# Package 'tigger'

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```
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     any novel alleles. This information is then used to correct existing V
     allele calls from among the sample sequences.
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     Gadala-Maria, et al (2019) <doi:10.3389/fimmu.2019.00129>.
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```

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# Description

AIRRDb

A data.frame of example V(D)J immunoglobulin sequences derived from a single individual (PGP1), sequenced on the Roche 454 platform, and assigned by IMGT/HighV-QUEST to IGHV1 family alleles.

Example human immune repertoire data

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### **Format**

A data. frame where rows correspond to unique V(D)J sequences and columns include:

- "sequence\_alignment": IMGT-gapped V(D)J nucleotide sequence.
- "v\_call": IMGT/HighV-QUEST V segment allele calls.
- "d\_call": IMGT/HighV-QUEST D segment allele calls.
- "j\_call": IMGT/HighV-QUEST J segment allele calls.
- "junction\_length": Junction region length.

### References

Gadala-Maria, et al. (2015) Automated analysis of high-throughput B cell sequencing data reveals a high frequency of novel immunoglobulin V gene segment alleles. PNAS. 112(8):E862-70.

#### See Also

See SampleDb for Change-O formatted version of AIRRDb.

cleanSeqs

Clean up nucleotide sequences

# Description

```
cleanSeqs capitalizes nucleotides and replaces all characters besides c("A", "C", "G", "T", "-", ".") with "N".
```

### Usage

```
cleanSeqs(seqs)
```

# **Arguments**

seqs

vector of nucleotide sequences.

### Value

A modified vector of nucleotide sequences.

#### See Also

sortAlleles and updateAlleleNames can help format a list of allele names.

# **Examples**

```
# Clean messy nucleotide sequences
seqs <- c("AGAT.taa-GAG...ATA", "GATACAGTXXZZAGNNPPACA")
cleanSeqs(seqs)</pre>
```

findNovelAlleles

Find novel alleles from repertoire sequencing data

# Description

findNovelAlleles analyzes mutation patterns in sequences thought to align to each germline allele in order to determine which positions might be polymorphic.

# Usage

```
findNovelAlleles(
  data,
  germline_db,
  v_call = "v_call",
  j_call = "j_call",
  seq = "sequence_alignment",
  junction = "junction",
  junction_length = "junction_length",
  germline_min = 200,
 min\_seqs = 50,
  auto_mutrange = TRUE,
 mut\_range = 1:10,
 pos_range = 1:312,
 pos_range_max = NULL,
 y_{intercept} = 0.125,
 alpha = 0.05,
  j_{max} = 0.15,
 min_frac = 0.75,
 nproc = 1
)
```

### **Arguments**

| data            | data. frame containing repertoire data. See details.   |
|-----------------|--|
| germline_db     | vector of named nucleotide germline sequences matching the $\boldsymbol{V}$ calls in data. These should be the gapped reference germlines used to make the $\boldsymbol{V}$ calls. |
| v_call          | name of the column in data with $V$ allele calls. Default is $v\_call$ .   |
| j_call          | name of the column in data with $J$ allele calls. Default is $j\_call$ .   |
| seq             | name of the column in data with the aligned, IMGT-numbered, $V(D)J$ nucleotide sequence. Default is sequence_alignment.  |
| junction        | Junction region nucleotide sequence, which includes the CDR3 and the two flanking conserved codons. Default is junction.   |
| iunction length |  |

Number of junction nucleotides in the junction sequence. Default is junction\_length.

| germline_min  | the minimum number of sequences that must have a particular germline allele call for the allele to be analyzed.  |
|---------------|--|
| min_seqs      | minimum number of total sequences (within the desired mutational range and nucleotide range) required for the samples to be considered.  |
| auto_mutrange | if TRUE, the algorithm will attempt to determine the appropriate mutation range automatically using the mutation count of the most common sequence assigned to each allele analyzed.   |
| mut_range     | range of mutations that samples may carry and be considered by the algorithm.  |
| pos_range     | range of IMGT-numbered positions that should be considered by the algorithm.   |
| pos_range_max | Name of the column in data with the ending positions of the V alignment in the germline (usually v_germline_end). The end of the alignment will be used to limit the range of positions to be considered to count mutations. With NULL all positions in the IMGT V region will be considered. In this case, in sequences where the V was trimmed on the 3', mutated nucleotides could include nucleotides from the CDR3. |
| y_intercept   | y-intercept threshold above which positions should be considered potentially polymorphic.  |
| alpha         | alpha value used for determining whether the fit y-intercept is greater than the $y\_intercept$ threshold.   |
| j_max         | maximum fraction of sequences perfectly aligning to a potential novel allele that are allowed to utilize to a particular combination of junction length and $J$ gene. The closer to 1, the less strict the filter for junction length and $J$ gene diversity will be.  |
| min_frac      | minimum fraction of sequences that must have usable nucleotides in a given position for that position to considered.   |
| nproc         | number of processors to use.   |
|               |  |

