# Package 'alakazam'

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```
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Description Provides methods for high-throughput adaptive immune
      receptor repertoire sequencing (AIRR-Seq; Rep-Seq) analysis. In
      particular, immunoglobulin (Ig) sequence lineage reconstruction,
      lineage topology analysis, diversity profiling, amino acid property
      analysis and gene usage.
      Citations:
      Gupta and Vander Heiden, et al (2017) <doi:10.1093/bioinformatics/btv359>,
      Stern, Yaari and Vander Heiden, et al (2014) <doi:10.1126/scitranslmed.3008879>.
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# **R** topics documented:

| ABBREV_AA            |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 4  |
|----------------------|--|--|--|--|--|--|--|--|--|--|--|--|--|--|----|
| AbundanceCurve-class |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 4  |
| alakazam             |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 5  |
| aliphatic            |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 7  |
| alphaDiversity       |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 8  |
| aminoAcidProperties  |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 10 |
| baseTheme            |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 12 |
| buildPhylipLineage   |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 13 |
| bulk                 |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 15 |
| calcCoverage         |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 16 |
| calcDiversity        |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 17 |
| ChangeoClone-class   |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 18 |
| charge               |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 19 |
| checkColumns         |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 20 |
| collapseDuplicates   |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 21 |
| combineIgphyml       |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 23 |
| countClones          |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 24 |
| countGenes           |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 26 |
| countPatterns        |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 27 |
| cpuCount             |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 28 |
| DEFAULT_COLORS       |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 29 |
| DiversityCurve-class |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 30 |
| EdgeTest-class       |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 31 |
| estimateAbundance    |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 32 |
| Example10x           |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 33 |
| ExampleDh            |  |  |  |  |  |  |  |  |  |  |  |  |  |  | 34 |

| ExampleDbChangeo       35         ExampleTrees       36         extractVRegion       36         getAAMatrix       37         getDNAMatrix       38         getMRCA       39         getPathLengths       40         getPositionQuality       41 |
|---|
| extractVRegion 36 getAAMatrix 37 getDNAMatrix 38 getMRCA 39 getPathLengths 40 getPositionQuality 41   |
| getAAMatrix37getDNAMatrix38getMRCA39getPathLengths40getPositionQuality41  |
| getDNAMatrix 38 getMRCA 39 getPathLengths 40 getPositionQuality 41  |
| getMRCA39getPathLengths40getPositionQuality41   |
| getPathLengths  |
| getPositionQuality  |
|   |
|   |
| getSegment  |
| graphToPhylo  |
| gravy   |
| gridPlot  |
| groupGenes  |
| IMGT_REGIONS  |
| $is Valid AA Seq \ \dots \ $  |
| IUPAC_CODES   |
| junctionAlignment   |
| makeChangeoClone  |
| makeTempDir   |
| maskPositionsByQuality  |
| maskSeqEnds   |
| maskSeqGaps   |
| MRCATest-class  |
| nonsquareDist   |
| padSeqEnds  |
| pairwiseDist  |
| pairwiseEqual   |
| permuteLabels   |
| phyloToGraph  |
| plotAbundanceCurve  |
| plotDiversityCurve  |
| plotDiversityTest   |
| plotEdgeTest 70   |
| plotMRCATest  |
| plotSubtrees  |
| polar   |
| progressBar   |
| rarefyDiversity   |
| readChangeoDb   |
| readFastqDb   |
| readIgphyml   |
| seqDist   |
| seqEqual  |
| SingleDb  |
| sortGenes   |
| stoufferMeta  |
| summarizeSubtrees   |
| tableEdges  |

4 AbundanceCurve-class

|       | testDiversity    | 39             |
|-------|------------------|----------------|
|       | testEdges        | €2             |
|       | testMRCA         | <del>)</del> 3 |
|       | translateDNA     | <del>)</del> 4 |
|       | translateStrings | €              |
|       | writeChangeoDb   | <del>)</del> 6 |
| Index | 9                | 97             |
|       |                  |                |

ABBREV\_AA

Amino acid abbreviation translations

### **Description**

Mappings of amino acid abbreviations.

### Usage

ABBREV\_AA

### **Format**

Named character vector defining single-letter character codes to three-letter abbreviation mappings.

### **Examples**

```
aa <- c("Ala", "Ile", "Trp")
translateStrings(aa, ABBREV_AA)</pre>
```

AbundanceCurve-class S4 class defining a clonal abundance curve

# Description

AbundanceCurve defines clonal abundance values.

# Usage

```
## S4 method for signature 'AbundanceCurve'
print(x)
## S4 method for signature 'AbundanceCurve, missing'
plot(x, y, ...)
```

alakazam 5

#### **Arguments**

x AbundanceCurve object

y ignored.

... arguments to pass to plotDiversityCurve.

#### **Slots**

abundance data.frame with relative clonal abundance data and confidence intervals, containing the following columns:

• group: group identifier.

• clone\_id or CLONE: clone identifier.

• p: relative abundance of the clone.

• lower: lower confidence inverval bound.

• upper: upper confidence interval bound.

• rank: the rank of the clone abundance.

bootstrap data.frame of bootstrapped clonal distributions.

clone\_by string specifying the name of the clone column.

group\_by string specifying the name of the grouping column.

groups vector specifying the names of unique groups in group column.

n numeric vector indication the number of sequences sampled in each group.

nboot numeric specifying the number of bootstrap iterations to use.

ci confidence interval defining the upper and lower bounds (a value between 0 and 1).

alakazam

The alakazam package

### **Description**

alakazam in a member of the Immcantation framework of tools and serves five main purposes:

- Providing core functionality for other R packages in Immcantation. This includes common tasks such as file I/O, basic DNA sequence manipulation, and interacting with V(D)J segment and gene annotations.
- Providing an R interface for interacting with the output of the pRESTO and Change-O tool suites.
- Performing clonal abundance and diversity analysis on lymphocyte repertoires.
- $\bullet \ \ Performing \ lineage \ reconstruction \ on \ clonal \ populations \ of \ immunoglobulin \ (Ig) \ sequences.$
- Performing physicochemical property analyses of lymphocyte receptor sequences.

For additional details regarding the use of the alakazam package see the vignettes: browseVignettes("alakazam")

6 alakazam

### File I/O

- readChangeoDb: Input Change-O style files.
- writeChangeoDb: Output Change-O style files.

#### Sequence cleaning

- maskSeqEnds: Mask ragged ends.
- maskSeqGaps: Mask gap characters.
- collapseDuplicates: Remove duplicate sequences.

#### Lineage reconstruction

- makeChangeoClone: Clean sequences for lineage reconstruction.
- buildPhylipLineage: Perform lineage reconstruction of Ig sequences.

# Lineage topology analysis

- tableEdges: Tabulate annotation relationships over edges.
- testEdges: Significance testing of annotation edges.
- testMRCA: Significance testing of MRCA annotations.
- summarizeSubtrees: Various summary statistics for subtrees.
- plotSubtrees: Plot distributions of summary statistics for a population of trees.

# Diversity analysis

- countClones: Calculate clonal abundance.
- estimateAbundance: Bootstrap clonal abundance curves.
- alphaDiversity: Generate clonal alpha diversity curves.
- plotAbundanceCurve: Plot clone size distribution as a rank-abundance
- plotDiversityCurve: Plot clonal diversity curves.
- plotDiversityTest: Plot testing at given diversity hill indicex.

### Ig and TCR sequence annotation

- countGenes: Calculate Ig and TCR allele, gene and family usage.
- extractVRegion: Extract CDRs and FWRs sub-sequences.
- getAllele: Get V(D)J allele names.
- getGene: Get V(D)J gene names.
- getFamily: Get V(D)J family names.
- junctionAlignment: Junction alignment properties

aliphatic 7

#### Sequence distance calculation

- seqDist: Calculate Hamming distance between two sequences.
- seqEqual: Test two sequences for equivalence.
- pairwiseDist: Calculate a matrix of pairwise Hamming distances for a set of sequences.
- pairwiseEqual: Calculate a logical matrix of pairwise equivalence for a set of sequences.

### Amino acid propertes

- translate DNA: Translate DNA sequences to amino acid sequences.
- aminoAcidProperties: Calculate various physicochemical properties of amino acid sequences.
- countPatterns: Count patterns in sequences.

#### References

- 1. Vander Heiden JA, Yaari G, et al. pRESTO: a toolkit for processing high-throughput sequencing raw reads of lymphocyte receptor repertoires. Bioinformatics. 2014 30(13):1930-2.
- 2. Stern JNH, Yaari G, Vander Heiden JA, et al. B cells populating the multiple sclerosis brain mature in the draining cervical lymph nodes. Sci Transl Med. 2014 6(248):248ra107.
- 3. Wu Y-CB, et al. Influence of seasonal exposure to grass pollen on local and peripheral blood IgE repertoires in patients with allergic rhinitis. J Allergy Clin Immunol. 2014 134(3):604-12.
- 4. Gupta NT, Vander Heiden JA, et al. Change-O: a toolkit for analyzing large-scale B cell immunoglobulin repertoire sequencing data. Bioinformatics. 2015 Oct 15;31(20):3356-8.

aliphatic

Calculates the aliphatic index of amino acid sequences

#### **Description**

aliphatic calculates the aliphatic index of amino acid sequences using the method of Ikai. Non-informative positions are excluded, where non-informative is defined as any character in c("X", "-", ".", "\*").

#### Usage

```
aliphatic(seq, normalize = TRUE)
```

# **Arguments**

seq

vector of strings containing amino acid sequences.

normalize

if TRUE then divide the aliphatic index of each amino acid sequence by the number of informative positions. Non-informative position are defined by the presence any character in c("X","-",".","\*"). If FALSE then return the raw aliphatic index.

8 alphaDiversity

#### Value

A vector of the aliphatic indices for the sequence(s).

#### References

 Ikai AJ. Thermostability and aliphatic index of globular proteins. J Biochem. 88, 1895-1898 (1980).

### **Examples**

```
seq <- c("CARDRSTPWRRGIASTTVRTSW", NA, "XXTQMYVRT")
aliphatic(seq)</pre>
```

alphaDiversity

Calculate clonal alpha diversity

# Description

alphaDiversity takes in a data.frame or AbundanceCurve and computes diversity scores (D) over an interval of diversity orders (q).

### Usage

```
alphaDiversity(data, min_q = 0, max_q = 4, step_q = 0.1, ci = 0.95, ...)
```

### **Arguments**

| data   | data.frame with Change-O style columns containing clonal assignments or a AbundanceCurve generate by estimateAbundance object containing a previously calculated bootstrap distributions of clonal abundance. |
|--------|---|
| min_q  | minimum value of $q$ .  |
| max_q  | maximum value of $q$ .  |
| step_q | value by which to increment $q$ .   |
| ci     | confidence interval to calculate; the value must be between 0 and 1.  |
|        | additional arguments to pass to estimateAbundance. Additional arguments are ignored if a AbundanceCurve is provided as input.   |

#### **Details**

Clonal diversity is calculated using the generalized diversity index (Hill numbers) proposed by Hill (Hill, 1973). See calcDiversity for further details.

To generate a smooth curve, D is calculated for each value of q from min\_q to max\_q incremented by step\_q. When uniform=TRUE variability in total sequence counts across unique values in the group column is corrected by repeated resampling from the estimated complete clonal distribution to a common number of sequences. The complete clonal abundance distribution that is resampled

alphaDiversity 9

from is inferred by using the Chao1 estimator to infer the number of unseen clones, followed by applying the relative abundance correction and unseen clone frequencies described in Chao et al, 2015.

The diversity index (D) for each group is the mean value of over all resampling realizations. Confidence intervals are derived using the standard deviation of the resampling realizations, as described in Chao et al. 2015.

Significance of the difference in diversity index (D) between groups is tested by constructing a bootstrap delta distribution for each pair of unique values in the group column. The bootstrap delta distribution is built by subtracting the diversity index Da in group a from the corresponding value Db in group b, for all bootstrap realizations, yielding a distribution of nboot total deltas; where group a is the group with the greater mean D. The p-value for hypothesis Da! = Db is the value of  $P(\emptyset)$  from the empirical cumulative distribution function of the bootstrap delta distribution, multiplied by 2 for the two-tailed correction.

Note, this method may inflate statistical significance when clone sizes are uniformly small, such as when most clones sizes are 1, sample size is small, and max\_n is near the total count of the smallest data group. Use caution when interpreting the results in such cases.

#### Value

A DiversityCurve object summarizing the diversity scores.

#### References

- 1. Hill M. Diversity and evenness: a unifying notation and its consequences. Ecology. 1973 54(2):427-32.
- 2. Chao A. Nonparametric Estimation of the Number of Classes in a Population. Scand J Stat. 1984 11, 265270.
- 3. Chao A, et al. Rarefaction and extrapolation with Hill numbers: A framework for sampling and estimation in species diversity studies. Ecol Monogr. 2014 84:45-67.
- 4. Chao A, et al. Unveiling the species-rank abundance distribution by generalizing the Good-Turing sample coverage theory. Ecology. 2015 96, 11891201.

#### See Also

See calcDiversity for the basic calculation and DiversityCurve for the return object. See plotDiversityCurve for plotting the return object.

# Examples

aminoAcidProperties

Calculates amino acid chemical properties for sequence data

# **Description**

aminoAcidProperties calculates amino acid sequence physicochemical properties, including length, hydrophobicity, bulkiness, polarity, aliphatic index, net charge, acidic residue content, basic residue content, and aromatic residue content.

# Usage

```
aminoAcidProperties(
  data,
  property = c("length", "gravy", "bulk", "aliphatic", "polarity", "charge", "basic",
        "acidic", "aromatic"),
  seq = "junction",
  nt = TRUE,
  trim = FALSE,
  label = NULL,
  ...
)
```

# **Arguments**

| data     | data.frame containing sequence data.  |
|----------|---|
| property | vector strings specifying the properties to be calculated. Defaults to calculating all defined properties.                                    |
| seq      | character name of the column containing input sequences.  |
| nt       | boolean, TRUE if the sequences (or sequence) are DNA and will be translated.  |
| trim     | if TRUE remove the first and last codon/amino acids from each sequence before calculating properties. If FALSE do not modify input sequences. |
| label    | name of sequence region to add as prefix to output column names.  |
| • • •    | additional named arguments to pass to the functions gravy, bulk, aliphatic, polar or charge.  |

# Details

For all properties except for length, non-informative positions are excluded, where non-informative is defined as any character in c("X","-",""").

The scores for gravy, bulkiness and polarity are calculated as simple averages of the scores for each informative positions. The basic, acid and aromatic indices are calculated as the fraction of informative positions falling into the given category.

The aliphatic index is calculated using the Ikai, 1980 method.

aminoAcidProperties 11

The net charge is calculated using the method of Moore, 1985, excluding the N-terminus and C-terminus charges, and normalizing by the number of informative positions. The default pH for the calculation is 7.4.

The following data sources were used for the default property scores:

• hydropathy: Kyte & Doolittle, 1982.

• bulkiness: Zimmerman et al, 1968.

• polarity: Grantham, 1974.

• pK: EMBOSS.

#### Value

A modified data data.frame with the following columns:

- \*\_aa\_length: number of amino acids.
- \*\_aa\_gravy: grand average of hydrophobicity (gravy) index.
- \*\_aa\_bulk: average bulkiness of amino acids.
- \*\_aa\_aliphatic: aliphatic index.
- \*\_aa\_polarity: average polarity of amino acids.
- \*\_aa\_charge: net charge.
- \*\_aa\_basic: fraction of informative positions that are Arg, His or Lys.
- \*\_aa\_acidic: fraction of informative positions that are Asp or Glu.
- \*\_aa\_aromatic: fraction of informative positions that are His, Phe, Trp or Tyr.

Where \* is the value from label or the name specified for seq if label=NULL.

### References

- 1. Zimmerman JM, Eliezer N, Simha R. The characterization of amino acid sequences in proteins by statistical methods. J Theor Biol 21, 170-201 (1968).
- 2. Grantham R. Amino acid difference formula to help explain protein evolution. Science 185, 862-864 (1974).
- 3. Ikai AJ. Thermostability and aliphatic index of globular proteins. J Biochem 88, 1895-1898 (1980).
- 4. Kyte J, Doolittle RF. A simple method for displaying the hydropathic character of a protein. J Mol Biol 157, 105-32 (1982).
- 5. Moore DS. Amino acid and peptide net charges: A simple calculational procedure. Biochem Educ 13, 10-11 (1985).
- 6. Wu YC, et al. High-throughput immunoglobulin repertoire analysis distinguishes between human IgM memory and switched memory B-cell populations. Blood 116, 1070-8 (2010).
- 7. Wu YC, et al. The relationship between CD27 negative and positive B cell populations in human peripheral blood. Front Immunol 2, 1-12 (2011).
- 8. http://emboss.sourceforge.net/apps/cvs/emboss/apps/iep.html

12 baseTheme

#### See Also

See countPatterns for counting the occurance of specific amino acid subsequences. See gravy, bulk, aliphatic, polar and charge for functions that calculate the included properties individually.

