reference allele).

## Value

gosling\_plot() with create\_app = TRUE returns a shinyApp object that, when run, displays the Gosling plot. When create\_app = FALSE, the (invisible) return value represents the gosling object to be used in Shiny apps.

#### Note

This function requires the shiny, shiny gosling, and GenomicRanges packages to be installed.

## **Examples**

```
## Create a sample GRanges object from AlphamissenseR
gpos <-
    am_data("hg38") |>
    filter(uniprot_id == "Q1W6H9") |>
    to_GPos()

## Plot `gpos` using shiny.gosling
if (requireNamespace("shiny.gosling", quietly = TRUE)) {
    gosling_plot(
        gpos, title = "Q1W6H_track", subtitle = "bar plot example",
        plot_type = "bar", create_app = FALSE
    )
}
```

to\_GPos

Create GenomicRanges Objects from AlphaMissense Annotations

#### **Description**

to\_GPos() coerces a tibble derived from am\_data("hg19") or am\_data("hg38") resources to GenomicRanges GPos objects.

## Usage

```
to_GPos(tbl)
```

to\_GPos

# Arguments

tbl

a tibble derived from  $am_data("hg19")$  or  $am_data("hg38")$ . The tibble must have columns CHROM, POS, and genome.

## Value

to\_GPos() returns a GPos object, which can be used in the same was a GRanges object for range-based filtering and annotation

# **Examples**

```
am_data("hg38") |>
  filter(CHROM == "chr2", POS < 10000000, REF == "G") |>
  select(-REF) |>
  to_GPos()
```

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