# **Details**

The TIgGER allele-finding algorithm, briefly, works as follows: Mutations are determined through comparison to the provided germline. Mutation frequency at each \*position\* is determined as a function of \*sequence-wide\* mutation counts. Polymorphic positions exhibit a high mutation frequency despite sequence-wide mutation count. False positive of potential novel alleles resulting from clonally-related sequences are guarded against by ensuring that sequences perfectly matching the potential novel allele utilize a wide range of combinations of J gene and junction length.

# Value

A data.frame with a row for each known allele analyzed. Besides metadata on the the parameters used in the search, each row will have either a note as to where the polymorphism-finding algorithm exited or a nucleotide sequence for the predicted novel allele, along with columns providing additional evidence.

The output contains the following columns:

- germline\_call: The input (uncorrected) V call.
- note: Comments regarding the inferrence.

- polymorphism\_call: The novel allele call.
- nt\_substitutions: Mutations identified in the novel allele, relative to the reference germline (germline\_call)
- novel\_imgt: The novel allele sequence.
- novel\_imgt\_count: The number of times the sequence novel\_imgt is found in the input data. Considers the subsequence of novel\_imgt in the pos\_range.
- novel\_imgt\_unique\_j: Number of distinct J calls associated to novel\_imgt in the input data. Considers the subsequence of novel\_imgt in the pos\_range.
- novel\_imgt\_unique\_cdr3: Number of distinct CDR3 sequences associated with novel\_imgt in the input data. Considers the subsequence of novel\_imgt in the pos\_range.
- perfect\_match\_count: Final number of sequences retained to call the new allele. These are unique sequences that have V segments that perfectly match the predicted germline in the pos\_range.
- perfect\_match\_freq: perfect\_match\_count / germline\_call\_count
- germline\_call\_count: The number of sequences with the germline\_call in the input data that were initially considered for the analysis.
- germline\_call\_freq: The fraction of sequences with the germline\_call in the input data initially considered for the analysis.
- germline\_imgt: Germline sequence for germline\_call.
- germline\_imgt\_count: The number of times the germline\_imgt sequence is found in the input data.
- mut\_min: Minimum mutation considered by the algorithm.
- mut\_max: Maximum mutation considered by the algorithm.
- mut\_pass\_count: Number of sequences in the mutation range.
- pos\_min: First position of the sequence considered by the algorithm (IMGT numbering).
- pos\_max: Last position of the sequence considered by the algorithm (IMGT numbering).
- y\_intercept: The y-intercept above which positions were considered potentially polymorphic.
- y\_intercept\_pass: Number of positions that pass the y\_intercept threshold.
- snp\_pass: Number of sequences that pass the y\_intercept threshold and are within the desired nucleotide range (min\_seqs).
- unmutated\_count: Number of unmutated sequences.
- unmutated\_freq: Number of unmutated sequences over germline\_imgt\_count.
- unmutated\_snp\_j\_gene\_length\_count: Number of distinct combinations of SNP, J gene, and junction length.
- snp\_min\_seqs\_j\_max\_pass: Number of SNPs that pass both the min\_seqs and j\_max thresholds.
- alpha: Significance threshold to be used when constructing the confidence interval for the y-intercept.
- min\_seqs: Input min\_seqs. The minimum number of total sequences (within the desired mutational range and nucleotide range) required for the samples to be considered.

• j\_max: Input j\_max. The maximum fraction of sequences perfectly aligning to a potential novel allele that are allowed to utilize to a particular combination of junction length and J gene.

• min\_frac: Input min\_frac. The minimum fraction of sequences that must have usable nucleotides in a given position for that position to be considered.