#### **Examples**

```
# Subset example data
db <- ExampleDb[c(1,10,100), c("sequence_id", "junction")]</pre>
# Calculate default amino acid properties from DNA sequences
aminoAcidProperties(db, seq="junction")
# Calculate default amino acid properties from amino acid sequences
# Use a custom output column prefix
db$junction_aa <- translateDNA(db$junction)</pre>
aminoAcidProperties(db, seq="junction_aa", label="junction", nt=FALSE)
# Use the Grantham, 1974 side chain volume scores from the seqinr package
# Set pH=7.0 for the charge calculation
# Calculate only average volume and charge
# Remove the head and tail amino acids from the junction, thus making it the CDR3
library(seqinr)
data(aaindex)
x <- aaindex[["GRAR740103"]]$I</pre>
# Rename the score vector to use single-letter codes
names(x) <- translateStrings(names(x), ABBREV_AA)</pre>
# Calculate properties
aminoAcidProperties(db, property=c("bulk", "charge"), seq="junction",
                    trim=TRUE, label="cdr3", bulkiness=x, pH=7.0)
```

baseTheme

Standard ggplot settings

# **Description**

baseTheme defines common ggplot theme settings for plotting.

#### Usage

```
baseTheme(sizing = c("figure", "window"))
```

# Arguments

sizing

defines the style and sizing of the theme. One of c("figure", "window") where sizing="figure" is appropriately sized for pdf export at 7 to 7.5 inch width, and sizing="window" is sized for an interactive session.

### Value

A ggplot2 object.

buildPhylipLineage 13

### See Also

theme.

#### **Description**

buildPhylipLineage reconstructs an Ig lineage via maximum parsimony using the dnapars application, or maximum liklihood using the dnaml application of the PHYLIP package.

### Usage

```
buildPhylipLineage(
  clone,
  phylip_exec,
  dist_mat = getDNAMatrix(gap = 0),
  rm_temp = FALSE,
  verbose = FALSE,
  temp_path = NULL,
  onetree = FALSE,
  branch_length = c("mutations", "distance")
)
```

#### **Arguments**

dist\_mat

clone ChangeoClone object containing clone data.

phylip\_exec absolute path to the PHYLIP dnapars executable.

phylip\_exec absolute paul to the lilibria dhapars executable.

character distance matrix to use for reassigning edge weights. Defaults to a Hamming distance matrix returned by getDNAMatrix with gap=0. If gap characters, c("-","."), are assigned a value of -1 in dist\_mat then contiguous gaps of any run length, which are not present in both sequences, will be counted as a distance of 1. Meaning, indels of any length will increase the sequence distance by 1. Gap values other than -1 will return a distance that does not consider

indels as a special case.

rm\_temp if TRUE delete the temporary directory after running dnapars; if FALSE keep the

temporary directory.

verbose if FALSE suppress the output of dnapars; if TRUE STDOUT and STDERR of

dnapars will be passed to the console.

temp\_path specific path to temp directory if desired.

one tree if TRUE save only one tree.

branch\_length specifies how to define branch lengths; one of "mutations" or "distance".

If set to "mutations" (default), then branch lengths represent the number of mutations between nodes. If set to "distance", then branch lengths represent the expected number of mutations per site, unaltered from PHYLIP output.

14 buildPhylipLineage

#### **Details**

buildPhylipLineage builds the lineage tree of a set of unique Ig sequences via maximum parsimony through an external call to the dnapars application of the PHYLIP package. dnapars is called with default algorithm options, except for the search option, which is set to "Rearrange on one best tree". The germline sequence of the clone is used for the outgroup.

Following tree construction using dnapars, the dnapars output is modified to allow input sequences to appear as internal nodes of the tree. Intermediate sequences inferred by dnapars are replaced by children within the tree having a Hamming distance of zero from their parent node. With the default dist\_mat, the distance calculation allows IUPAC ambiguous character matches, where an ambiguous character has distance zero to any character in the set of characters it represents. Distance calculation and movement of child nodes up the tree is repeated until all parent-child pairs have a distance greater than zero between them. The germline sequence (outgroup) is moved to the root of the tree and excluded from the node replacement processes, which permits the trunk of the tree to be the only edge with a distance of zero. Edge weights of the resultant tree are assigned as the distance between each sequence.

#### Value

An igraph graph object defining the Ig lineage tree. Each unique input sequence in clone is a vertex of the tree, with additional vertices being either the germline (root) sequences or inferred intermediates. The graph object has the following attributes.

#### Vertex attributes:

- name: value in the sequence\_id column of the data slot of the input clone for observed sequences. The germline (root) vertex is assigned the name "Germline" and inferred intermediates are assigned names with the format "Inferred1", "Inferred2", ....
- sequence: value in the sequence column of the data slot of the input clone for observed sequences. The germline (root) vertex is assigned the sequence in the germline slot of the input clone. The sequence of inferred intermediates are extracted from the dnapars output.
- label: same as the name attribute.

Additionally, each other column in the data slot of the input clone is added as a vertex attribute with the attribute name set to the source column name. For the germline and inferred intermediate vertices, these additional vertex attributes are all assigned a value of NA.

# Edge attributes:

- weight: Hamming distance between the sequence attributes of the two vertices.
- label: same as the weight attribute.

### Graph attributes:

- clone: clone identifier from the clone slot of the input ChangeoClone.
- v\_gene: V-segment gene call from the v\_gene slot of the input ChangeoClone.
- j\_gene: J-segment gene call from the j\_gene slot of the input ChangeoClone.
- junc\_len: junction length (nucleotide count) from the junc\_len slot of the input ChangeoClone. Alternatively, this function will return an phylo object, which is compatible with the ape package. This object will contain reconstructed ancestral sequences in nodes attribute.

bulk 15

#### References

 Felsenstein J. PHYLIP - Phylogeny Inference Package (Version 3.2). Cladistics. 1989 5:164-166

2. Stern JNH, Yaari G, Vander Heiden JA, et al. B cells populating the multiple sclerosis brain mature in the draining cervical lymph nodes. Sci Transl Med. 2014 6(248):248ra107.

#### See Also

Takes as input a ChangeoClone. Temporary directories are created with makeTempDir. Distance is calculated using seqDist. See the igraph documentation for how to work with graph objects.

# **Examples**

```
## Not run:
# Preprocess clone
db <- subset(ExampleDb, clone_id == 3138)</pre>
clone <- makeChangeoClone(db, text_fields=c("sample_id", "c_call"),</pre>
                           num_fields="duplicate_count")
# Run PHYLIP and process output
phylip_exec <- "~/apps/phylip-3.695/bin/dnapars"</pre>
graph <- buildPhylipLineage(clone, phylip_exec, rm_temp=TRUE)</pre>
# Plot graph with a tree layout
library(igraph)
plot(graph, layout=layout_as_tree, vertex.label=V(graph)$c_call,
     vertex.size=50, edge.arrow.mode=0, vertex.color="grey80")
# To consider each indel event as a mutation, change the masking character
# and distance matrix
clone <- makeChangeoClone(db, text_fields=c("sample_id", "c_call"),</pre>
                           num_fields="duplicate_count", mask_char="-")
graph <- buildPhylipLineage(clone, phylip_exec, dist_mat=getDNAMatrix(gap=-1),</pre>
                             rm_temp=TRUE)
## End(Not run)
```

bulk

Calculates the average bulkiness of amino acid sequences

#### **Description**

bulk calculates the average bulkiness score of amino acid sequences. Non-informative positions are excluded, where non-informative is defined as any character in c("X", "-", ".", "\*").

### Usage

```
bulk(seq, bulkiness = NULL)
```

16 calcCoverage

### **Arguments**

seq vector of strings containing amino acid sequences.

bulkiness named numerical vector defining bulkiness scores for each amino acid, where

names are single-letter amino acid character codes. If NULL, then the Zimmer-

man et al, 1968 scale is used.

#### Value

A vector of bulkiness scores for the sequence(s).

#### References

1. Zimmerman JM, Eliezer N, Simha R. The characterization of amino acid sequences in proteins by statistical methods. J Theor Biol 21, 170-201 (1968).

### See Also

For additional size related indices see agindex.

### **Examples**

```
# Default bulkiness scale
seq <- c("CARDRSTPWRRGIASTTVRTSW", "XXTQMYVRT")
bulk(seq)

# Use the Grantham, 1974 side chain volumn scores from the seqinr package
library(seqinr)
data(aaindex)
x <- aaindex[["GRAR740103"]]$I
# Rename the score vector to use single-letter codes
names(x) <- translateStrings(names(x), ABBREV_AA)
# Calculate average volume
bulk(seq, bulkiness=x)</pre>
```

calcCoverage

Calculate sample coverage

### **Description**

calcCoverage calculates the sample coverage estimate, a measure of sample completeness, for varying orders using the method of Chao et al, 2015, falling back to the Chao1 method in the first order case.

# Usage

```
calcCoverage(x, r = 1)
```

calcDiversity 17

# Arguments

x numeric vector of abundance counts.

r coverage order to calculate.

#### Value

The sample coverage of the given order r.

#### References

- 1. Chao A. Nonparametric Estimation of the Number of Classes in a Population. Scand J Stat. 1984 11, 265270.
- 2. Chao A, et al. Unveiling the species-rank abundance distribution by generalizing the Good-Turing sample coverage theory. Ecology. 2015 96, 11891201.

#### See Also

Used by alphaDiversity.

# **Examples**

```
# Calculate clone sizes
clones <- countClones(ExampleDb, groups="sample_id")
# Calculate 1first order coverage for a single sample
calcCoverage(clones$seq_count[clones$sample_id == "+7d"])</pre>
```

calcDiversity

Calculate the diversity index

# **Description**

calcDiversity calculates the clonal diversity index for a vector of diversity orders.

### Usage

```
calcDiversity(p, q)
```

### **Arguments**

- p numeric vector of clone (species) counts or proportions.
- q numeric vector of diversity orders.

18 ChangeoClone-class

#### **Details**

This method, proposed by Hill (Hill, 1973), quantifies diversity as a smooth function (D) of a single parameter q. Special cases of the generalized diversity index correspond to the most popular diversity measures in ecology: species richness (q=0), the exponential of the Shannon-Weiner index (q approaches 1), the inverse of the Simpson index (q=2), and the reciprocal abundance of the largest clone (q approaches  $+\infty)$ . At q=0 different clones weight equally, regardless of their size. As the parameter q increase from 0 to  $+\infty$  the diversity index (D) depends less on rare clones and more on common (abundant) ones, thus encompassing a range of definitions that can be visualized as a single curve.

Values of q < 0 are valid, but are generally not meaningful. The value of D at q = 1 is estimated by D at q = 0.9999.

#### Value

A vector of diversity scores D for each q.

#### References

1. Hill M. Diversity and evenness: a unifying notation and its consequences. Ecology. 1973 54(2):427-32.

#### See Also

Used by alphaDiversity.

# **Examples**

```
# May define p as clonal member counts
p <- c(1, 1, 3, 10)
q <- c(0, 1, 2)
calcDiversity(p, q)

# Or proportional abundance
p <- c(1/15, 1/15, 1/5, 2/3)
calcDiversity(p, q)</pre>
```

ChangeoClone-class

S4 class defining a clone

### Description

ChangeoClone defines a common data structure for perform lineage recontruction from Change-O data.

charge 19

#### **Slots**

data data.frame containing sequences and annotations. Contains the columns SEQUENCE\_ID and SEQUENCE, as well as any additional sequence-specific annotation columns.

clone string defining the clone identifier.

germline string containing the germline sequence for the clone.

v\_gene string defining the V segment gene call.

j\_gene string defining the J segment gene call.

junc\_len numeric junction length (nucleotide count).

#### See Also

See makeChangeoClone and buildPhylipLineage for use.

charge

Calculates the net charge of amino acid sequences.

#### **Description**

charge calculates the net charge of amino acid sequences using the method of Moore, 1985, with exclusion of the C-terminus and N-terminus charges.

### Usage

```
charge(seq, pH = 7.4, pK = NULL, normalize = FALSE)
```

#### **Arguments**

seq vector strings defining of amino acid sequences.

pH environmental pH.

pK named vector defining pK values for each charged amino acid, where names are

the single-letter amino acid character codes c("R", "H", "K", "D", "E", "C", "Y")).

If NULL, then the EMBOSS scale is used.

normalize if TRUE then divide the net charge of each amino acid sequence by the number

of informative positions. Non-informative position are defined by the presence any character in c("X", "-", ".", "\*"). If FALSE then return the raw net charge.

#### Value

A vector of net charges for the sequence(s).

# References

- 1. Moore DS. Amino acid and peptide net charges: A simple calculational procedure. Biochem Educ. 13, 10-11 (1985).
- 2. http://emboss.sourceforge.net/apps/cvs/emboss/apps/iep.html

20 checkColumns

#### See Also

For additional pK scales see pK.

#### **Examples**

```
seq <- c("CARDRSTPWRRGIASTTVRTSW", "XXTQMYVRT")
# Unnormalized charge
charge(seq)
# Normalized charge
charge(seq, normalize=TRUE)

# Use the Murray et al, 2006 scores from the seqinr package
library(seqinr)
data(pK)
x <- setNames(pK[["Murray"]], rownames(pK))
# Calculate charge
charge(seq, pK=x)</pre>
```

checkColumns

Check data.frame for valid columns and issue message if invalid

### **Description**

Check data.frame for valid columns and issue message if invalid

# Usage

```
checkColumns(data, columns, logic = c("all", "any"))
```

### **Arguments**

data data.frame to check.

columns vector of column names to check.

logic one of "all" or "any" controlling whether all, or at least one, of the columns

must be valid, respectively.

#### Value

TRUE if columns are valid and a string message if not.

### **Examples**

```
df <- data.frame(A=1:3, B=4:6, C=rep(NA, 3))
checkColumns(df, c("A", "B"), logic="all")
checkColumns(df, c("A", "B"), logic="any")
checkColumns(df, c("A", "C"), logic="all")
checkColumns(df, c("A", "C"), logic="any")</pre>
```

collapseDuplicates 21

```
checkColumns(df, c("A", "D"), logic="all")
checkColumns(df, c("A", "D"), logic="any")
```

collapseDuplicates

Remove duplicate DNA sequences and combine annotations

# Description

collapseDuplicates identifies duplicate DNA sequences, allowing for ambiguous characters, removes the duplicate entries, and combines any associated annotations.

# Usage

```
collapseDuplicates(
  data,
  id = "sequence_id",
  seq = "sequence_alignment",
  text_fields = NULL,
  num_fields = NULL,
  seq_fields = NULL,
  add_count = FALSE,
  ignore = c("N", "-", ".", "?"),
  sep = ",",
  dry = FALSE,
  verbose = FALSE
)
```

# Arguments

| data        | data.frame containing Change-O columns. The data.frame must contain, at a minimum, a unique identifier column and a column containg a character vector of DNA sequences.  |
|-------------|---|
| id          | name of the column containing sequence identifiers.   |
| seq         | name of the column containing DNA sequences.  |
| text_fields | character vector of textual columns to collapse. The textual annotations of duplicate sequences will be merged into a single string with each unique value alphabetized and delimited by sep.   |
| num_fields  | vector of numeric columns to collapse. The numeric annotations of duplicate sequences will be summed.   |
| seq_fields  | vector of nucletoide sequence columns to collapse. The sequence with the fewest numer of non-informative characters will be retained. Where a non-informative character is one of c("N", "-", ".", "?"). Note, this is distinct from the seq parameter which is used to determine duplicates. |
| add_count   | if TRUE add the column collpase_count that indicates the number of sequences that were collapsed to build each unique entry.  |

22 collapseDuplicates

ignore vector of characters to ignore when testing for equality.

sep character to use for delimiting collapsed annotations in the text\_fields columns.

Defines both the input and output delimiter.

dry if TRUE perform dry run. Only labels the sequences without collapsing them.

verbose if TRUE report the number input, discarded and output sequences; if FALSE pro-

cess sequences silently.

#### **Details**

collapseDuplicates identifies duplicate sequences in the seq column by testing for character identity, with consideration of IUPAC ambiguous nucleotide codes. A cluster of sequences are considered duplicates if they are all equivalent, and no member of the cluster is equivalent to a sequence in a different cluster.

Textual annotations, specified by text\_fields, are collapsed by taking the unique set of values within in each duplicate cluster and delimiting those values by sep. Numeric annotations, specified by num\_fields, are collapsed by summing all values in the duplicate cluster. Sequence annotations, specified by seq\_fields, are collapsed by retaining the first sequence with the fewest number of N characters.

Columns that are not specified in either text\_fields, num\_fields, or seq\_fields will be retained, but the value will be chosen from a random entry amongst all sequences in a cluster of duplicates.

An ambiguous sequence is one that can be assigned to two different clusters, wherein the ambiguous sequence is equivalent to two sequences which are themselves non-equivalent. Ambiguous sequences arise due to ambiguous characters at positions that vary across sequences, and are discarded along with their annotations when dry=FALSE. Thus, ambiguous sequences are removed as duplicates of some sequence, but do not create a potential false-positive annotation merger. Ambiguous sequences are not included in the collapse\_count annotation that is added when add\_count=TRUE.

If dry=TRUE sequences will not be removed from the input. Instead, the following columns will be appended to the input defining the collapse action that would have been performed in the dry=FALSE case.

- collapse\_id: an identifer for the group of identical sequences.
- collapse\_class: string defining how the sequence matches to the other in the set. one of "duplicated" (has duplicates), "unique" (no duplicates), "ambiguous\_duplicate" (no duplicates after ambiguous sequences are removed), or "ambiguous" (matches multiple non-duplicate sequences).
- collapse\_pass: TRUE for the sequences that would be retained.

### Value

A modified data data.frame with duplicate sequences removed and annotation fields collapsed if dry=FALSE. If dry=TRUE, sequences will be labeled with the collapse action, but the input will be otherwise unmodified (see Details).