The following comments can appear in the note column:

- Novel allele found: A novel allele was detected.
- *Same as:*: The same novel allele sequence has been identified multiple times. If this happens, the function will also throw the message 'Duplicated polymorphism(s) found'.
- Plurality sequence too rare: No sequence is frequent enough to pass the J test (j\_max).
- *A J-junction combination is too prevalent*: Not enough J diversity (j\_max).
- *No positions pass y-intercept test*: No positions above y\_intercept.
- *Insufficient sequences in desired mutational range*: mut\_range and pos\_range.
- Not enough sequences: Not enough sequences in the desired mutational range and nucleotide range (min\_seqs).
- No unmutated versions of novel allele found: All observed variants of the allele are mutated.

#### See Also

selectNovel to filter the results to show only novel alleles. plotNovel to visualize the data supporting any novel alleles hypothesized to be present in the data and inferGenotype and inferGenotypeBayesian to determine if the novel alleles are frequent enought to be included in the subject's genotype.

# **Examples**

```
# Note: In this example, with SampleGermlineIGHV,
# which contains reference germlines retrieved on August 2014,
# TIgGER finds the allele IGHV1-8*02_G234T. This allele
# was added to IMGT as IGHV1-8*03 on March 28, 2018.
# Find novel alleles and return relevant data
novel <- findNovelAlleles(AIRRDb, SampleGermlineIGHV)
selectNovel(novel)</pre>
```

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| findUnmutatedCalls        | Determine which calls represent an unmutated allele |
|---------------------------|---|
| i iliuuliiliu ta teucaiis | Determine which cans represent an annualea affete   |

# Description

findUnmutatedCalls determines which allele calls would represent a perfect match with the germline sequence, given a vector of allele calls and mutation counts. In the case of multiple alleles being assigned to a sequence, only the subset that would represent a perfect match is returned.

# Usage

```
findUnmutatedCalls(allele_calls, sample_seqs, germline_db)
```

### **Arguments**

| allele_calls | vector of strings respresenting Ig allele calls, where multiple calls are separated by a comma.  |
|--------------|--|
| sample_seqs  | $V(D) J\mbox{-rearranged sample sequences matching the order of the given \verb allele_calls .}$ |
| germline_db  | vector of named nucleotide germline sequences  |

### Value

A vector of strings containing the members of allele\_calls that represent unmutated sequences.

# **Examples**

| generateEvidence | Generate evidence |  |  |  |
|------------------|-------------------|--|--|--|
|------------------|-------------------|--|--|--|

# **Description**

generateEvidence builds a table of evidence metrics for the final novel V allele detection and genotyping inferrences.

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### Usage

```
generateEvidence(
  data,
  novel,
  genotype,
  genotype_db,
  germline_db,
  j_call = "j_call",
  junction = "junction",
  fields = NULL
)
```

# **Arguments**

| data        | a data.frame containing sequence data that has been passed through reassignAlleles to correct the allele assignments.                                  |
|-------------|--|
| novel       | the data.frame returned by findNovelAlleles.   |
| genotype    | the data.frame of alleles generated with inferGenotype denoting the genotype of the subject.   |
| genotype_db | a vector of named nucleotide germline sequences in the genotype. Returned by genotypeFasta.  |
| germline_db | the original uncorrected germline database used to by findNovelAlleles to identify novel alleles.  |
| j_call      | name of the column in data with J allele calls. Default is j_call.   |
| junction    | Junction region nucleotide sequence, which includes the CDR3 and the two flanking conserved codons. Default is junction.                               |
| fields      | character vector of column names used to split the data to identify novel alleles, if any. If NULL then the data is not divided by grouping variables. |

# Value

Returns the genotype input data. frame with the following additional columns providing supporting evidence for each inferred allele:

- field\_id: Data subset identifier, defined with the input paramter fields.
- A variable number of columns, specified with the input parameter fields.
- $\bullet$  polymorphism\_call: The novel allele call.
- novel\_imgt: The novel allele sequence.
- closest\_reference: The closest reference gene and allele in the germline\_db database.
- closest\_reference\_imgt: Sequence of the closest reference gene and allele in the germline\_db database.
- germline\_call: The input (uncorrected) V call.
- germline\_imgt: Germline sequence for germline\_call.

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• nt\_diff: Number of nucleotides that differ between the new allele and the closest reference (closest\_reference) in the germline\_db database.

- nt\_substitutions: A comma separated list of specific nucleotide differences (e.g. 112G>A) in the novel allele.
- aa\_diff: Number of amino acids that differ between the new allele and the closest reference (closest\_reference) in the germline\_db database.
- aa\_substitutions: A comma separated list with specific amino acid differences (e.g. 96A>N)
  in the novel allele.
- sequences: Number of sequences unambiguosly assigned to this allele.
- unmutated\_sequences: Number of records with the unmutated novel allele sequence.
- unmutated\_frequency: Proportion of records with the unmutated novel allele sequence (unmutated\_sequences / sequences).
- allelic\_percentage: Percentage at which the (unmutated) allele is observed in the sequence dataset compared to other (unmutated) alleles.
- unique\_js: Number of unique J sequences found associated with the novel allele. The sequences are those who have been unambiguously assigned to the novel allelle (polymorphism\_call).
- unique\_cdr3s: Number of unique CDR3s associated with the inferred allele. The sequences are those who have been unambiguously assigned to the novel allelle (polymorphism call).
- mut\_min: Minimum mutation considered by the algorithm.
- mut\_max: Maximum mutation considered by the algorithm.
- pos\_min: First position of the sequence considered by the algorithm (IMGT numbering).
- pos\_max: Last position of the sequence considered by the algorithm (IMGT numbering).
- y\_intercept: The y-intercept above which positions were considered potentially polymorphic.
- alpha: Significance threshold to be used when constructing the confidence interval for the y-intercept.
- min\_seqs: Input min\_seqs. The minimum number of total sequences (within the desired mutational range and nucleotide range) required for the samples to be considered.
- j\_max: Input j\_max. The maximum fraction of sequences perfectly aligning to a potential novel allele that are allowed to utilize to a particular combination of junction length and J gene.
- min\_frac: Input min\_frac. The minimum fraction of sequences that must have usable nucleotides in a given position for that position to be considered.
- note: Comments regarding the novel allele inferrence.

### See Also

See findNovelAlleles, inferGenotype and genotypeFasta for generating the required input.

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## **Examples**

```
# Generate input data
novel <- findNovelAlleles(AIRRDb, SampleGermlineIGHV,</pre>
    v_call="v_call", j_call="j_call", junction="junction",
    junction_length="junction_length", seq="sequence_alignment")
genotype <- inferGenotype(AIRRDb, find_unmutated=TRUE,</pre>
                           germline_db=SampleGermlineIGHV,
                           novel=novel,
                           v_call="v_call", seq="sequence_alignment")
genotype_db <- genotypeFasta(genotype, SampleGermlineIGHV, novel)</pre>
data_db <- reassignAlleles(AIRRDb, genotype_db,</pre>
v_call="v_call", seq="sequence_alignment")
# Assemble evidence table
evidence <- generateEvidence(data_db, novel, genotype,</pre>
                              genotype_db, SampleGermlineIGHV,
                              j_call = "j_call",
                              junction = "junction")
```

genotypeFasta

Return the nucleotide sequences of a genotype

# Description

genotypeFasta converts a genotype table into a vector of nucleotide sequences.

### Usage

```
genotypeFasta(genotype, germline_db, novel = NA)
```

## **Arguments**

genotype data.frame of alleles denoting a genotype, as returned by inferGenotype.

vector of named nucleotide germline sequences matching the alleles detailed in genotype.

novel an optional data. frame containing putative novel alleeles of the type returned

by findNovelAlleles.

#### Value

A named vector of strings containing the germline nucleotide sequences of the alleles in the provided genotype.

### See Also

inferGenotype

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### **Examples**

```
# Find the sequences that correspond to the genotype
genotype_db <- genotypeFasta(SampleGenotype, SampleGermlineIGHV, SampleNovel)</pre>
```

GermlineIGHV

Human IGHV germlines

# Description

A character vector of all human IGHV germline gene segment alleles in IMGT/GENE-DB (2019-06-01, 372 alleles). See IMGT data updates: https://www.imgt.org/IMGTgenedbdoc/dataupdates.html.

# **Format**

Values correspond to IMGT-gaped nuceltoide sequences (with nucleotides capitalized and gaps represented by ".") while names correspond to stripped-down IMGT allele names (e.g. "IGHV1-18\*01").

#### References

1. Xochelli, et al. (2014) Immunoglobulin heavy variable (IGHV) genes and alleles: new entities, new names and implications for research and prognostication in chronic lymphocytic leukaemia. Immunogenetics. 67(1):61-6.

getMutatedPositions

Find the location of mutations in a sequence

### **Description**

getMutatedPositions takes two vectors of aligned sequences and compares pairs of sequences. It returns a list of the nucleotide positions of any differences.