#### See Also

Equality is tested with seqEqual and pairwiseEqual. For IUPAC ambiguous character codes see IUPAC\_DNA.

combineIgphyml 23

#### **Examples**

```
# Example data.frame
db <- data.frame(sequence_id=LETTERS[1:4],</pre>
                 sequence_alignment=c("CCCCTGGG", "CCCCTGGN", "NAACTGGN", "NNNCTGNN"),
                 c_call=c("IGHM", "IGHG", "IGHG", "IGHA"),
                 sample_id=c("S1", "S1", "S2", "S2"),
                 duplicate_count=1:4,
                 stringsAsFactors=FALSE)
# Annotations are not parsed if neither text_fields nor num_fields is specified
# The retained sequence annotations will be random
collapseDuplicates(db, verbose=TRUE)
# Unique text_fields annotations are combined into a single string with ","
# num_fields annotations are summed
# Ambiguous duplicates are discarded
collapseDuplicates(db, text_fields=c("c_call", "sample_id"), num_fields="duplicate_count",
                   verbose=TRUE)
# Use alternate delimiter for collapsing textual annotations
collapseDuplicates(db, text_fields=c("c_call", "sample_id"), num_fields="duplicate_count",
                   sep="/", verbose=TRUE)
# Add count of duplicates
collapseDuplicates(db, text_fields=c("c_call", "sample_id"), num_fields="duplicate_count",
                   add_count=TRUE, verbose=TRUE)
# Masking ragged ends may impact duplicate removal
db$sequence_alignment <- maskSeqEnds(db$sequence_alignment)</pre>
collapseDuplicates(db, text_fields=c("c_call", "sample_id"), num_fields="duplicate_count",
                   add_count=TRUE, verbose=TRUE)
```

combineIgphyml

Combine IgPhyML object parameters into a dataframe

# Description

combineIgphyml combines IgPhyML object parameters into a data.frame.

#### **Usage**

```
combineIgphyml(iglist, format = c("wide", "long"))
```

#### **Arguments**

iglist

list of igphyml objects returned by readIgphyml. Each must have an id column in its param attribute, which can be added automatically using the id option of readIgphyml.

24 countClones

format

string specifying whether each column of the resulting data.frame should represent a parameter (wide) or if there should only be three columns; i.e. id, varable, and value (long).

#### **Details**

combineIgphyml combines repertoire-wide parameter estimates from mutliple igphyml objects produced by readIgphyml into a dataframe that can be easily used for plotting and other hypothesis testing analyses.

All igphyml objects used must have an "id" column in their param attribute, which can be added automatically from the id flag of readIgphyml.

#### Value

A data frame containing HLP model parameter estimates for all igphyml objects. Only parameters shared among all objects will be returned.

#### References

- 1. Hoehn KB, Lunter G, Pybus OG A Phylogenetic Codon Substitution Model for Antibody Lineages. Genetics 2017 206(1):417-427 https://doi.org/10.1534/genetics.116.196303
- 2. Hoehn KB, Vander Heiden JA, Zhou JQ, Lunter G, Pybus OG, Kleinstein SHK Repertoire-wide phylogenetic models of B cell molecular evolution reveal evolutionary signatures of aging and vaccination. bioRxiv 2019 https://doi.org/10.1101/558825

#### See Also

readIgphyml

# **Examples**

```
## Not run:
    # Read in and combine two igphyml runs
    s1 <- readIgphyml("IB+7d_lineages_gy.tsv_igphyml_stats_hlp.tab", id="+7d")
    s2 <- readIgphyml("IB+7d_lineages_gy.tsv_igphyml_stats_hlp.tab", id="s2")
    combineIgphyml(list(s1, s2))
## End(Not run)</pre>
```

countClones

Tabulates clones sizes

# Description

countClones determines the number of sequences and total copy number of clonal groups.

countClones 25

#### Usage

```
countClones(
  data,
  groups = NULL,
  copy = NULL,
  clone = "clone_id",
  remove_na = TRUE
)
```

### **Arguments**

data data.frame with columns containing clonal assignments.

groups character vector defining data columns containing grouping variables. If groups=NULL,

then do not group data.

copy name of the data column containing copy numbers for each sequence. If this

value is specified, then total copy abundance is determined by the sum of copy

numbers within each clonal group.

clone name of the data column containing clone identifiers.

remove\_na removes rows with NA values in the clone column if TRUE and issues a warning.

Otherwise, keeps those rows and considers NA as a clone in the final counts and

relative abundances.

#### Value

A data.frame summarizing clone counts and frequencies with columns:

- clone\_id: clone identifier. This is the default column name, specified with clone='clone\_id'.
   If the function call uses Change-O formatted data and clone='CLONE', this column will have name CLONE.
- seq\_count: total number of sequences for the clone.
- seq\_freq: frequency of the clone as a fraction of the total number of sequences within each group.
- copy\_count: sum of the copy counts in the copy column. Only present if the copy argument is specified.
- copy\_freq: frequency of the clone as a fraction of the total copy number within each group. Only present if the copy argument is specified.

Also includes additional columns specified in the groups argument.

# **Examples**

```
# Without copy numbers
clones <- countClones(ExampleDb, groups="sample_id")

# With copy numbers and multiple groups
clones <- countClones(ExampleDb, groups=c("sample_id", "c_call"), copy="duplicate_count")</pre>
```

26 countGenes

countGenes

Tabulates V(D)J allele, gene or family usage.

# Description

Determines the count and relative abundance of V(D)J alleles, genes or families within groups.

# Usage

```
countGenes(
  data,
  gene,
  groups = NULL,
  copy = NULL,
  clone = NULL,
  fill = FALSE,
  mode = c("gene", "allele", "family", "asis"),
  remove_na = TRUE
)
```

relative abundances.

# Arguments

| data      | data.frame with AIRR-format or Change-O style columns.  |
|-----------|---|
| gene      | column containing allele assignments. Only the first allele in the column will be considered when mode is "gene", "family" or "allele". The value will be used as it is with mode="asis".   |
| groups    | columns containing grouping variables. If NULL do not group.  |
| сору      | name of the data column containing copy numbers for each sequence. If this value is specified, then total copy abundance is determined by the sum of copy numbers within each gene. This argument is ignored if clone is specified.   |
| clone     | name of the data column containing clone identifiers for each sequence. If this value is specified, then one gene will be considered for each clone. Note, this is accomplished by using the most common gene within each clone identifier. As such, ambiguous alleles within a clone will not be accurately represented. |
| fill      | logical of c(TRUE, FALSE) specifying when if groups (when specified) lacking a particular gene should be counted as $0$ if TRUE or not (omitted)  |
| mode      | one of c("gene", "family", "allele", "asis") defining the degree of specificity regarding allele calls. Determines whether to return counts for genes (calling getGene), families (calling getFamily), alleles (calling getAllele) or using the value as it is in the column gene, without any processing.                |
| remove_na | removes rows with NA values in the gene column if TRUE and issues a warning. Otherwise, keeps those rows and considers NA as a gene in the final counts and   |

countPatterns 27

#### Value

A data frame summarizing family, gene or allele counts and frequencies with columns:

- gene: name of the family, gene or allele.
- seq\_count: total number of sequences for the gene.
- seq\_freq: frequency of the gene as a fraction of the total number of sequences within each grouping.
- copy\_count: sum of the copy counts in the copy column. for each gene. Only present if the copy argument is specified.
- copy\_freq: frequency of the gene as a fraction of the total copy number within each group. Only present if the copy argument is specified.
- clone\_count: total number of clones for the gene. Only present if the clone argument is specified.
- clone\_freq: frequency of the gene as a fraction of the total number of clones within each grouping. Only present if the clone argument is specified.

Additional columns defined by the groups argument will also be present.

#### **Examples**

countPatterns

Count sequence patterns

#### **Description**

countPatterns counts the fraction of times a set of character patterns occur in a set of sequences.

### Usage

```
countPatterns(seq, patterns, nt = TRUE, trim = FALSE, label = "region")
```

28 cpuCount

# **Arguments**

| seq      | character vector of either DNA or amino acid sequences.  |
|----------|--|
| patterns | list of sequence patterns to count in each sequence. If the list is named, then names will be assigned as the column names of output data.frame. |
| nt       | if TRUE then seq are DNA sequences and and will be translated before performing the pattern search.  |
| trim     | if TRUE remove the first and last codon or amino acid from each sequence before the pattern search. If FALSE do not modify the input sequences.  |
| label    | string defining a label to add as a prefix to the output column names.   |

#### Value

A data frame containing the fraction of times each sequence pattern was found.

# **Examples**

cpuCount Available CPU cores

# Description

cpuCount determines the number of CPU cores available.

# Usage

```
cpuCount()
```

# Value

Count of available cores. Returns 1 if undeterminable.

# **Examples**

```
cpuCount()
```

DEFAULT\_COLORS 29

DEFAULT\_COLORS

Default colors

#### **Description**

Default color palettes for DNA characters, Ig isotypes, and TCR chains.

# Usage

```
DNA_COLORS

IG_COLORS

TR_COLORS
```

#### **Format**

Named character vectors with hexcode colors as values.

```
• DNA_COLORS: DNA character colors c("A", "C", "G", "T").
```

- IG\_COLORS: Ig isotype colors c("IGHA", "IGHD", "IGHE", "IGHG", "IGHM", "IGHK", "IGHL").
- TR\_COLORS: TCR chain colors c("TRA", "TRB", "TRD", "TRG").

An object of class character of length 4.

An object of class character of length 7.

An object of class character of length 4.

### **Examples**

30 DiversityCurve-class

DiversityCurve-class S4 class defining a diversity curve

#### **Description**

DiversityCurve defines diversity (D) scores over multiple diversity orders (Q).

#### Usage

```
## S4 method for signature 'DiversityCurve'
print(x)
## S4 method for signature 'DiversityCurve,missing'
plot(x, y, ...)
## S4 method for signature 'DiversityCurve,numeric'
plot(x, y, ...)
```

### **Arguments**

x DiversityCurve object
 y diversity order to plot (q).
 ... arguments to pass to plotDiversityCurve or plotDiversityTest.

#### **Slots**

diversity data.frame defining the diversity curve with the following columns:

- group: group label.
- q: diversity order.
- d: mean diversity index over all bootstrap realizations.
- d\_sd: standard deviation of the diversity index over all bootstrap realizations.
- d\_lower: diversity lower confidence inverval bound.
- d\_upper: diversity upper confidence interval bound.
- e: evenness index calculated as D divided by D at Q=0.
- e\_lower: evenness lower confidence inverval bound.
- e\_upper: eveness upper confidence interval bound.

tests data.frame describing the significance test results with columns:

- test: string listing the two groups tested.
- ullet delta\_mean: mean of the D bootstrap delta distribution for the test.
- ullet delta\_sd: standard deviation of the D bootstrap delta distribution for the test.
- pvalue: p-value for the test.

group\_by string specifying the name of the grouping column in diversity calculation. groups vector specifying the names of unique groups in group column in diversity calculation. EdgeTest-class 31

method string specifying the type of diversity calculated.

- q vector of diversity hill diversity indices used for computing diversity.
- n numeric vector indication the number of sequences sampled in each group.
- ci confidence interval defining the upper and lower bounds (a value between 0 and 1).

EdgeTest-class

S4 class defining edge significance

# Description

EdgeTest defines the significance of parent-child annotation enrichment.

### Usage

```
## S4 method for signature 'EdgeTest'
print(x)
## S4 method for signature 'EdgeTest,missing'
plot(x, y, ...)
```

# **Arguments**

x EdgeTest object.

y ignored.

... arguments to pass to plotEdgeTest.

### Slots

tests data.frame describing the significance test results with columns:

- parent: parent node annotation.
- child: child node annotation
- count: count of observed edges with the given parent-child annotation set.
- expected: mean count of expected edges for the given parent-child relationship.
- pvalue: one-sided p-value for the hypothesis that the observed edge abundance is greater than expected.

permutations data.frame containing the raw permutation test data with columns:

- parent: parent node annotation.
- child: child node annotation
- count: count of edges with the given parent-child annotation set.
- iter: numerical index define which permutation realization each observation corresponds to.

nperm number of permutation realizations.

32 estimateAbundance

estimateAbundance

Estimates the complete clonal relative abundance distribution

# Description

estimateAbundance estimates the complete clonal relative abundance distribution and confidence intervals on clone sizes using bootstrapping.

# Usage

```
estimateAbundance(
  data,
  clone = "clone_id",
  copy = NULL,
  group = NULL,
  min_n = 30,
  max_n = NULL,
  uniform = TRUE,
  ci = 0.95,
  nboot = 200,
  progress = FALSE
)
```

# Arguments

| data     | data.frame with Change-O style columns containing clonal assignments.   |
|----------|---|
| clone    | name of the data column containing clone identifiers.   |
| copy     | name of the data column containing copy numbers for each sequence. If copy=NULL (the default), then clone abundance is determined by the number of sequences. If a copy column is specified, then clone abundances is determined by the sum of copy numbers within each clonal group. |
| group    | name of the data column containing group identifiers. If NULL then no grouping is performed and the group column of the output will contain the value NA for each row.  |
| min_n    | minimum number of observations to sample. A group with less observations than the minimum is excluded.  |
| max_n    | maximum number of observations to sample. If NULL then no maximum is set.   |
| uniform  | if TRUE then uniformly resample each group to the same number of observations. If FALSE then allow each group to be resampled to its original size or, if specified, max_size.  |
| ci       | confidence interval to calculate; the value must be between 0 and 1.  |
| nboot    | number of bootstrap realizations to generate.   |
| progress | if TRUE show a progress bar.  |

Example 10x 33

#### Value

A AbundanceCurve object summarizing the abundances.

#### References

1. Chao A. Nonparametric Estimation of the Number of Classes in a Population. Scand J Stat. 1984 11, 265270.

- 2. Chao A, et al. Rarefaction and extrapolation with Hill numbers: A framework for sampling and estimation in species diversity studies. Ecol Monogr. 2014 84:45-67.
- 3. Chao A, et al. Unveiling the species-rank abundance distribution by generalizing the Good-Turing sample coverage theory. Ecology. 2015 96, 11891201.

#### See Also

See plotAbundanceCurve for plotting of the abundance distribution. See alphaDiversity for a similar application to clonal diversity.

# **Examples**

abund <- estimateAbundance(ExampleDb, group="sample\_id", nboot=100)</pre>

Example10x

Small example 10x Genomics  $Ig\ V(D)J$  sequences from CD19+ B cells isolated from PBMCs of a healthy human donor. Down-sampled from data provided by 10x Genomics under a Creative Commons Attribute license, and processed with their Cell Ranger pipeline.

### **Description**

Small example 10x Genomics Ig V(D)J sequences from CD19+ B cells isolated from PBMCs of a healthy human donor. Down-sampled from data provided by 10x Genomics under a Creative Commons Attribute license, and processed with their Cell Ranger pipeline.

### Usage

Example10x

### **Format**

A data.frame with the following AIRR style columns:

- sequence\_id: Sequence identifier
- sequence\_alignment: IMGT-gapped observed sequence.
- germline\_alignment: IMGT-gapped germline sequence.
- v\_call: V region allele assignments.

34 ExampleDb

- d\_call: D region allele assignments.
- j\_call: J region allele assignments.
- c\_call: Isotype (C region) assignment.
- junction: Junction region sequence.
- junction\_length: Length of the junction region in nucleotides.
- np1\_length: Combined length of the N and P regions proximal to the V region.
- np2\_length: Combined length of the N and P regions proximal to the J region.
- umi\_count: Number of unique molecular identifies atttributed to sequence.
- cell\_id: Cell identifier.
- locus: Genomic locus of sequence.

#### References

- 1. Data source: https://support.10xgenomics.com/single-cell-vdj/datasets/2.2.0/vdj\_v1\_hs\_cd19\_b
- 2. License: https://creativecommons.org/licenses/by/4.0/

ExampleDb

Example AIRR database

#### **Description**

A small example database subset from Laserson and Vigneault et al, 2014.

#### Usage

ExampleDb

# Format

A data.frame with the following AIRR style columns:

- sequence\_id: Sequence identifier
- sequence\_alignment: IMGT-gapped observed sequence.
- germline\_alignment: IMGT-gapped germline sequence.
- germline\_alignment\_d\_mask: IMGT-gapped germline sequence with N, P and D regions masked.
- v\_call: V region allele assignments.
- v\_call\_genotyped: TIgGER corrected V region allele assignment.
- d\_call: D region allele assignments.
- j\_call: J region allele assignments.
- c\_call: Isotype (C region) assignment.
- junction: Junction region sequence.

ExampleDbChangeo 35

- junction\_length: Length of the junction region in nucleotides.
- np1\_length: Combined length of the N and P regions proximal to the V region.
- np2\_length: Combined length of the N and P regions proximal to the J region.
- duplicate\_count: Copy count (number of duplicates) of the sequence.
- clone\_id: Change-O assignment clonal group identifier.
- sample\_id: Sample identifier. Time in relation to vaccination.

#### References

1. Laserson U and Vigneault F, et al. High-resolution antibody dynamics of vaccine-induced immune responses. Proc Natl Acad Sci USA. 2014 111:4928-33.

#### See Also

ExampleDbChangeo ExampleTrees

ExampleDbChangeo

Example Change-O database

#### **Description**

A small example database subset from Laserson and Vigneault et al, 2014.