### Usage

```
getMutatedPositions(
  samples,
  germlines,
  ignored_regex = "[\\.N-]",
  match_instead = FALSE
)
```

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### **Arguments**

samples vector of strings respresenting aligned sequences

germlines vector of strings respresenting aligned sequences to which samples will be com-

pared. If only one string is submitted, it will be used for all samples.

ignored\_regex regular expression indicating what characters should be ignored (such as gaps

and N nucleotides).

match\_instead if TRUE, the function returns the positions that are the same instead of those that

are different.

#### Value

A list of the nucleotide positions of any differences between the input vectors.

### **Examples**

```
# Create strings to act as a sample sequences and a reference sequence
seqs <- c("----GATA", "GAGAGAGA", "TANA")
ref <- "GATAGATA"

# Find the differences between the two
getMutatedPositions(seqs, ref)</pre>
```

getMutCount

Determine the mutation counts from allele calls

# Description

getMutCount takes a set of nucleotide sequences and their allele calls and determines the distance between that sequence and any germline alleles contained within the call

#### Usage

```
getMutCount(samples, allele_calls, germline_db)
```

# **Arguments**

samples vector of IMGT-gapped sample V sequences

allele\_calls vector of strings respresenting Ig allele calls for the sequences in samples,

where multiple calls are separated by a comma

germline\_db vector of named nucleotide germline sequences matching the calls detailed in

allele\_calls

# Value

A list equal in length to samples, containing the Hamming distance to each germline allele contained within each call within each element of samples

### **Examples**

getPopularMutationCount

Find mutation counts for frequency sequences

### **Description**

getPopularMutationCount determines which sequences occur frequently for each V gene and returns the mutation count of those sequences.

# Usage

```
getPopularMutationCount(
  data,
  germline_db,
  v_call = "v_call",
  seq = "sequence_alignment",
  gene_min = 0.001,
  seq_min = 50,
  seq_p_of_max = 1/8,
  full_return = FALSE
)
```

# Arguments

data data.frame in the Change-O format. See findNovelAlleles for a list of required columns.

germline\_db named list of IMGT-gapped germline sequences.

v\_call name of the column in data with V allele calls. Default is v\_call.

seq name of the column in data with the aligned, IMGT-numbered, V(D)J nucleotide sequence. Default is sequence\_alignment.

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| gene_min     | portion of all unique sequences a gene must constitute to avoid exclusion.                                    |
|--------------|---|
| seq_min      | number of copies of the V that must be present for to avoid exclusion.  |
| seq_p_of_max | ror each gene, the fraction of the most common V sequence count that a sequence must meet to avoid exclusion. |
| full_return  | if TRUE, will return all data columns and will include sequences with mutation count < 1.                     |

### Value

A data frame of genes that have a frequent sequence mutation count above 1.

#### See Also

getMutatedPositions can be used to find which positions of a set of sequences are mutated.

# **Examples**

```
getPopularMutationCount(AIRRDb, SampleGermlineIGHV)
```

inferGenotype

Infer a subject-specific genotype using a frequency method

# Description

inferGenotype infers an subject's genotype using a frequency method. The genotype is inferred by finding the minimum number set of alleles that can explain the majority of each gene's calls. The most common allele of each gene is included in the genotype first, and the next most common allele is added until the desired fraction of alleles can be explained. In this way, mistaken allele calls (resulting from sequences which by chance have been mutated to look like another allele) can be removed.

# Usage

```
inferGenotype(
  data,
  germline_db = NA,
  novel = NA,
  v_call = "v_call",
  seq = "sequence_alignment",
  fraction_to_explain = 0.875,
  gene_cutoff = 1e-04,
  find_unmutated = TRUE
)
```

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#### **Arguments**

data data. frame containing V allele calls from a single subject.

germline\_db named vector of sequences containing the germline sequences named in allele\_calls.