### Usage

ExampleDbChangeo

#### **Format**

A data.frame with the following Change-O style columns:

- SEQUENCE\_ID: Sequence identifier
- SEQUENCE\_IMGT: IMGT-gapped observed sequence.
- GERMLINE\_IMGT\_D\_MASK: IMGT-gapped germline sequence with N, P and D regions masked.
- V\_CALL: V region allele assignments.
- V\_CALL\_GENOTYPED: TIgGER corrected V region allele assignment.
- D\_CALL: D region allele assignments.
- J\_CALL: J region allele assignments.
- JUNCTION: Junction region sequence.
- JUNCTION\_LENGTH: Length of the junction region in nucleotides.
- NP1\_LENGTH: Combined length of the N and P regions proximal to the V region.
- NP2\_LENGTH: Combined length of the N and P regions proximal to the J region.
- SAMPLE: Sample identifier. Time in relation to vaccination.
- ISOTYPE: Isotype assignment.
- DUPCOUNT: Copy count (number of duplicates) of the sequence.
- CLONE: Change-O assignment clonal group identifier.

36 extractVRegion

#### References

1. Laserson U and Vigneault F, et al. High-resolution antibody dynamics of vaccine-induced immune responses. Proc Natl Acad Sci USA. 2014 111:4928-33.

#### See Also

ExampleDb ExampleTrees

ExampleTrees

Example Ig lineage trees

# Description

A set of Ig lineage trees generated from the ExampleDb file, subset to only those trees with at least four nodes.

# Usage

ExampleTrees

#### **Format**

A list of igraph objects output by buildPhylipLineage. Each node of each tree has the following annotations (vertex attributes):

- sample\_id: Sample identifier(s). Time in relation to vaccination.
- c\_call: Isotype assignment(s).
- duplication\_count: Copy count (number of duplicates) of the sequence.

# See Also

ExampleTrees

extractVRegion

Extracts FWRs and CDRs from IMGT-gapped sequences

# Description

extractVRegion extracts the framework and complementarity determining regions of the V segment for IMGT-gapped immunoglobulin (Ig) nucleotide sequences according to the IMGT numbering scheme.

### Usage

```
extractVRegion(sequences, region = c("fwr1", "cdr1", "fwr2", "cdr2", "fwr3"))
```

getAAMatrix 37

#### **Arguments**

sequences character vector of IMGT-gapped nucleotide sequences.

region string defining the region(s) of the V segment to extract. May be a single re-

gion or multiple regions (as a vector) from c("fwr1", "cdr1", "fwr2", "cdr2"

, "fwr3"). By default, all regions will be returned.

#### Value

If only one region is specified in the region argument, a character vector of the extracted subsequences will be returned. If multiple regions are specified, then a character matrix will be returned with columns corresponding to the specified regions and a row for each entry in sequences.

#### References

1. Lefranc M-P, et al. IMGT unique numbering for immunoglobulin and T cell receptor variable domains and Ig superfamily V-like domains. Dev Comp Immunol. 2003 27(1):55-77.

#### See Also

IMGT-gapped region boundaries are defined in IMGT\_REGIONS.

## **Examples**

```
# Assign example clone
clone <- subset(ExampleDb, clone_id == 3138)

# Get all regions
extractVRegion(clone$sequence_alignment)

# Get single region
extractVRegion(clone$sequence_alignment, "fwr1")

# Get all CDRs
extractVRegion(clone$sequence_alignment, c("cdr1", "cdr2"))

# Get all FWRs
extractVRegion(clone$sequence_alignment, c("fwr1", "fwr2", "fwr3"))</pre>
```

getAAMatrix

Build an AA distance matrix

#### **Description**

getAAMatrix returns a Hamming distance matrix for IUPAC ambiguous amino acid characters.

### Usage

```
getAAMatrix(gap = 0)
```

38 getDNAMatrix

#### **Arguments**

gap

value to assign to characters in the set c("-", ".").

#### Value

A matrix of amino acid character distances with row and column names indicating the character pair.

#### See Also

Creates an amino acid distance matrix for seqDist. See getDNAMatrix for nucleotide distances.

# **Examples**

```
getAAMatrix()
```

getDNAMatrix

Build a DNA distance matrix

#### **Description**

getDNAMatrix returns a Hamming distance matrix for IUPAC ambiguous DNA characters with modifications for gap, c("-","."), and missing, c("?"), character values.

#### Usage

```
getDNAMatrix(gap = -1)
```

## **Arguments**

gap

value to assign to characters in the set c("-", ".").

#### Value

A matrix of DNA character distances with row and column names indicating the character pair. By default, distances will be either 0 (equivalent), 1 (non-equivalent or missing), or -1 (gap).

### See Also

Creates DNA distance matrix for seqDist. See getAAMatrix for amino acid distances.

getMRCA 39

#### **Examples**

```
# Set gap characters to Inf distance
# Distinguishes gaps from Ns
getDNAMatrix()

# Set gap characters to 0 distance
# Makes gap characters equivalent to Ns
getDNAMatrix(gap=0)
```

getMRCA

Retrieve the first non-root node of a lineage tree

## **Description**

getMRCA returns the set of lineage tree nodes with the minimum weighted or unweighted path length from the root (germline) of the lineage tree, allowing for exclusion of specific groups of nodes.

## Usage

```
getMRCA(
  graph,
  path = c("distance", "steps"),
  root = "Germline",
  field = NULL,
  exclude = NULL
)
```

## **Arguments**

| graph   | igraph object containing an annotated lineage tree.   |
|---------|---|
| path    | string defining whether to use unweighted (steps) or weighted (distance) measures for determining the founder node set                      |
| root    | name of the root (germline) node.   |
| field   | annotation field to use for both unweighted path length exclusion and consideration as an MRCA node. If NULL do not exclude any nodes.      |
| exclude | vector of annotation values in field to exclude from the potential MRCA set. If NULL do not exclude any nodes. Has no effect if field=NULL. |

#### Value

A data.frame of the MRCA node(s) containing the columns:

- name: node name
- steps: path length as the number of nodes traversed
- distance: path length as the sum of edge weights

Along with additional columns corresponding to the annotations of the input graph.

40 getPathLengths

### See Also

Path lengths are determined with getPathLengths.

### **Examples**

```
# Define example graph
graph <- ExampleTrees[[23]]

# Use unweighted path length and do not exclude any nodes
getMRCA(graph, path="steps", root="Germline")

# Exclude nodes without an isotype annotation and use weighted path length
getMRCA(graph, path="distance", root="Germline", field="c_call", exclude=NA)</pre>
```

getPathLengths

Calculate path lengths from the tree root

### **Description**

getPathLengths calculates the unweighted (number of steps) and weighted (distance) path lengths from the root of a lineage tree.

### Usage

```
getPathLengths(graph, root = "Germline", field = NULL, exclude = NULL)
```

#### **Arguments**

graph igraph object containing an annotated lineage tree.

root name of the root (germline) node.

field annotation field to use for exclusion of nodes from step count.

exclude annotation values specifying which nodes to exclude from step count. If NULL

consider all nodes. This does not affect the weighted (distance) path length

calculation.

### Value

A data.frame with columns:

- name: node name
- steps: path length as the number of nodes traversed
- distance: path length as the sum of edge weights

### See Also

See buildPhylipLineage for generating input trees.

getPositionQuality 41

#### **Examples**

```
# Define example graph
graph <- ExampleTrees[[24]]

# Consider all nodes
getPathLengths(graph, root="Germline")

# Exclude nodes without an isotype annotation from step count
getPathLengths(graph, root="Germline", field="c_call", exclude=NA)</pre>
```

getPositionQuality

Get a data.frame with sequencing qualities per position

## **Description**

getPositionQuality takes a data.frame with sequence quality scores in the form of a strings of comma separated numeric values, split the quality scores values by ",", and returns a data.frame with the values for each position.

## Usage

```
getPositionQuality(
  data,
  sequence_id = "sequence_id",
  sequence = "sequence_alignment",
  quality_num = "quality_alignment_num")
```

### **Arguments**

data data.frame containing sequence data.
sequence\_id column in data with sequence identifiers.
sequence column in data with sequence data.

quality\_num column in data with quality scores (as strings of numeric values, comma sepa-

rated) for sequence.

#### Value

data with one additional field with masked sequences. The name of this field is created concatenating sequence and '\_masked'.

#### See Also

readFastqDb and maskPositionsByQuality

42 getSegment

### **Examples**

```
db <- airr::read_rearrangement(system.file("extdata", "example_quality.tsv", package="alakazam"))
fastq_file <- system.file("extdata", "example_quality.fastq", package="alakazam")
db <- readFastqDb(db, fastq_file, quality_offset=-33)
head(getPositionQuality(db))</pre>
```

getSegment

Get Ig segment allele, gene and family names

## **Description**

getSegment performs generic matching of delimited segment calls with a custom regular expression. getAllele, getGene and getFamily extract the allele, gene and family names, respectively, from a character vector of immunoglobulin (Ig) or TCR segment allele calls in IMGT format.

### Usage

```
getSegment(
  segment_call,
  segment_regex,
  first = TRUE,
  collapse = TRUE,
  strip_d = TRUE,
  omit_nl = FALSE,
  sep = ","
)
getAllele(
  segment_call,
  first = TRUE,
  collapse = TRUE,
  strip_d = TRUE,
  omit_nl = FALSE,
  sep = ","
)
getGene(
  segment_call,
  first = TRUE,
  collapse = TRUE,
  strip_d = TRUE,
  omit_nl = FALSE,
  sep = ","
)
getFamily(
  segment_call,
```

getSegment 43

```
first = TRUE,
 collapse = TRUE,
 strip_d = TRUE,
 omit_nl = FALSE,
 sep = ","
)
getLocus(
  segment_call,
 first = TRUE,
 collapse = TRUE,
 strip_d = TRUE,
 omit_nl = FALSE,
 sep = ","
)
getChain(
  segment_call,
  first = TRUE,
 collapse = TRUE,
 strip_d = TRUE,
 omit_nl = FALSE,
 sep = ","
)
```

## Arguments

| segment_call  | character vector containing segment calls delimited by commas.  |
|---------------|---|
| segment_regex | string defining the segment match regular expression.   |
| first         | if TRUE return only the first call in $segment\_call$ ; if FALSE return all calls delimited by commas.  |
| collapse      | if TRUE check for duplicates and return only unique segment assignments; if FALSE return all assignments (faster). Has no effect if first=TRUE. |
| strip_d       | if TRUE remove the "D" from the end of gene annotations (denoting a duplicate gene in the locus); if FALSE do not alter gene names.             |
| omit_nl       | if TRUE remove non-localized (NL) genes from the result. Only applies at the gene or allele level.  |
| sep           | character defining both the input and output segment call delimiter.  |
|               |   |

# Value

A character vector containing allele, gene or family names.

### References

```
http://imgt.org
```

44 getSegment

### See Also

countGenes.

```
# Light chain examples
kappa_call <- c("Homsap IGKV1D-39*01 F,Homsap IGKV1-39*02 F,Homsap IGKV1-39*01",</pre>
                "Homsap IGKJ5*01 F")
getAllele(kappa_call)
getAllele(kappa_call, first=FALSE)
getAllele(kappa_call, first=FALSE, strip_d=FALSE)
getGene(kappa_call)
getGene(kappa_call, first=FALSE)
getGene(kappa_call, first=FALSE, strip_d=FALSE)
getFamily(kappa_call)
getFamily(kappa_call, first=FALSE)
getFamily(kappa_call, first=FALSE, collapse=FALSE)
getFamily(kappa_call, first=FALSE, strip_d=FALSE)
getLocus(kappa_call)
getChain(kappa_call)
# Heavy chain examples
heavy_call <- c("Homsap IGHV1-69*01 F, Homsap IGHV1-69D*01 F",
                "Homsap IGHD1-1*01 F",
                "Homsap IGHJ1*01 F")
getAllele(heavy_call, first=FALSE)
getAllele(heavy_call, first=FALSE, strip_d=FALSE)
getGene(heavy_call, first=FALSE)
getGene(heavy_call, first=FALSE, strip_d=FALSE)
getFamily(heavy_call)
getLocus(heavy_call)
getChain(heavy_call)
# Filtering non-localized genes
nl_call <- c("IGHV3-NL1*01,IGHV3-30-3*01,IGHV3-30*01",
             "Homosap IGHV3-30*01 F, Homsap IGHV3-NL1*01 F",
             "IGHV1-NL1*01")
getAllele(nl_call, first=FALSE, omit_nl=TRUE)
getGene(nl_call, first=FALSE, omit_nl=TRUE)
getFamily(nl_call, first=FALSE, omit_nl=TRUE)
# Temporary designation examples
tmp_call <- c("IGHV9S3*01", "IGKV10S12*01")</pre>
```

graphToPhylo 45

```
getAllele(tmp_call)
getGene(tmp_call)
getFamily(tmp_call)
```

graphToPhylo

Convert a tree in igraph graph format to ape phylo format.

### **Description**

graphToPhylo a tree in igraph graph format to ape phylo format.

#### Usage

```
graphToPhylo(graph)
```

### **Arguments**

graph

An igraph graph object.

#### **Details**

Convert from igraph graph object to ape phylo object. If graph object was previously rooted with the germline as the direct ancestor, this will re-attach the germline as a descendant node with a zero branch length to a new universal common ancestor (UCA) node and store the germline node ID in the germid attribute and UCA node number in the uca attribute. Otherwise these attributes will not be specified in the phylo object. Using phyloToGraph(phylo,germline=phylo\$germid) creates a graph object with the germline back as the direct ancestor. Tip and internal node names are stored in the tip.label and node.label vectors, respectively.

### Value

A phylo object representing the input tree. Tip and internal node names are stored in the tip.label and node.label vectors, respectively.

### References

- 1. Hoehn KB, Lunter G, Pybus OG A Phylogenetic Codon Substitution Model for Antibody Lineages. Genetics 2017 206(1):417-427 https://doi.org/10.1534/genetics.116.196303
- 2. Hoehn KB, Vander Heiden JA, Zhou JQ, Lunter G, Pybus OG, Kleinstein SHK Repertoire-wide phylogenetic models of B cell molecular evolution reveal evolutionary signatures of aging and vaccination. bioRxiv 2019 https://doi.org/10.1101/558825

46 gravy

#### **Examples**

```
## Not run:
  library(igraph)
  library(ape)
  #convert to phylo
  phylo = graphToPhylo(graph)
  #plot tree using ape
  plot(phylo, show.node.label=TRUE)
  #store as newick tree
  write.tree(phylo,file="tree.newick")
  #read in tree from newick file
  phylo_r = read.tree("tree.newick")
  #convert to igraph
  graph_r = phyloToGraph(phylo_r,germline="Germline")
   #plot graph - same as before, possibly rotated
  plot(graph_r,layout=layout_as_tree)
## End(Not run)
```

gravy

Calculates the hydrophobicity of amino acid sequences

## **Description**

gravy calculates the Grand Average of Hydrophobicity (gravy) index of amino acid sequences using the method of Kyte & Doolittle. Non-informative positions are excluded, where non-informative is defined as any character in c("X", "-", ".", "\*").

### Usage

```
gravy(seq, hydropathy = NULL)
```

### **Arguments**

seq vector of strings containing amino acid sequences.

hydropathy named numerical vector defining hydropathy index values for each amino acid,

where names are single-letter amino acid character codes. If NULL, then the Kyte

& Doolittle scale is used.

### Value

A vector of gravy scores for the sequence(s).

gridPlot 47

#### References

 Kyte J, Doolittle RF. A simple method for displaying the hydropathic character of a protein. J Mol Biol. 157, 105-32 (1982).

#### See Also

For additional hydrophobicity indices see aaindex.

#### **Examples**

```
# Default scale
seq <- c("CARDRSTPWRRGIASTTVRTSW", "XXTQMYVRT")
gravy(seq)

# Use the Kidera et al, 1985 scores from the seqinr package
library(seqinr)
data(aaindex)
x <- aaindex[["KIDA850101"]]$I
# Rename the score vector to use single-letter codes
names(x) <- translateStrings(names(x), ABBREV_AA)
# Calculate hydrophobicity
gravy(seq, hydropathy=x)</pre>
```

gridPlot

Plot multiple ggplot objects

# Description

Plots multiple ggplot objects in an equally sized grid.

# Usage

```
gridPlot(..., ncol = 1)
```

#### **Arguments**

```
... ggplot objects to plot.ncol number of columns in the plot.
```

#### References

Modified from: http://www.cookbook-r.com/Graphs/Multiple\_graphs\_on\_one\_page\_(ggplot2)

#### See Also

ggplot.

48 groupGenes

| ~    | m C ~ m |     |
|------|---------|-----|
| grou | puen    | ıes |

Group sequences by gene assignment

# Description

groupGenes will group rows by shared V and J gene assignments, and optionally also by junction lengths. IGH:IGK/IGL, TRB:TRA, and TRD:TRG paired single-cell BCR/TCR sequencing and unpaired bulk sequencing (IGH, TRB, TRD chain only) are supported. In the case of ambiguous (multiple) gene assignments, the grouping may be specified to be a union across all ambiguous V and J gene pairs, analogous to single-linkage clustering (i.e., allowing for chaining).

# Usage

```
groupGenes(
  data,
  v_call = "v_call",
  j_call = "j_call",
  junc_len = NULL,
  cell_id = NULL,
  locus = "locus",
  only_heavy = TRUE,
  first = FALSE
)
```

# Arguments

| data       | data.frame containing sequence data.  |
|------------|---|
| v_call     | name of the column containing the heavy/long chain V-segment allele calls.  |
| j_call     | name of the column containing the heavy/long chain J-segment allele calls.  |
| junc_len   | name of column containing the junction length. If NULL then 1-stage partitioning is perform considering only the $V$ and $J$ genes is performed. See Details for further clarification.   |
| cell_id    | name of the column containing cell identifiers or barcodes. If specified, grouping will be performed in single-cell mode with the behavior governed by the locus and only_heavy arguments. If set to NULL then the bulk sequencing data is assumed. |
| locus      | name of the column containing locus information. Only applicable to single-cell data. Ignored if cell_id=NULL.  |
| only_heavy | use only the IGH (BCR) or TRB/TRD (TCR) sequences for grouping. Only applicable to single-cell data. Ignored if cell_id=NULL.   |
| first      | if TRUE only the first call of the gene assignments is used. if FALSE the union of ambiguous gene assignments is used to group all sequences with any overlapping gene calls.   |

groupGenes 49

#### **Details**

To invoke single-cell mode the cell\_id argument must be specified and the locus column must be correct. Otherwise, groupGenes will be run with bulk sequencing assumptions, using all input sequences regardless of the values in the locus column.

Values in the locus column must be one of c("IGH", "IGI", "IGK", "IGL") for BCR or c("TRA", "TRB", "TRD", "TRG") for TCR sequences. Otherwise, the function returns an error message and stops.

Under single-cell mode with paired chained sequences, there is a choice of whether grouping should be done by (a) using IGH (BCR) or TRB/TRD (TCR) sequences only or (b) using IGH plus IGK/IGL (BCR) or TRB/TRD plus TRA/TRG (TCR). This is governed by the only\_heavy argument.

Specifying junc\_len will force groupGenes to perform a 1-stage partitioning of the sequences/cells based on V gene, J gene, and junction length simultaneously. If junc\_len=NULL (no column specified), then groupGenes performs only the first stage of a 2-stage partitioning in which sequences/cells are partitioned in the first stage based on V gene and J gene, and then in the second stage further splits the groups based on junction length (the second stage must be performed independently, as this only returns the first stage results).

In the input data, the v\_call, j\_call, cell\_id, and locus columns, if present, must be of type character (as opposed to factor).

It is assumed that ambiguous gene assignments are separated by commas.

All rows containing NA values in any of the v\_call, j\_call, and junc\_len (if junc\_len != NULL) columns will be removed. A warning will be issued when a row containing an NA is removed.

#### Value

Returns a modified data.frame with disjoint union indices in a new vj\_group column.

If junc\_len is supplied, the grouping this vj\_group will have been based on V, J, and junction length simultaneously. However, the output column name will remain vj\_group.

The output v\_call, j\_call, cell\_id, and locus columns will be converted to type character if they were of type factor in the input data.

## **Expectations for single-cell data**

Single-cell paired chain data assumptions:

- every row represents a sequence (chain).
- heavy/long and light/short chains of the same cell are linked by cell\_id.
- the value in locus column indicates whether the chain is the heavy/long or light/short chain.
- each cell possibly contains multiple heavy/long and/or light/short chains.
- every chain has its own V(D)J annotation, in which ambiguous V(D)J annotations, if any, are separated by a comma.

#### Single-cell example:

- A cell has 1 heavy chain and 2 light chains.
- There should be 3 rows corresponding to this cell.
- One of the light chains may have an ambiguous V annotation which looks like "Homsap IGKV1-39\*01 F, Homsap IGKV1D-39\*01 F".

50 isValidAASeq

### **Examples**

```
# Group by genes
db <- groupGenes(ExampleDb)
head(db$vj_group)</pre>
```

IMGT\_REGIONS

*IMGT V-segment regions* 

### **Description**

A list defining the boundaries of V-segment framework regions (FWRs) and complementarity determining regions (CDRs) for IMGT-gapped immunoglobulin (Ig) nucleotide sequences according to the IMGT numbering scheme.

## Usage

IMGT\_REGIONS

#### **Format**

A list with regions named one of c("fwr1", "cdr1", "fwr2", "cdr2", "fwr3") with values containing a numeric vector of length two defining the c(start, end) positions of the named region.

# References

```
http://imgt.org
```

isValidAASeq

Validate amino acid sequences

### **Description**

isValidAASeq checks that a set of sequences are valid non-ambiguous amino acid sequences. A sequence is considered valid if it contains only characters in the the non-ambiguous IUPAC character set or any characters in c("X",".","-","\*").

# Usage

```
isValidAASeq(seq)
```

### **Arguments**

seq

character vector of sequences to check.

IUPAC\_CODES 51

## Value

A logical vector with TRUE for each valid amino acid sequences and FALSE for each invalid sequence.

#### See Also

See ABBREV\_AA for the set of non-ambiguous amino acid characters. See IUPAC\_AA for the full set of ambiguous amino acid characters.

# **Examples**

```
seq <- c("CARDRSTPWRRGIASTTVRTSW", "XXTQMYVR--XX", "CARJ", "10")
isValidAASeq(seq)</pre>
```

IUPAC\_CODES

IUPAC ambiguous characters

## **Description**

A translation list mapping IUPAC ambiguous characters code to corresponding nucleotide amino acid characters.

### Usage

IUPAC\_DNA

IUPAC\_AA

DNA\_IUPAC

### **Format**

A list with single character codes as names and values containing character vectors that define the set of standard characters that match to each each ambiguous character.

- IUPAC\_DNA: DNA ambiguous character translations.
- IUPAC\_AA: Amino acid ambiguous character translations.
- DNA\_IUPAC: Ordered DNA to ambiguous characters

An object of class list of length 15.

An object of class list of length 25.

An object of class list of length 15.

52 junctionAlignment

junctionAlignment

Calculate junction region alignment properties

### **Description**

junctionAlignment determines the number of deleted germline nucleotides in the junction region and the number of V gene and J gene nucleotides in the CDR3.

### Usage

```
junctionAlignment(
 data,
 germline_db,
  v_call = "v_call",
 d_call = "d_call",
  j_call = "j_call",
 v_germline_start = "v_germline_start",
  v_germline_end = "v_germline_end",
  d_germline_start = "d_germline_start",
 d_germline_end = "d_germline_end",
  j_germline_start = "j_germline_start",
  j_germline_end = "j_germline_end",
 np1_length = "np1_length",
  np2_length = "np2_length",
 junction = "junction",
  junction_length = "junction_length",
  sequence_alignment = "sequence_alignment"
)
```

### **Arguments**

```
data
                  data. frame containing sequence data.
germline_db
                  reference germline database for the V, D and J genes. in data
v_call
                  V gene assignment column.
                  D gene assignment column.
d_call
j_call
                  J gene assignment column.
v_germline_start
```

column containing the start position of the alignment in the V reference germline.

v\_germline\_end column containing the end position of the alignment in the V reference germline. d\_germline\_start

column containing the start position of the alignment in the D reference germline.

d\_germline\_end column containing the start position of the alignment in the D reference germline. j\_germline\_start

column containing the start position of the alignment in the J reference germline.

makeChangeoClone 53

```
j_germline_end column containing the start position of the alignment in the J reference germline.

np1_length combined length of the N and P regions between the V and D regions (heavy chain) or V and J regions (light chain).

np2_length combined length of the N and P regions between the D and J regions (heavy chain).

junction column containing the junction sequence.

junction_length column containing the length of the junction region in nucleotides.

sequence_alignment column containing the aligned sequence.
```

#### Value

A modified input data.frame with the following additional columns storing junction alignment information:

- 1. e3v\_length: number of 3' V germline nucleotides deleted.
- 2. e5d\_length: number of 5' D germline nucleotides deleted.
- 3. e3d\_length: number of 3' D germline nucleotides deleted.
- 4. e5j\_length: number of 5' J germline nucleotides deleted.
- 5. v\_cdr3\_length: number of sequence\_alignment V nucleotides in the CDR3.
- 6. j\_cdr3\_length: number of sequence alignment J nucleotides in the CDR3.

#### **Examples**

```
germline_db <- list(
"IGHV3-11*05"="CAGGTGCAGCTGGTGGAGTCTGGGGGA...GGCTTGGTCAAGCCTGGAGGGTCCCTGAGACT
CTCCTGTGCAGCCTCTGGATTCACCTTC.......AGTGACTACTACATGAGCTGGATCCGCCAGGCTCCAG
GGAAGGGGCTGGAGTGGGTTTCATACATTAGTAGTAGT.....AGTAGTTACACAAACTACGCAGACTCTGTGAAG
...GGCCGATTCACCATCTCCAGAGACAACGCCAAGAACTCACTGTATCTGCAAATGAACAGCCTGAGAGCCGAGGA
CACGGCCGTGTATTACTGTGCGAGAGA",
"IGHD3-10*01"="GTATTACTATGGTTCGGGGAGTTATTATAAC",
"IGHJ5*02"="ACAACTGGTTCGACCCCTGGGGCCAGGGAACCCTGGTCACCGTCTCCTCAG"
)

db <- junctionAlignment(SingleDb, germline_db)</pre>
```

makeChangeoClone

Generate a ChangeoClone object for lineage construction

#### **Description**

makeChangeoClone takes a data.frame with AIRR or Change-O style columns as input and masks gap positions, masks ragged ends, removes duplicates sequences, and merges annotations associated with duplicate sequences. It returns a ChangeoClone object which serves as input for lineage reconstruction.

54 makeChangeoClone

# Usage

```
makeChangeoClone(
  data,
  id = "sequence_id",
  seq = "sequence_alignment",
 germ = "germline_alignment",
 v_call = "v_call",
 j_call = "j_call",
  junc_len = "junction_length",
 clone = "clone_id",
 mask_char = "N",
 max_mask = 0,
 pad_end = FALSE,
  text_fields = NULL,
  num_fields = NULL,
  seq_fields = NULL,
  add_count = TRUE,
  verbose = FALSE
)
```

# Arguments

| data      | data.frame containing the AIRR or Change-O data for a clone. See Details for the list of required columns and their default values.   |
|-----------|---|
| id        | name of the column containing sequence identifiers.   |
| seq       | name of the column containing observed DNA sequences. All sequences in this column must be multiple aligned.  |
| germ      | name of the column containing germline DNA sequences. All entries in this column should be identical for any given clone, and they must be multiple aligned with the data in the seq column.  |
| v_call    | name of the column containing V-segment allele assignments. All entries in this column should be identical to the gene level.   |
| j_call    | name of the column containing J-segment allele assignments. All entries in this column should be identical to the gene level.   |
| junc_len  | name of the column containing the length of the junction as a numeric value. All entries in this column should be identical for any given clone.  |
| clone     | name of the column containing the identifier for the clone. All entries in this column should be identical.   |
| mask_char | character to use for masking and padding.   |
| max_mask  | maximum number of characters to mask at the leading and trailing sequence ends. If NULL then the upper masking bound will be automatically determined from the maximum number of observed leading or trailing Ns amongst all sequences. If set to 0 (default) then masking will not be performed. |
| pad_end   | if TRUE pad the end of each sequence with $mask\_char$ to make every sequence the same length.  |

makeChangeoClone 55

| text_fields | text annotation columns to retain and merge during duplicate removal.   |
|-------------|---|
| num_fields  | numeric annotation columns to retain and sum during duplicate removal.  |
| seq_fields  | sequence annotation columns to retain and collapse during duplicate removal. Note, this is distinct from the seq and germ arguments, which contain the primary sequence data for the clone and should not be repeated in this argument. |
| add_count   | if TRUE add an additional annotation column called collapse_count during duplicate removal that indicates the number of sequences that were collapsed.  |
| verbose     | passed on to collapseDuplicates. If TRUE, report the numbers of input, discarded and output sequences; otherwise, process sequences silently.   |

#### **Details**

The input data.frame (data) must columns for each of the required column name arguments: id, seq, germ, v\_call, j\_call, junc\_len, and clone. The default values are as follows:

- id = "sequence\_id": unique sequence identifier.
- seq = "sequence\_alignment": IMGT-gapped sample sequence.
- germ = "germline\_alignment": IMGT-gapped germline sequence.
- v\_call = "v\_call": V segment allele call.
- j\_call = "j\_call": J segment allele call.
- junc\_len = "junction\_length": junction sequence length.
- clone = "clone\_id": clone identifier.

Additional annotation columns specified in the text\_fields, num\_fields or seq\_fields arguments will be retained in the data slot of the return object, but are not required. If the input data.frame data already contains a column named sequence, which is not used as the seq argument, then that column will not be retained.

The default columns are IMGT-gapped sequence columns, but this is not a requirement. However, all sequences (both observed and germline) must be multiple aligned using some scheme for both proper duplicate removal and lineage reconstruction.

The value for the germline sequence, V-segment gene call, J-segment gene call, junction length, and clone identifier are determined from the first entry in the germ, v\_call, j\_call, junc\_len and clone columns, respectively. For any given clone, each value in these columns should be identical.

#### Value

A ChangeoClone object containing the modified clone.

#### See Also

Executes in order maskSeqGaps, maskSeqEnds, padSeqEnds, and collapseDuplicates. Returns a ChangeoClone object which serves as input to buildPhylipLineage.

56 makeTempDir

## **Examples**

makeTempDir

Create a temporary folder

## **Description**

makeTempDir creates a randomly named temporary folder in the system temp location.

### Usage

```
makeTempDir(prefix)
```

#### **Arguments**

prefix

prefix name for the folder.

### Value

The path to the temporary folder.

#### See Also

This is just a wrapper for tempfile and dir.create.

```
makeTempDir("Clone50")
```

```
maskPositionsByQuality
```

Mask sequence positions with low quality

### **Description**

maskPositionsByQuality will replace positions that have a sequencing quality score lower that min\_quality with an "N" character.

## Usage

```
maskPositionsByQuality(
  data,
  min_quality = 70,
  sequence = "sequence_alignment",
  quality_num = "quality_alignment_num")
```

### **Arguments**

data data.frame containing sequence data.

min\_quality minimum quality score. Positions with sequencing quality less than min\_qual

will be masked.

sequence column in data with sequence data to be masked.

quality\_num column in data with quality scores (a string of numeric values, comma sepa-

rated) that can be used to mask sequence.

#### Value

Modified data data.frame with an additional field containing quality masked sequences. The name of this field is created concatenating the sequence name and "\_masked".

#### See Also

readFastqDb and getPositionQuality

```
db <- airr::read_rearrangement(system.file("extdata", "example_quality.tsv", package="alakazam"))
fastq_file <- system.file("extdata", "example_quality.fastq", package="alakazam")
db <- readFastqDb(db, fastq_file, quality_offset=-33)
maskPositionsByQuality(db, min_quality=90, quality_num="quality_alignment_num")</pre>
```

58 maskSeqEnds

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Masks ragged leading and trailing edges of aligned DNA sequences

### **Description**

maskSeqEnds takes a vector of DNA sequences, as character strings, and replaces the leading and trailing characters with "N" characters to create a sequence vector with uniformly masked outer sequence segments.

#### Usage

```
maskSeqEnds(seq, mask_char = "N", max_mask = NULL, trim = FALSE)
```

### **Arguments**

seq character vector of DNA sequence strings.

mask\_char character to use for masking.

max\_mask the maximum number of characters to mask. If set to 0 then no masking will

be performed. If set to NULL then the upper masking bound will be automatically determined from the maximum number of observed leading or trailing "N"

characters amongst all strings in seq.

trim if TRUE leading and trailing characters will be cut rather than masked with "N"

characters.

#### Value

A modified seq vector with masked (or optionally trimmed) sequences.

#### See Also

See maskSeqGaps for masking internal gaps. See padSeqEnds for padding sequence of unequal length.

```
# Default behavior uniformly masks ragged ends
seq <- c("CCCCTGGG", "NAACTGGN", "NNNCTGNN")
maskSeqEnds(seq)

# Does nothing
maskSeqEnds(seq, max_mask=0)

# Cut ragged sequence ends
maskSeqEnds(seq, trim=TRUE)

# Set max_mask to limit extent of masking and trimming
maskSeqEnds(seq, max_mask=1)
maskSeqEnds(seq, max_mask=1, trim=TRUE)</pre>
```

maskSeqGaps 59

```
# Mask dashes instead of Ns
seq <- c("CCCCTGGG", "-AACTGG-", "---CTG--")
maskSeqEnds(seq, mask_char="-")</pre>
```

 ${\sf maskSeqGaps}$ 

Masks gap characters in DNA sequences

## **Description**

maskSeqGaps substitutes gap characters, c("-", "."), with "N" in a vector of DNA sequences.

## Usage

```
maskSeqGaps(seq, mask_char = "N", outer_only = FALSE)
```

### **Arguments**

seq character vector of DNA sequence strings.

mask\_char character to use for masking.

outer\_only if TRUE replace only contiguous leading and trailing gaps; if FALSE replace all

gap characters.

#### Value

A modified seq vector with "N" in place of c("-", ".") characters.

# See Also

See maskSeqEnds for masking ragged edges.

```
# Mask with Ns
maskSeqGaps(c("ATG-C", "CC..C"))
maskSeqGaps("--ATG-C-")
maskSeqGaps("--ATG-C-", outer_only=TRUE)

# Mask with dashes
maskSeqGaps(c("ATG-C", "CC..C"), mask_char="-")
```

60 MRCATest-class

MRCATest-class

S4 class defining edge significance

### **Description**

MRCATest defines the significance of enrichment for annotations appearing at the MRCA of the tree.