Only required if find\_unmutated is TRUE.

novel optional data. frame of the type novel returned by findNovelAlleles containing

germline sequences that will be utilized if find\_unmutated is TRUE. See Details.

v\_call column in data with V allele calls. Default is "v\_call".

seq name of the column in data with the aligned, IMGT-numbered, V(D)J nu-

cleotide sequence. Default is sequence\_alignment.

fraction\_to\_explain

the portion of each gene that must be explained by the alleles that will be in-

cluded in the genotype.

gene\_cutoff either a number of sequences or a fraction of the length of allele\_calls denot-

ing the minimum number of times a gene must be observed in allele\_calls to

be included in the genotype.

find\_unmutated if TRUE, use germline\_db to find which samples are unmutated. Not needed if

allele\_calls only represent unmutated samples.

#### **Details**

Allele calls representing cases where multiple alleles have been assigned to a single sample sequence are rare among unmutated sequences but may result if nucleotides for certain positions are not available. Calls containing multiple alleles are treated as belonging to all groups. If novel is provided, all sequences that are assigned to the same starting allele as any novel germline allele will have the novel germline allele appended to their assignent prior to searching for unmutated sequences.

# Value

A data.frame of alleles denoting the genotype of the subject containing the following columns:

- gene: The gene name without allele.
- alleles: Comma separated list of alleles for the given gene.
- counts: Comma separated list of observed sequences for each corresponding allele in the alleles list.
- total: The total count of observed sequences for the given gene.
- note: Any comments on the inferrence.

#### Note

This method works best with data derived from blood, where a large portion of sequences are expected to be unmutated. Ideally, there should be hundreds of allele calls per gene in the input.

# See Also

plotGenotype for a colorful visualization and genotypeFasta to convert the genotype to nucleotide sequences. See inferGenotypeBayesian to infer a subject-specific genotype using a Bayesian approach.

#### **Examples**

inferGenotypeBayesian Infer a subject-specific genotype using a Bayesian approach

### **Description**

inferGenotypeBayesian infers an subject's genotype by applying a Bayesian framework with a Dirichlet prior for the multinomial distribution. Up to four distinct alleles are allowed in an individual's genotype. Four likelihood distributions were generated by empirically fitting three high coverage genotypes from three individuals (Laserson and Vigneault et al, 2014). A posterior probability is calculated for the four most common alleles. The certainty of the highest probability model was calculated using a Bayes factor (the most likely model divided by second-most likely model). The larger the Bayes factor (K), the greater the certainty in the model.

#### Usage

```
inferGenotypeBayesian(
  data,
  germline_db = NA,
  novel = NA,
  v_call = "v_call",
  seq = "sequence_alignment",
  find_unmutated = TRUE,
  priors = c(0.6, 0.4, 0.4, 0.35, 0.25, 0.25, 0.25, 0.25)
)
```

#### **Arguments**

data a data. frame containing V allele calls from a single subject. If find\_unmutated

is TRUE, then the sample IMGT-gapped V(D)J sequence should be provided in

column sequence\_alignment

germline\_db named vector of sequences containing the germline sequences named in allele\_calls.

Only required if find\_unmutated is TRUE.

novel an optional data.frame of the type novel returned by findNovelAlleles con-

taining germline sequences that will be utilized if find\_unmutated is TRUE. See

Details.

v\_call column in data with V allele calls. Default is "v\_call".

seq name of the column in data with the aligned, IMGT-numbered, V(D)J nu-

cleotide sequence. Default is "sequence\_alignment".

find\_unmutated if TRUE, use germline\_db to find which samples are unmutated. Not needed if

allele\_calls only represent unmutated samples.

priors a numeric vector of priors for the multinomial distribution. The priors vector

must be nine values that defined the priors for the heterozygous (two allele), trizygous (three allele), and quadrozygous (four allele) distributions. The first two values of priors define the prior for the heterozygous case, the next three values are for the trizygous case, and the final four values are for the quadrozygous case. Each set of priors should sum to one. Note, each distribution prior is actually defined internally by set of four numbers, with the unspecified final values assigned to 0; e.g., the heterozygous case is c(priors[1], priors[2], 0, 0). The prior for the homozygous distribution is fixed at c(1, 0, 0, 0).

#### **Details**

Allele calls representing cases where multiple alleles have been assigned to a single sample sequence are rare among unmutated sequences but may result if nucleotides for certain positions are not available. Calls containing multiple alleles are treated as belonging to all groups. If novel is provided, all sequences that are assigned to the same starting allele as any novel germline allele will have the novel germline allele appended to their assignent prior to searching for unmutated sequences.