#### Usage

```
## S4 method for signature 'MRCATest'
print(x)
## S4 method for signature 'MRCATest,missing'
plot(x, y, ...)
```

## **Arguments**

```
x MRCATest object.y ignored.... arguments to pass to plotMRCATest.
```

#### **Slots**

tests data.frame describing the significance test results with columns:

- annotation: annotation value.
- count: observed count of MRCA positions with the given annotation.
- expected: expected mean count of MRCA occurance for the annotation.
- pvalue: one-sided p-value for the hypothesis that the observed annotation abundance is greater than expected.

permutations data.frame containing the raw permutation test data with columns:

- annotation: annotation value.
- count: count of MRCA positions with the given annotation.
- iter: numerical index define which permutation realization each observation corresponds to.

nperm number of permutation realizations.

nonsquareDist 61

| nonsquareDist | Calculate pairwise distances between sequences |  |
|---------------|--|--|
|               |  |  |

#### **Description**

nonsquareDist calculates all pairwise distance between a set of sequences and a subset of it.

### Usage

```
nonsquareDist(seq, indx, dist_mat = getDNAMatrix())
```

## Arguments

seq character vector containing a DNA sequences. The sequence vector needs to be

named.

indx numeric vector contating the indices (a subset of indices of seq).

dist\_mat Character distance matrix. Defaults to a Hamming distance matrix returned by

getDNAMatrix. If gap characters, c("-","."), are assigned a value of -1 in dist\_mat then contiguous gaps of any run length, which are not present in both sequences, will be counted as a distance of 1. Meaning, indels of any length will increase the sequence distance by 1. Gap values other than -1 will return a

distance that does not consider indels as a special case.

#### Value

A matrix of numerical distance between each entry in seq and sequences specified by indx indices.

Note that the input subsampled indices will be ordered ascendingly. Therefore, it is necassary to assign unique names to the input sequences, seq, to recover the input order later. Row and columns names will be added accordingly.

Amino acid distance matrix may be built with getAAMatrix. Uses seqDist for calculating distances between pairs. See pairwiseEqual for generating an equivalence matrix.

62 padSeqEnds

| padSeqEnds Pads ragged ends of aligned DNA sequences | padSeqEnds | Pads ragged ends of aligned DNA sequences |  |
|--|------------|---|--|
|--|------------|---|--|

# Description

padSeqEnds takes a vector of DNA sequences, as character strings, and appends the ends of each sequence with an appropriate number of "N" characters to create a sequence vector with uniform lengths.

### Usage

```
padSeqEnds(seq, len = NULL, start = FALSE, pad_char = "N", mod3 = TRUE)
```

### **Arguments**

seq character vector of DNA sequence strings.

length to pad to. Only applies if longer than the maximum length of the data in

seq.

start if TRUE pad the beginning of each sequence instead of the end.

pad\_char character to use for padding.

mod3 if TRUE pad sequences to be of length multiple three.

# Value

A modified seq vector with padded sequences.

### See Also

See maskSeqEnds for creating uniform masking from existing masking.

```
# Default behavior uniformly pads ragged ends
seq <- c("CCCCTGGG", "ACCCTG", "CCCC")
padSeqEnds(seq)

# Pad to fixed length
padSeqEnds(seq, len=15)

# Add padding to the beginning of the sequences instead of the ends
padSeqEnds(seq, start=TRUE)
padSeqEnds(seq, len=15, start=TRUE)</pre>
```

pairwiseDist 63

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| рат | 1 44 T | <b>3</b> C L | υ. | 3 6 |

Calculate pairwise distances between sequences

#### **Description**

pairwiseDist calculates all pairwise distance between a set of sequences.

### Usage

```
pairwiseDist(seq, dist_mat = getDNAMatrix())
```

#### Arguments

seq

character vector containing a DNA sequences.

dist\_mat

Character distance matrix. Defaults to a Hamming distance matrix returned by getDNAMatrix. If gap characters, c("-","."), are assigned a value of -1 in dist\_mat then contiguous gaps of any run length, which are not present in both sequences, will be counted as a distance of 1. Meaning, indels of any length will increase the sequence distance by 1. Gap values other than -1 will return a distance that does not consider indels as a special case.

#### Value

A matrix of numerical distance between each entry in seq. If seq is a named vector, row and columns names will be added accordingly.

Amino acid distance matrix may be built with getAAMatrix. Uses seqDist for calculating distances between pairs. See pairwiseEqual for generating an equivalence matrix.

64 permuteLabels

pairwiseEqual

Calculate pairwise equivalence between sequences

### **Description**

pairwiseEqual determined pairwise equivalence between a pairs in a set of sequences, excluding ambiguous positions (Ns and gaps).

# Usage

```
pairwiseEqual(seq)
```

## **Arguments**

seq

character vector containing a DNA sequences.

#### Value

A logical matrix of equivalence between each entry in seq. Values are TRUE when sequences are equivalent and FALSE when they are not.

#### See Also

Uses seqEqual for testing equivalence between pairs. See pairwiseDist for generating a sequence distance matrix.

# Examples

```
# Gaps and Ns will match any character seq <- c(A="ATGGC", B="ATGGG", C="ATGGG", D="AT--C", E="NTGGG") d <- pairwiseEqual(seq) rownames(d) <- colnames(d) <- seq d
```

permuteLabels

Permute the node labels of a tree

## **Description**

permuteLabels permutes the node annotations of a lineage tree.

## Usage

```
permuteLabels(graph, field, exclude = c("Germline", NA))
```

phyloToGraph 65

## **Arguments**

graph igraph object containing an annotated lineage tree.

field string defining the annotation field to permute.

exclude vector of strings defining field values to exclude from permutation.

#### Value

A modified igraph object with vertex annotations permuted.

#### See Also

testEdges.

## **Examples**

phyloToGraph

Convert a tree in ape phylo format to igraph graph format.

### Description

phyloToGraph converts a tree in phylo format to and graph format.

#### Usage

```
phyloToGraph(phylo, germline = "Germline")
```

### **Arguments**

phylo An ape phylo object.

germline If specified, places specified tip sequence as the direct ancestor of the tree

#### **Details**

Convert from phylo to graph object. Uses the node.label vector to label internal nodes. Nodes may rotate but overall topology will remain constant.

66 plotAbundanceCurve

#### Value

A graph object representing the input tree.

#### References

- 1. Hoehn KB, Lunter G, Pybus OG A Phylogenetic Codon Substitution Model for Antibody Lineages. Genetics 2017 206(1):417-427 https://doi.org/10.1534/genetics.116.196303
- 2. Hoehn KB, Vander Heiden JA, Zhou JQ, Lunter G, Pybus OG, Kleinstein SHK Repertoire-wide phylogenetic models of B cell molecular evolution reveal evolutionary signatures of aging and vaccination. bioRxiv 2019 https://doi.org/10.1101/558825

### **Examples**

```
## Not run:
  library(igraph)
  library(ape)
  #convert to phylo
  phylo = graphToPhylo(graph)
  #plot tree using ape
  plot(phylo, show.node.label=TRUE)
   #store as newick tree
  write.tree(phylo,file="tree.newick")
  #read in tree from newick file
  phylo_r = read.tree("tree.newick")
  #convert to igraph
  graph_r = phyloToGraph(phylo_r,germline="Germline")
  #plot graph - same as before, possibly rotated
  plot(graph_r,layout=layout_as_tree)
## End(Not run)
```

plotAbundanceCurve

Plots a clonal abundance distribution

#### **Description**

plotAbundanceCurve plots the results from estimating the complete clonal relative abundance distribution. The distribution is plotted as a log rank abundance distribution.

plotAbundanceCurve 67

## Usage

```
plotAbundanceCurve(
   data,
   colors = NULL,
   main_title = "Rank Abundance",
   legend_title = NULL,
   xlim = NULL,
   ylim = NULL,
   annotate = c("none", "depth"),
   silent = FALSE,
   ...
)
```

## **Arguments**

| data         | AbundanceCurve object returned by estimateAbundance.   |
|--------------|--|
| colors       | named character vector whose names are values in the group column of data and whose values are colors to assign to those group names.  |
| main_title   | string specifying the plot title.  |
| legend_title | string specifying the legend title.  |
| xlim         | numeric vector of two values specifying the c(lower, upper) x-axis limits.   |
| ylim         | numeric vector of two values specifying the c(lower, upper) y-axis limits.   |
| annotate     | string defining whether to added values to the group labels of the legend. When "none" (default) is specified no annotations are added. Specifying ("depth") adds sequence counts to the labels. |
| silent       | if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw the plot.   |
|              |  |

additional arguments to pass to ggplot2::theme.

## Value

A ggplot object defining the plot.

## See Also

See AbundanceCurve for the input object and estimateAbundance for generating the input abundance distribution. Plotting is performed with ggplot.

```
# Estimate abundance by sample and plot
abund <- estimateAbundance(ExampleDb, group="sample_id", nboot=100)
plotAbundanceCurve(abund, legend_title="Sample")</pre>
```

68 plotDiversityCurve

plotDiversityCurve

Plot the results of alphaDiversity

# Description

 $\verb"plotDiversityCurve" plots a DiversityCurve object.$ 

# Usage

```
plotDiversityCurve(
   data,
   colors = NULL,
   main_title = "Diversity",
   legend_title = "Group",
   log_x = FALSE,
   log_y = FALSE,
   xlim = NULL,
   ylim = NULL,
   annotate = c("none", "depth"),
   score = c("diversity", "evenness"),
   silent = FALSE,
   ...
)
```

# Arguments

| data         | DiversityCurve object returned by alphaDiversity.  |
|--------------|--|
| colors       | named character vector whose names are values in the group column of the data slot of data, and whose values are colors to assign to those group names.  |
| main_title   | string specifying the plot title.  |
| legend_title | string specifying the legend title.  |
| log_x        | if TRUE then plot $q$ on a log scale; if FALSE plot on a linear scale.   |
| log_y        | if TRUE then plot the diversity/evenness scores on a log scale; if FALSE plot on a linear scale.   |
| xlim         | numeric vector of two values specifying the c(lower, upper) x-axis limits.   |
| ylim         | numeric vector of two values specifying the c(lower, upper) y-axis limits.   |
| annotate     | string defining whether to added values to the group labels of the legend. When "none" (default) is specified no annotations are added. Specifying ("depth") adds sequence counts to the labels. |
| score        | one of "diversity" or "evenness" specifying which score to plot on the y-asis.   |
| silent       | if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw the plot.   |
|              | additional arguments to pass to ggplot2::theme.  |

plotDiversityTest 69

## Value

A ggplot object defining the plot.

#### See Also

See alphaDiversity and alphaDiversity for generating DiversityCurve objects for input. Plotting is performed with ggplot.

## **Examples**

```
# Calculate diversity
div <- alphaDiversity(ExampleDb, group="sample_id", nboot=100)
# Plot diversity
plotDiversityCurve(div, legend_title="Sample")
#' # Plot diversity
plotDiversityCurve(div, legend_title="Sample", score="evenness")</pre>
```

plotDiversityTest

Plot the results of diversity testing

#### **Description**

plotDiversityTest plots summary data for a DiversityCurve object with mean and a line range indicating plus/minus one standard deviation.

## Usage

```
plotDiversityTest(
  data,
  q,
  colors = NULL,
  main_title = "Diversity",
  legend_title = "Group",
  log_d = FALSE,
  annotate = c("none", "depth"),
  silent = FALSE,
  ...
)
```

#### **Arguments**

data DiversityCurve object returned by alphaDiversity.
q diversity order to plot the test for.

70 plotEdgeTest

named character vector whose names are values in the group column of the colors data slot of data, and whose values are colors to assign to those group names. main\_title string specifying the plot title. legend\_title string specifying the legend title. log\_d if TRUE then plot the diversity scores D on a log scale; if FALSE plot on a linear scale. string defining whether to added values to the group labels of the legend. When annotate "none" (default) is specified no annotations are added. Specifying ("depth") adds sequence counts to the labels. if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw silent the plot. additional arguments to pass to ggplot2::theme.

#### Value

A ggplot object defining the plot.

#### See Also

See alphaDiversity for generating input. Plotting is performed with ggplot.

### **Examples**

```
# Calculate diversity
div <- alphaDiversity(ExampleDb, group="sample_id", min_q=0, max_q=2, step_q=1, nboot=100)
# Plot results at q=0 (equivalent to species richness)
plotDiversityTest(div, 0, legend_title="Sample")
# Plot results at q=2 (equivalent to Simpson's index)
plotDiversityTest(div, q=2, legend_title="Sample")</pre>
```

plotEdgeTest

Plot the results of an edge permutation test

## **Description**

plotEdgeTest plots the results of an edge permutation test performed with testEdges as either a histogram or cumulative distribution function.

plotEdgeTest 71

#### Usage

```
plotEdgeTest(
  data,
  color = "black",
 main_title = "Edge Test",
 style = c("histogram", "cdf"),
  silent = FALSE,
)
```

#### **Arguments**

data EdgeTest object returned by testEdges. color color of the histogram or lines. main\_title string specifying the plot title. style type of plot to draw. One of: • "histogram": histogram of the edge count distribution with a red dotted line denoting the observed value.

• "cdf": cumulative distribution function of edge counts with a red dotted

line denoting the observed value and a blue dotted line indicating the pvalue.

silent if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw

additional arguments to pass to ggplot2::theme.

## Value

A ggplot object defining the plot.

#### See Also

See testEdges for performing the test.

```
# Define example tree set
graphs <- ExampleTrees[1-10]</pre>
# Perform edge test on isotypes
x <- testEdges(graphs, "c_call", nperm=10)</pre>
# Plot
plotEdgeTest(x, color="steelblue", style="hist")
plotEdgeTest(x, style="cdf")
```

72 plotMRCATest

plotMRCATest

Plot the results of a founder permutation test

## **Description**

plotMRCATest plots the results of a founder permutation test performed with testMRCA.

## Usage

```
plotMRCATest(
  data,
  color = "black",
  main_title = "MRCA Test",
  style = c("histogram", "cdf"),
  silent = FALSE,
  ...
)
```

## **Arguments**

data MRCATest object returned by testMRCA.

color color of the histogram or lines.

main\_title string specifying the plot title.

style type of plot to draw. One of:

- "histogram": histogram of the annotation count distribution with a red dotted line denoting the observed value.
- "cdf": cumulative distribution function of annotation counts with a red dotted line denoting the observed value and a blue dotted line indicating the p-value.

silent

if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw the plot.

1

... additional arguments to pass to ggplot2::theme.

### Value

A ggplot object defining the plot.

#### See Also

See testEdges for performing the test.

plotSubtrees 73

## **Examples**

```
# Define example tree set
graphs <- ExampleTrees[1-10]

# Perform MRCA test on isotypes
x <- testMRCA(graphs, "c_call", nperm=10)

# Plot
plotMRCATest(x, color="steelblue", style="hist")
plotMRCATest(x, style="cdf")</pre>
```

plotSubtrees

Plots subtree statistics for multiple trees

# Description

plotSubtree plots distributions of normalized subtree statistics for a set of lineage trees, broken down by annotation value.

## Usage

```
plotSubtrees(
   graphs,
   field,
   stat,
   root = "Germline",
   exclude = c("Germline", NA),
   colors = NULL,
   main_title = "Subtrees",
   legend_title = "Annotation",
   style = c("box", "violin"),
   silent = FALSE,
   ...
)
```

## **Arguments**

graphs list of igraph objects containing annotated lineage trees. field string defining the annotation field.

stat string defining the subtree statistic to plot. One of:

- outdegree: distribution of normalized node outdegrees.
- size: distribution of normalized subtree sizes.
- depth: distribution of subtree depths.

74 plotSubtrees

• pathlength: distribution of maximum pathlength beneath nodes.

root name of the root (germline) node.

exclude vector of strings defining field values to exclude from plotting.

colors named vector of colors for values in field, with names defining annotation

names field column and values being colors. Also controls the order in which values appear on the plot. If NULL alphabetical ordering and a default color

palette will be used.

main\_title string specifying the plot title.

legend\_title string specifying the legend title.

style string specifying the style of plot to draw. One of:

• "histogram": histogram of the annotation count distribution with a red dotted line denoting the observed value.

• "cdf": cumulative distribution function of annotation counts with a red dotted line denoting the observed value and a blue dotted line indicating the p-value.

silent if TRUE do not draw the plot and just return the ggplot2 object; if FALSE draw

the plot.

... additional arguments to pass to ggplot2::theme.

#### Value

A ggplot object defining the plot.

## See Also

Subtree statistics are calculated with summarizeSubtrees.

```
# Define example tree set
graphs <- ExampleTrees[1-10]

# Violin plots of node outdegree by sample
plotSubtrees(graphs, "sample_id", "out", style="v")

# Violin plots of subtree size by sample
plotSubtrees(graphs, "sample_id", "size", style="v")

# Boxplot of node depth by isotype
plotSubtrees(graphs, "c_call", "depth", style="b")</pre>
```

polar 75

polar

Calculates the average polarity of amino acid sequences

## **Description**

polar calculates the average polarity score of amino acid sequences. Non-informative positions are excluded, where non-informative is defined as any character in c("X","-","","\*").

## Usage

```
polar(seq, polarity = NULL)
```

## **Arguments**

seq vector of strings containing amino acid sequences.

polarity named numerical vector defining polarity scores for each amino acid, where

names are single-letter amino acid character codes. If NULL, then the Grantham,

1974 scale is used.

## Value

A vector of bulkiness scores for the sequence(s).