#### Value

A data.frame of alleles denoting the genotype of the subject with the log10 of the likelihood of each model and the log10 of the Bayes factor. The output contains the following columns:

- gene: The gene name without allele.
- alleles: Comma separated list of alleles for the given gene.
- counts: Comma separated list of observed sequences for each corresponding allele in the alleles list.
- total: The total count of observed sequences for the given gene.
- note: Any comments on the inferrence.
- kh: log10 likelihood that the gene is homozygous.
- kd: log10 likelihood that the gene is heterozygous.
- kt: log10 likelihood that the gene is trizygous
- kq: log10 likelihood that the gene is quadrozygous.
- k\_diff: log10 ratio of the highest to second-highest zygosity likelihoods.

# Note

This method works best with data derived from blood, where a large portion of sequences are expected to be unmutated. Ideally, there should be hundreds of allele calls per gene in the input.

insertPolymorphisms 19

### References

1. Laserson U and Vigneault F, et al. High-resolution antibody dynamics of vaccine-induced immune responses. PNAS. 2014 111(13):4928-33.

#### See Also

plotGenotype for a colorful visualization and genotypeFasta to convert the genotype to nucleotide sequences. See inferGenotype to infer a subject-specific genotype using a frequency method

### **Examples**

insert Polymorphisms

Insert polymorphisms into a nucleotide sequence

### Description

insertPolymorphisms replaces nucleotides in the desired locations of a provided sequence.

## Usage

```
insertPolymorphisms(sequence, positions, nucleotides)
```

# **Arguments**

sequence starting nucletide sequence.

positions numeric vector of positions which to be changed.

nucleotides character vector of nucletides to which to change the positions.

#### Value

A sequence with the desired nucleotides in the provided locations.

# **Examples**

```
insertPolymorphisms("HUGGED", c(1, 6, 2), c("T", "R", "I"))
```

20 plotGenotype

|      | C 4   |     |
|------|-------|-----|
| pror | Genot | ype |

Show a colorful representation of a genotype

# Description

plotGenotype plots a genotype table.

# Usage

```
plotGenotype(
  genotype,
  facet_by = NULL,
  gene_sort = c("name", "position"),
  text_size = 12,
  silent = FALSE,
  ...
)
```

# Arguments

| genotype  | data.frame of alleles denoting a genotype, as returned by inferGenotype.   |
|-----------|--|
| facet_by  | column name in genotype to facet the plot by. if NULL, then do not facet the plot. $ \\$   |
| gene_sort | string defining the method to use when sorting alleles. if "name" then sort in lexicographic order. If "position" then sort by position in the locus, as determined by the final two numbers in the gene name. |
| text_size | point size of the plotted text.  |
| silent    | if TRUE do not draw the plot and just return the ggplot object; if FALSE draw the plot.  |
|           | additional arguments to pass to ggplot2::theme.  |

### Value

A ggplot object defining the plot.

# See Also

in fer Genotype

# **Examples**

```
# Plot genotype
plotGenotype(SampleGenotype)

# Facet by subject
genotype_a <- genotype_b <- SampleGenotype</pre>
```

plotNovel 21

```
genotype_a$SUBJECT <- "A"
genotype_b$SUBJECT <- "B"
geno_sub <- rbind(genotype_a, genotype_b)
plotGenotype(geno_sub, facet_by="SUBJECT", gene_sort="pos")</pre>
```

plotNovel

Visualize evidence of novel V alleles

# Description

plotNovel is be used to visualize the evidence of any novel V alleles found using findNovelAlleles. It can also be used to visualize the results for alleles that did

# Usage

```
plotNovel(
   data,
   novel_row,
   v_call = "v_call",
   j_call = "j_call",
   seq = "sequence_alignment",
   junction = "junction",
   junction_length = "junction_length",
   pos_range_max = NULL,
   ncol = 1,
   multiplot = TRUE
)
```

# **Arguments**

| data            | data.frame containing repertoire data. See findNovelAlleles for details.   |
|-----------------|--|
| novel_row       | single row from a data frame as output by findNovelAlleles that contains a polymorphism-containing germline allele.      |
| v_call          | name of the column in data with V allele calls. Default is v_call.   |
| j_call          | name of the column in data with J allele calls. Default is j_call.   |
| seq             | name of the column in data with the aligned, IMGT-numbered, $V(D)J$ nucleotide sequence. Default is sequence_alignment.  |
| junction        | Junction region nucleotide sequence, which includes the CDR3 and the two flanking conserved codons. Default is junction. |
| junction_length | 1  |
|                 | $number\ of\ junction\ nucleotides\ in\ the\ junction\ sequence.\ Default\ is\ \verb"junction_length".$                  |
| pos_range_max   | Name of the column in data with the ending positions of the V alignment in the germline (usually v_germline_end).        |
| ncol            | number of columns to use when laying out the plots.  |
| multiplot       | whether to return one single plot (TRUE) or a list with the three individual plots (FALSE).                              |