## References

1. Grantham R. Amino acid difference formula to help explain protein evolution. Science 185, 862-864 (1974).

## See Also

For additional size related indices see aaindex.

```
# Default scale
seq <- c("CARDRSTPWRRGIASTTVRTSW", "XXTQMYVRT")
polar(seq)

# Use the Zimmerman et al, 1968 polarity scale from the seqinr package
library(seqinr)
data(aaindex)
x <- aaindex[["ZIMJ680103"]]$I
# Rename the score vector to use single-letter codes
names(x) <- translateStrings(names(x), ABBREV_AA)
# Calculate polarity
polar(seq, polarity=x)</pre>
```

76 rarefyDiversity

progressBar

Standard progress bar

# Description

progressBar defines a common progress bar format.

# Usage

```
progressBar(n)
```

## **Arguments**

n

maximum number of ticks

#### Value

A progress\_bar object.

rarefyDiversity

Generate a clonal diversity index curve

# Description

rarefyDiversity divides a set of clones by a group annotation, resamples the sequences from each group, and calculates diversity scores (D) over an interval of diversity orders (q).

# Usage

```
rarefyDiversity(
  data,
  group,
  clone = "CLONE",
  copy = NULL,
  min_q = 0,
  max_q = 4,
  step_q = 0.05,
  min_n = 30,
  max_n = NULL,
  ci = 0.95,
  nboot = 2000,
  uniform = TRUE,
  progress = FALSE
)
```

rarefyDiversity 77

## **Arguments**

| data     | data.frame with Change-O style columns containing clonal assignments.   |  |
|----------|---|--|
| group    | name of the data column containing group identifiers.   |  |
| clone    | name of the data column containing clone identifiers.   |  |
| сору     | name of the data column containing copy numbers for each sequence. If copy=NULL (the default), then clone abundance is determined by the number of sequences. If a copy column is specified, then clone abundances is determined by the sum of copy numbers within each clonal group. |  |
| min_q    | minimum value of $q$ .  |  |
| max_q    | maximum value of $q$ .  |  |
| step_q   | value by which to increment $q$ .   |  |
| min_n    | minimum number of observations to sample. A group with less observations than the minimum is excluded.  |  |
| max_n    | maximum number of observations to sample. If NULL then no maximum is set.   |  |
| ci       | confidence interval to calculate; the value must be between 0 and 1.  |  |
| nboot    | number of bootstrap realizations to generate.   |  |
| uniform  | if TRUE then uniformly resample each group to the same number of observations. If FALSE then allow each group to be resampled to its original size or, if specified, max_size.  |  |
| progress | if TRUE show a progress bar.  |  |

## **Details**

Clonal diversity is calculated using the generalized diversity index (Hill numbers) proposed by Hill (Hill, 1973). See calcDiversity for further details.

Diversity is calculated on the estimated complete clonal abundance distribution. This distribution is inferred by using the Chao1 estimator to estimate the number of seen clones, and applying the relative abundance correction and unseen clone frequency described in Chao et al, 2015.

To generate a smooth curve, D is calculated for each value of q from  $\min_q$  to  $\max_q$  incremented by  $step_q$ . When  $\min_{r=1}^{q}$  when  $\min_{r=1}^{q}$  in total sequence counts across unique values in the group column is corrected by repeated resampling from the estimated complete clonal distribution to a common number of sequences.

The diversity index (D) for each group is the mean value of over all resampling realizations. Confidence intervals are derived using the standard deviation of the resampling realizations, as described in Chao et al, 2015.

## Value

A DiversityCurve object summarizing the diversity scores.

78 readChangeoDb

## References

- 1. Hill M. Diversity and evenness: a unifying notation and its consequences. Ecology. 1973 54(2):427-32.
- 2. Chao A. Nonparametric Estimation of the Number of Classes in a Population. Scand J Stat. 1984 11, 265270.
- 3. Chao A, et al. Rarefaction and extrapolation with Hill numbers: A framework for sampling and estimation in species diversity studies. Ecol Monogr. 2014 84:45-67.
- 4. Chao A, et al. Unveiling the species-rank abundance distribution by generalizing the Good-Turing sample coverage theory. Ecology. 2015 96, 11891201.

#### See Also

alphaDiversity

## **Examples**

readChangeoDb

Read a Change-O tab-delimited database file

## **Description**

readChangeoDb reads a tab-delimited database file created by a Change-O tool into a data.frame.

## Usage

```
readChangeoDb(file, select = NULL, drop = NULL, seq_upper = TRUE)
```

# **Arguments**

file tab-delimited database file output by a Change-O tool.

select columns to select from database file.

drop columns to drop from database file.

seq\_upper if TRUE convert sequence columns to upper case; if FALSE do not alter sequence

columns. See Value for a list of which columns are effected.

readFastqDb 79

## Value

A data frame of the database file. Columns will be imported as is, except for the following columns which will be explicitly converted into character values:

- SEQUENCE\_ID
- CLONE
- SAMPLE

And the following sequence columns which will converted to upper case if seq\_upper=TRUE (default).

- SEQUENCE\_INPUT
- SEQUENCE\_VDJ
- SEQUENCE\_IMGT
- JUNCTION
- GERMLINE IMGT
- GERMLINE\_IMGT\_D\_MASK

#### See Also

Wraps read\_delim. See writeChangeoDb for writing to Change-O files.

# **Examples**

readFastqDb

Load sequencing quality scores from a FASTQ file

## **Description**

readFastqDb adds the sequencing quality scores to a data.frame from a FASTQ file. Matching is done by 'sequence\_id'.

80 readFastqDb

#### Usage

```
readFastqDb(
  data,
  fastq_file,
  quality_offset = -33,
  header = c("presto", "asis"),
  sequence_id = "sequence_id",
  sequence = "sequence",
  sequence_alignment = "sequence_alignment",
  v_cigar = "v_cigar",
  d_cigar = "d_cigar"
  j_cigar = "j_cigar",
  np1_length = "np1_length",
  np2_length = "np2_length",
  v_sequence_end = "v_sequence_end",
  d_sequence_end = "d_sequence_end",
  style = c("num", "ascii", "both"),
  quality_sequence = FALSE
)
```

#### **Arguments**

data data. frame containing sequence data.

fastq\_file path to the fastq file

quality\_offset offset value to be used by ape::read.fastq. It is the value to be added to the

quality scores (the default -33 applies to the Sanger format and should work for

most recent FASTQ files).

header FASTQ file header format; one of "presto" or "asis". Use "presto" to spec-

ify that the fastq file headers are using the pRESTO format and can be parsed to extract the sequence\_id. Use "asis" to skip any processing and use the

sequence names as they are.

sequence\_id column in data that contains sequence identifiers to be matched to sequence

identifiers in fastq\_file.

sequence column in data that contains sequence data.

sequence\_alignment

column in data that contains IMGT aligned sequence data.

v\_cigar column in data that contains CIGAR strings for the V gene alignments.

d\_cigar column in data that contains CIGAR strings for the D gene alignments.

j\_cigar column in data that contains CIGAR strings for the J gene alignments.

np1\_length column in data that contains the number of nucleotides between the V gene and

first D gene alignments or between the V gene and J gene alignments.

np2\_length column in data that contains the number of nucleotides between either the first

D gene and J gene alignments or the first D gene and second D gene alignments.

v\_sequence\_end column in data that contains the end position of the V gene in sequence.

readIgphyml 81

d\_sequence\_end column in data that contains the end position of the D gene in sequence.

style

how the sequencing quality should be returned; one of "num", "phred", or "both". Specify "num" to store the quality scores as strings of comma separated numeric values. Use "phred" to have the function return the scores as Phred (ASCII) scores. Use "both" to retrieve both.

quality\_sequence

specify TRUE to keep the quality scores for sequence. If false, only the quality score for sequence\_alignment will be added to data.

#### Value

Modified data with additional fields:

- 1. quality\_alignment: A character vector with ASCII Phred scores for sequence\_alignment.
- 2. quality\_alignment\_num: A character vector, with comma separated numerical quality values for each position in sequence\_alignment.
- 3. quality: A character vector with ASCII Phred scores for sequence.
- 4. quality\_num: A character vector, with comma separated numerical quality values for each position in sequence.

#### See Also

maskPositionsByQuality and getPositionQuality

## **Examples**

```
db <- airr::read_rearrangement(system.file("extdata", "example_quality.tsv", package="alakazam"))
fastq_file <- system.file("extdata", "example_quality.fastq", package="alakazam")
db <- readFastqDb(db, fastq_file, quality_offset=-33)</pre>
```

readIgphyml

Read in output from IgPhyML

# Description

readIgphyml reads output from the IgPhyML phylogenetics inference package for B cell repertoires

# Usage

```
readIgphyml(
   file,
   id = NULL,
   format = c("graph", "phylo"),
   collapse = FALSE,
   branches = c("mutations", "distance")
)
```

82 readIgphyml

#### **Arguments**

file IgPhyML output file (.tab).
id ID to assign to output object.

format if "graph" return trees as igraph graph objects. if "phylo" return trees as ape

phylo objects.

collapse if TRUE transform branch lengths to units of substitutions, rather than substitu-

tions per site, and collapse internal nodes separated by branches < 0.1 substitutions. Will also remove all internal node labels, as it makes them inconsistent.

branches if "distance" branch lengths are in expected mutations per site. If "mutations"

branches are in expected mutations.

#### Details

readIgphyml reads output from the IgPhyML repertoire phylogenetics inference package. The resulting object is divded between parameter estimates (usually under the HLP19 model), which provide information about mutation and selection pressure operating on the sequences.

Trees returned from this function are either igraph objects or phylo objects, and each may be visualized accordingly. Futher, branch lengths in tree may represent either the expected number of substitutions per site (codon, if estimated under HLP or GY94 models), or the total number of expected substitutions per site. If the latter, internal nodes - but not tips - separated by branch lengths less than 0.1 are collapsed to simplify viewing.

## Value

A list containing IgPhyML model parameters and estimated lineage trees.

Object attributes:

- param: Data.frame of parameter estimates for each clonal lineage. Columns include: CLONE, which is the clone id; NSEQ, the total number of sequences in the lineage; NSITE, the number of codon sites; TREE\_LENGTH, the sum of all branch lengths in the estimated lineage tree; and LHOOD, the log likelihood of the clone's sequences given the tree and parameters. Subsequent columns are parameter estimates from IgPhyML, which will depend on the model used. Parameter columns ending with \_MLE are maximum likelihood estimates; those ending with \_LCI are the lower 95 with \_UCI are the upper 95 estimate. The first line of param is for clone REPERTOIRE, which is a summary of all lineages within the repertoire. For this row, NSEQ is the total number of sequences, NSITE is the average number of sites, and TREE\_LENGTH is the mean tree length. For most applications, parameter values will be the same for all lineages within the repertoire, so access them simply by: <object>\$param\$OMEGA\_CDR\_MLE[1] to, for instance, get the estimate of dN/dS on the CDRs at the repertoire level.
- trees: List of tree objects estimated by IgPhyML. If format="graph" these are igraph graph objects. If format="phylo", these are ape phylo objects.
- command: Command used to run IgPhyML.

#### References

 Hoehn KB, Lunter G, Pybus OG - A Phylogenetic Codon Substitution Model for Antibody Lineages. Genetics 2017 206(1):417-427 https://doi.org/10.1534/genetics.116.196303 seqDist 83

2. Hoehn KB, Vander Heiden JA, Zhou JQ, Lunter G, Pybus OG, Kleinstein SHK - Repertoire-wide phylogenetic models of B cell molecular evolution reveal evolutionary signatures of aging and vaccination. bioRxiv 2019 https://doi.org/10.1101/558825

## **Examples**

```
## Not run:
    # Read in and plot a tree from an igphyml run
library(igraph)
s1 <- readIgphyml("IB+7d_lineages_gy.tsv_igphyml_stats_hlp.tab", id="+7d")
print(s1$param$OMEGA_CDR_MLE[1])
plot(s1$trees[[1]], layout=layout_as_tree, edge.label=E(s1$trees[[1]])$weight)
## End(Not run)</pre>
```

seqDist

Calculate distance between two sequences

#### Description

seqDist calculates the distance between two DNA sequences.

## Usage

```
seqDist(seq1, seq2, dist_mat = getDNAMatrix())
```

#### **Arguments**

seq1 character string containing a DNA sequence. seq2 character string containing a DNA sequence.

dist\_mat Character distance matrix. Defaults to a Hamming distance matrix returned by

getDNAMatrix. If gap characters, c("-","."), are assigned a value of -1 in dist\_mat then contiguous gaps of any run length, which are not present in both sequences, will be counted as a distance of 1. Meaning, indels of any length will increase the sequence distance by 1. Gap values other than -1 will return a

distance that does not consider indels as a special case.

## Value

Numerical distance between seq1 and seq2.

## See Also

Nucleotide distance matrix may be built with getDNAMatrix. Amino acid distance matrix may be built with getAAMatrix. Used by pairwiseDist for generating distance matrices. See seqEqual for testing sequence equivalence.

84 seqEqual

## **Examples**

```
# Ungapped examples
seqDist("ATGGC", "ATGGG")
seqDist("ATGGC", "ATG??")
# Gaps will be treated as Ns with a gap=0 distance matrix
seqDist("ATGGC", "AT--C", dist_mat=getDNAMatrix(gap=0))
# Gaps will be treated as universally non-matching characters with gap=1
seqDist("ATGGC", "AT--C", dist_mat=getDNAMatrix(gap=1))
# Gaps of any length will be treated as single mismatches with a gap=-1 distance matrix
seqDist("ATGGC", "AT--C", dist_mat=getDNAMatrix(gap=-1))
# Gaps of equivalent run lengths are not counted as gaps
seqDist("ATG-C", "ATG-C", dist_mat=getDNAMatrix(gap=-1))
# Overlapping runs of gap characters are counted as a single gap
seqDist("ATG-C", "AT--C", dist_mat=getDNAMatrix(gap=-1))
seqDist("A-GGC", "AT--C", dist_mat=getDNAMatrix(gap=-1))
seqDist("AT--C", "AT--C", dist_mat=getDNAMatrix(gap=-1))
# Discontiguous runs of gap characters each count as separate gaps
seqDist("-TGGC", "AT--C", dist_mat=getDNAMatrix(gap=-1))
```

seqEqual

Test DNA sequences for equality.

## **Description**

seqEqual checks if two DNA sequences are identical.

## Usage

```
seqEqual(seq1, seq2, ignore = as.character(c("N", "-", ".", "?")))
```

## **Arguments**

seq1 character string containing a DNA sequence.
seq2 character string containing a DNA sequence.
ignore vector of characters to ignore when testing for equality. Default is to ignore c("N",".","-","?")

#### Value

Returns TRUE if sequences are equal and FALSE if they are not. Sequences of unequal length will always return FALSE regardless of their character values.

SingleDb 85

## See Also

Used by pairwiseEqual within collapseDuplicates. See seqDist for calculation Hamming distances between sequences.

# **Examples**

```
# Ignore gaps
seqEqual("ATG-C", "AT--C")
seqEqual("ATGGC", "ATGGN")
seqEqual("AT--T", "ATGGC")

# Ignore only Ns
seqEqual("ATG-C", "AT--C", ignore="N")
seqEqual("ATGGC", "ATGGN", ignore="N")
seqEqual("AT--T", "ATGGC", ignore="N")
```

SingleDb

Single sequence AIRR database

## **Description**

A database with just one sequence from ExampleDb and additional AIRR Rearrangement fields containing alignment information. The sequence was reanalyzed with a recent versions of alignment software (IgBLAST 1.16.0) and reference germlines (IMGT 2020-08-12).

## Usage

SingleDb

#### **Format**

An object of class spec\_tbl\_df (inherits from tbl\_df, tbl, data.frame) with 1 rows and 32 columns.

## See Also

ExampleDb

86 sortGenes

sortGenes

Sort V(D)J genes

## **Description**

sortGenes sorts a vector of V(D)J gene names by either lexicographic ordering or locus position.

## Usage

```
sortGenes(genes, method = c("name", "position"))
```

# Arguments

genes

vector of strings respresenting V(D)J gene names.

method

string defining the method to use for sorting genes. One of:

- "name": sort in lexicographic order. Order is by family first, then gene, and then allele.
- "position": sort by position in the locus, as determined by the final two numbers in the gene name. Non-localized genes are assigned to the highest positions.

## Value

A sorted character vector of gene names.

#### See Also

See getAllele, getGene and getFamily for parsing gene names.

stoufferMeta 87

stoufferMeta

Weighted meta-analysis of p-values via Stouffer's method

## **Description**

stoufferMeta combines multiple weighted p-values into a meta-analysis p-value using Stouffer's Z-score method.

## Usage

```
stoufferMeta(p, w = NULL)
```

## **Arguments**

p numeric vector of p-values.w numeric vector of weights.

## Value

A named numeric vector with the combined Z-score and p-value in the form c(Z,pvalue).

## **Examples**

```
# Define p-value and weight vectors
p <- c(0.1, 0.05, 0.3)
w <- c(5, 10, 1)

# Unweighted
stoufferMeta(p)

# Weighted
stoufferMeta(p, w)</pre>
```

summarizeSubtrees

Generate subtree summary statistics for a tree

# Description

summarizeSubtrees calculates summary statistics for each node of a tree. Includes both node properties and subtree properties.

# Usage

```
summarizeSubtrees(graph, fields = NULL, root = "Germline")
```

88 tableEdges

# **Arguments**

| graph  | igraph object containing an annotated lineage tree. |
|--------|---|
| fields | annotation fields to add to the output.             |
| root   | name of the root (germline) node.                   |

#### Value

A data.frame with columns:

- name: node name.
- parent: name of the parent node.
- outdegree: number of edges leading from the node.
- size: total number of nodes within the subtree rooted at the node.
- depth: the depth of the subtree that is rooted at the node.
- pathlength: the maximum pathlength beneath the node.
- outdegree\_norm: outdegree normalized by the total number of edges.
- size\_norm: size normalized by the largest subtree size (the germline).
- depth\_norm: depth normalized by the largest subtree depth (the germline).
- pathlength\_norm: pathlength normalized by the largest subtree pathlength (the germline).

An additional column corresponding to the value of field is added when specified.

## See Also

See buildPhylipLineage for generating input trees. See getPathLengths for calculating path length to nodes.

## **Examples**

```
# Summarize a tree
graph <- ExampleTrees[[23]]
summarizeSubtrees(graph, fields="c_call", root="Germline")</pre>
```

tableEdges

Tabulate the number of edges between annotations within a lineage tree

## Description

tableEdges creates a table of the total number of connections (edges) for each unique pair of annotations within a tree over all nodes.

## Usage

```
tableEdges(graph, field, indirect = FALSE, exclude = NULL)
```

testDiversity 89

# Arguments

| graph    | igraph object containing an annotated lineage tree.  |
|----------|--|
| field    | string defining the annotation field to count.   |
| indirect | if FALSE count direct connections (edges) only. If TRUE walk through any nodes with annotations specified in the argument to count indirect connections. Specifying indirect=TRUE with exclude=NULL will have no effect. |
| exclude  | vector of strings defining field values to exclude from counts. Edges that either start or end with the specified annotations will not be counted. If NULL count all   |

## Value

A data.frame defining total annotation connections in the tree with columns:

parent: parent annotationchild: child annotation

edges.

• count: count of edges for the parent-child relationship

#### See Also

See testEdges for performed a permutation test on edge relationships.

## **Examples**

```
# Define example graph
graph <- ExampleTrees[[23]]

# Count direct edges between isotypes including inferred nodes
tableEdges(graph, "c_call")

# Count direct edges excluding edges to and from germline and inferred nodes
tableEdges(graph, "c_call", exclude=c("Germline", NA))

# Count indirect edges walking through germline and inferred nodes
tableEdges(graph, "c_call", indirect=TRUE, exclude=c("Germline", NA))</pre>
```

testDiversity

Pairwise test of the diversity index

# Description

testDiversity performs pairwise significance tests of the diversity index (D) at a given diversity order (q) for a set of annotation groups via rarefaction and bootstrapping.

90 testDiversity

## Usage

```
testDiversity(
  data,
  q,
  group,
  clone = "CLONE",
  copy = NULL,
  min_n = 30,
  max_n = NULL,
  nboot = 2000,
  progress = FALSE,
  ci = 0.95
)
```

#### **Arguments**

| data     | data.frame with Change-O style columns containing clonal assignments.   |
|----------|---|
| q        | diversity order to test.  |
| group    | name of the data column containing group identifiers.   |
| clone    | name of the data column containing clone identifiers.   |
| copy     | name of the data column containing copy numbers for each sequence. If copy=NULL (the default), then clone abundance is determined by the number of sequences. If a copy column is specified, then clone abundances is determined by the sum of copy numbers within each clonal group. |
| min_n    | minimum number of observations to sample. A group with less observations than the minimum is excluded.  |
| max_n    | maximum number of observations to sample. If NULL the maximum if automatically determined from the size of the largest group.   |
| nboot    | number of bootstrap realizations to perform.  |
| progress | if TRUE show a progress bar.  |
| ci       | confidence interval to calculate; the value must be between 0 and 1.  |

## **Details**

Clonal diversity is calculated using the generalized diversity index proposed by Hill (Hill, 1973). See calcDiversity for further details.

Diversity is calculated on the estimated complete clonal abundance distribution. This distribution is inferred by using the Chao1 estimator to estimate the number of seen clones, and applying the relative abundance correction and unseen clone frequency described in Chao et al, 2014.

Variability in total sequence counts across unique values in the group column is corrected by repeated resampling from the estimated complete clonal distribution to a common number of sequences. The diversity index estimate (D) for each group is the mean value of over all bootstrap realizations.

Significance of the difference in diversity index (D) between groups is tested by constructing a bootstrap delta distribution for each pair of unique values in the group column. The bootstrap delta

testDiversity 91

distribution is built by subtracting the diversity index Da in group - a from the corresponding value Db in group - b, for all bootstrap realizations, yeilding a distribution of nboot total deltas; where group - a is the group with the greater mean D. The p-value for hypothesis Da! = Db is the value of P(0) from the empirical cumulative distribution function of the bootstrap delta distribution, multiplied by 2 for the two-tailed correction.

#### Value

A Diversity Curve object containing slot test with p-values and summary statistics.

#### Note

This method may inflate statistical significance when clone sizes are uniformly small, such as when most clones sizes are 1, sample size is small, and max\_n is near the total count of the smallest data group. Use caution when interpreting the results in such cases. We are currently investigating this potential problem.

#### References

- 1. Hill M. Diversity and evenness: a unifying notation and its consequences. Ecology. 1973 54(2):427-32.
- 2. Chao A. Nonparametric Estimation of the Number of Classes in a Population. Scand J Stat. 1984 11, 265270.
- 3. Wu Y-CB, et al. Influence of seasonal exposure to grass pollen on local and peripheral blood IgE repertoires in patients with allergic rhinitis. J Allergy Clin Immunol. 2014 134(3):604-12.
- 4. Chao A, et al. Rarefaction and extrapolation with Hill numbers: A framework for sampling and estimation in species diversity studies. Ecol Monogr. 2014 84:45-67.
- 5. Chao A, et al. Unveiling the species-rank abundance distribution by generalizing the Good-Turing sample coverage theory. Ecology. 2015 96, 11891201.

## See Also

alphaDiversity

```
## Not run:
# Groups under the size threshold are excluded and a warning message is issued.
testDiversity(ExampleDb, "sample_id", q=0, min_n=30, nboot=100)
## End(Not run)
```

92 testEdges

testEdges

Tests for parent-child annotation enchrichment in lineage trees

## **Description**

testEdges performs a permutation test on a set of lineage trees to determine the significance of an annotation's association with parent-child relationships.

## Usage

```
testEdges(
  graphs,
  field,
  indirect = FALSE,
  exclude = c("Germline", NA),
  nperm = 200,
  progress = FALSE
)
```

## **Arguments**

graphs list of igraph objects with vertex annotations.
field string defining the annotation field to permute.

indirect if FALSE count direct connections (edges) only. If TRUE walk through any nodes

with annotations specified in the argument to count indirect connections. Spec-

ifying indirect=TRUE with exclude=NULL will have no effect.

exclude vector of strings defining field values to exclude from permutation.

nperm number of permutations to perform.

progress if TRUE show a progress bar.

## Value

An EdgeTest object containing the test results and permutation realizations.

#### See Also

Uses tableEdges and permuteLabels. See plotEdgeTest for plotting the permutation distributions.

```
# Define example tree set
graphs <- ExampleTrees[1-10]

# Perform edge test on isotypes
x <- testEdges(graphs, "c_call", nperm=10)
print(x)</pre>
```

testMRCA 93

testMRCA

Tests for MRCA annotation enrichment in lineage trees

# **Description**

testMRCA performs a permutation test on a set of lineage trees to determine the significance of an annotation's association with the MRCA position of the lineage trees.

# Usage

```
testMRCA(
  graphs,
  field,
  root = "Germline",
  exclude = c("Germline", NA),
  nperm = 200,
  progress = FALSE
)
```

## **Arguments**

graphs list of igraph object containing annotated lineage trees.

field string defining the annotation field to test.

root name of the root (germline) node.

exclude vector of strings defining field values to exclude from the set of potential

founder annotations.

nperm number of permutations to perform.

progress if TRUE show a progress bar.

#### Value

An MRCATest object containing the test results and permutation realizations.

## See Also

Uses getMRCA and getPathLengths. See plotMRCATest for plotting the permutation distributions.

94 translateDNA

## **Examples**

```
# Define example tree set
graphs <- ExampleTrees[1-10]

# Perform MRCA test on isotypes
x <- testMRCA(graphs, "c_call", nperm=10)
print(x)</pre>
```

translateDNA

Translate nucleotide sequences to amino acids

## **Description**

translateDNA translates nucleotide sequences to amino acid sequences.

# Usage

```
translateDNA(seq, trim = FALSE)
```

# Arguments

seq vector of strings defining DNA sequence(s) to be converted to translated.

trim boolean flag to remove 3 nts from both ends of seq (converts IMGT junction to

CDR3 region).

#### Value

A vector of translated sequence strings.

## See Also

translate.

```
# Translate a single sequence
translateDNA("ACTGACTCGA")

# Translate a vector of sequences
translateDNA(ExampleDb$junction[1:3])

# Remove the first and last codon from the translation
translateDNA(ExampleDb$junction[1:3], trim=TRUE)
```

translateStrings 95

| translateStrings |
|------------------|
|------------------|

Translate a vector of strings

# Description

translateStrings modifies a character vector by substituting one or more strings with a replacement string.

## Usage

```
translateStrings(strings, translation)
```

## **Arguments**

strings vector of character strings to modify.

translation named character vector or a list of character vectors specifying the strings to

replace (values) and their replacements (names).

## **Details**

Does not perform partial replacements. Each translation value must match a complete strings value or it will not be replaced. Values that do not have a replacement named in the translation parameter will not be modified.

Replacement is accomplished using gsub.

#### Value

A modified strings vector.

#### See Also

See gsub for single value replacement in the base package.

```
# Using a vector translation
strings <- LETTERS[1:5]
translation <- c("POSITION1"="A", "POSITION5"="E")
translateStrings(strings, translation)

# Using a list translation
strings <- LETTERS[1:5]
translation <- list("1-3"=c("A","B","C"), "4-5"=c("D","E"))
translateStrings(strings, translation)</pre>
```

96 writeChangeoDb

writeChangeoDb

Write a Change-O tab-delimited database file

# Description

writeChangeoDb is a simple wrapper around write\_delim with defaults appropriate for writing a Change-O tab-delimited database file from a data.frame.

# Usage

```
writeChangeoDb(data, file)
```

# Arguments

data data.frame of Change-O data.

file output file name.

## See Also

Wraps write\_delim. See readChangeoDb for reading to Change-O files.

```
## Not run:
    # Write a database
    writeChangeoDb(data, "changeo.tsv")
## End(Not run)
```

# **Index**

| * datasets                                      | cpuCount, 28                             |
|---|--|
| ABBREV_AA, 4                                    | DEFAULT COLORG 20                        |
| DEFAULT_COLORS, 29                              | DEFAULT_COLORS, 29                       |
| Example10x, 33                                  | dir.create, 56                           |
| ExampleDb, 34                                   | DiversityCurve, 9, 68, 69, 77, 91        |
| ExampleDbChangeo, 35                            | DiversityCurve (DiversityCurve-class),   |
| ExampleTrees, 36                                | 30                                       |
| IMGT_REGIONS, 50                                | DiversityCurve-class, 30                 |
| IUPAC_CODES, 51                                 | DiversityCurve-method                    |
| SingleDb, 85                                    | (DiversityCurve-class), 30               |
|   | DNA_COLORS (DEFAULT_COLORS), 29          |
| aaindex, <i>16</i> , <i>47</i> , <i>75</i>      | DNA_IUPAC (IUPAC_CODES), 51              |
| ABBREV_AA, 4, <i>51</i>                         |  |
| AbundanceCurve, 8, 33, 67                       | EdgeTest, <i>71</i> , <i>92</i>          |
| AbundanceCurve (AbundanceCurve-class), 4        | EdgeTest (EdgeTest-class), 31            |
| AbundanceCurve-class, 4                         | EdgeTest-class, 31                       |
| AbundanceCurve-method                           | EdgeTest-method (EdgeTest-class), 31     |
| (AbundanceCurve-class), 4                       | estimateAbundance, 6, 8, 32, 67          |
| alakazam, 5                                     | Example10x, 33                           |
| aliphatic, 7, 10, 12                            | ExampleDb, 34, 36, 85                    |
| alphaDiversity, 6, 8, 17, 18, 33, 68-70, 78,    | ExampleDbChangeo, 35, 35                 |
| 91  | ExampleTrees, <i>35</i> , <i>36</i> , 36 |
| aminoAcidProperties, $7$ , $10$                 | extractVRegion, $6,36$                   |
| baseTheme, 12                                   | getAAMatrix, 37, 38, 61, 63, 83          |
| buildPhylipLineage, 6, 13, 19, 36, 40, 55, 88   | getAllele, $6,42$                        |
| bulk, 10, 12, 15                                | getAllele(getSegment), 42                |
|   | <pre>getChain(getSegment), 42</pre>      |
| calcCoverage, 16                                | getDNAMatrix, 13, 38, 38, 61, 63, 83     |
| calcDiversity, 8, 9, 17, 77, 90                 | getFamily, $6,42$                        |
| ChangeoClone, <i>13</i> , <i>15</i> , <i>55</i> | <pre>getFamily (getSegment), 42</pre>    |
| ChangeoClone (ChangeoClone-class), 18           | getGene, <i>6</i> , <i>42</i>            |
| ChangeoClone-class, 18                          | getGene (getSegment), 42                 |
| charge, 10, 12, 19                              | getLocus (getSegment), 42                |
| checkColumns, 20                                | getMRCA, 39, 93                          |
| collapseDuplicates, $6$ , $21$ , $55$ , $85$    | getPathLengths, 40, 40, 88, 93           |
| combineIgphyml, 23                              | getPositionQuality, 41, 57, 81           |
| countClones, 6, 24                              | getSegment, 42                           |
| countGenes, 6, 26, 44                           | ggplot, 47, 67, 69, 70                   |
| countPatterns, 7, 12, 27                        | graph, <i>15</i>                         |
| , , ,   | ÷ . , ,                                  |

98 INDEX

| graphToPhylo, 45  | plotMRCATest, 60, 72, 93                          |
|---|---|
| gravy, 10, 12, 46   | plotSubtrees, 6, 73                               |
| gridPlot, 47  | polar, 10, 12, 75                                 |
| groupGenes, 48  | print,AbundanceCurve-method                       |
| gsub, 95  | (AbundanceCurve-class), 4                         |
|   | <pre>print,DiversityCurve-method</pre>            |
| IG_COLORS (DEFAULT_COLORS), 29                                      | (DiversityCurve-class), 30                        |
| IMGT_REGIONS, 37, 50  | <pre>print,EdgeTest-method(EdgeTest-class),</pre> |
| isValidAASeq, 50  | 31  |
| IUPAC_AA, <i>51</i>   | <pre>print,MRCATest-method(MRCATest-class),</pre> |
| IUPAC_AA (IUPAC_CODES), 51  | 60  |
| IUPAC_CODES, 51   | progress_bar, 76                                  |
| IUPAC_DNA, 22   | progressBar, 76                                   |
| IUPAC_DNA (IUPAC_CODES), 51   |   |
|   | rarefyDiversity, 76                               |
| junctionAlignment, $6,52$   | read_delim, 79                                    |
|   | readChangeoDb, $6$ , $78$ , $96$                  |
| makeChangeoClone, 6, 19, 53   | readFastqDb, <i>41</i> , <i>57</i> , <i>7</i> 9   |
| makeTempDir, 15, 56   | readIgphyml, 23, 24, 81                           |
| maskPositionsByQuality, 41, 57, 81                                  |   |
| maskSeqEnds, 6, 55, 58, 59, 62                                      | seqDist, 7, 15, 38, 61, 63, 83, 85                |
| maskSeqGaps, 6, 55, 58, 59  | seqEqual, 7, 22, 64, 83, 84                       |
| MRCATest, 72, 93  | SingleDb, 85                                      |
| MRCATest (MRCATest-class), 60                                       | sortGenes, 86                                     |
| MRCATest-class, 60  | stoufferMeta, 87                                  |
| ${\tt MRCATest-method} \; ({\tt MRCATest-class}), \; 60$            | summarizeSubtrees, 6, 74, 87                      |
| nanamuanaDiat (1  | tableEdges, 6, 88, 92                             |
| nonsquareDist, 61   | tempfile, 56                                      |
| nadSagEnds 55 58 62   | testDiversity, 89                                 |
| padSeqEnds, 55, 58, 62  | testEdges, 6, 65, 71, 72, 89, 92                  |
| pairwiseDist, 7, 63, 64, 83<br>pairwiseEqual, 7, 22, 61, 63, 64, 85 | testMRCA, 6, 72, 93                               |
| permuteLabels, 64, 92   | theme, <i>13</i>                                  |
| phyloToGraph, 65  | TR_COLORS (DEFAULT_COLORS), 29                    |
| pk, 20  | translate, 94                                     |
| plot, AbundanceCurve, missing-method                                | translateDNA, 7, 94                               |
| (AbundanceCurve-class), 4   | translateStrings, 95                              |
| plot,DiversityCurve,missing-method                                  |   |
| (DiversityCurve-class), 30  | write_delim, 96                                   |
| plot,DiversityCurve,numeric-method                                  | writeChangeoDb, $6,79,96$                         |
| (DiversityCurve-class), 30  |   |
| plot, EdgeTest, missing-method                                      |   |
| (EdgeTest-class), 31  |   |
| plot, MRCATest, missing-method                                      |   |
| (MRCATest-class), 60  |   |
| plotAbundanceCurve, 6, 33, 66                                       |   |
| plotDiversityCurve, 5, 6, 9, 30, 68                                 |   |
| plotDiversityTest, 6, 30, 69  |   |
| plotEdgeTest, 31, 70, 92  |   |
|   |   |