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#### **Details**

The first panel in the plot shows, for all sequences which align to a particular germline allele, the mutation frequency at each postion along the aligned sequence as a function of the sequence-wide mutation count. Each line is a position. Positions that contain polymorphisms (rather than somatic hypermutations) will exhibit a high apparent mutation frequency for a range of sequence-wide mutation counts. The positions are color coded as follows:

- red: the position(s) pass(ess) the novel allele test
- yellow: the position(s) pass(ess) the y-intercept test but not other tests
- blue: the position(s) didn't pass the y-intercept test and was(were) not further considered

The second panel shows the nucleotide usage at each of the polymorphic positions as a function of sequence-wide mutation count. If no polymorphisms were identified, the panel will show the mutation count.

To avoid cases where a clonal expansion might lead to a false positive, TIgGER examines the combinations of J gene and junction length among sequences which perfectly match the proposed germline allele. Clonally related sequences usually share the same V gene, J gene and junction length. Requiring the novel allele to be found in different combinations of J gene and junction lengths is a proxy for requiring it to be found in different clonal lineages.

### **Examples**

readIgFasta

Read immunoglobulin sequences

### **Description**

readIgFasta reads a fasta-formatted file of immunoglobulin (Ig) sequences and returns a named vector of those sequences.

# Usage

```
readIgFasta(fasta_file, strip_down_name = TRUE, force_caps = TRUE)
```

#### **Arguments**

```
fasta_file fasta-formatted file of immunoglobuling sequences.

strip_down_name

if TRUE, will extract only the allele name from the strings fasta file's sequence names.

force_caps if TRUE, will force nucleotides to uppercase.
```

reassignAlleles 23

# Value

Named vector of strings respresenting Ig alleles.

#### See Also

writeFasta to do the inverse.

# **Examples**

```
## Not run:
# germlines <- readIgFasta("ighv.fasta")
## End(Not run)</pre>
```

reassignAlleles

Correct allele calls based on a personalized genotype

# **Description**

reassignAlleles uses a subject-specific genotype to correct correct preliminary allele assignments of a set of sequences derived from a single subject.

# Usage

```
reassignAlleles(
  data,
  genotype_db,
  v_call = "v_call",
  seq = "sequence_alignment",
  method = "hamming",
  path = NA,
  keep_gene = c("gene", "family", "repertoire")
)
```

# **Arguments**

| data        | data.frame containing V allele calls from a single subject and the sample IMGT-gapped V(D)J sequences under seq.                       |
|-------------|--|
| genotype_db | vector of named nucleotide germline sequences matching the calls detailed in allele_calls and personalized to the subject              |
| v_call      | name of the column in data with $V$ allele calls. Default is $v\_call$ .   |
| seq         | name of the column in data with the aligned, IMGT-numbered, $V(D)J$ nucleotide sequence. Default is SEQUENCE_IMGT                      |
| method      | method to use when realigning sequences to the genotype_db sequences. Currently, only "hamming" (for Hamming distance) is implemented. |

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path directory containing the tool used in the realignment method, if needed. Ham-

ming distance does not require a path to a tool.

keep\_gene string indicating if the gene ("gene"), family ("family") or complete repertoire

("repertoire") assignments should be performed. Use of "gene" increases speed by minimizing required number of alignments, as gene level assignments

will be maintained when possible.

#### **Details**

In order to save time, initial gene assignments are preserved and the allele calls are chosen from among those provided in genotype\_db, based on a simple alignment to the sample sequence.

#### Value

A modifed input data.frame containing the best allele call from among the sequences listed in genotype\_db in the v\_call\_genotyped column.

## **Examples**

```
# Extract the database sequences that correspond to the genotype
genotype_db <- genotypeFasta(SampleGenotype, SampleGermlineIGHV, novel=SampleNovel)</pre>
```

SampleDb

Example human immune repertoire data

#### **Description**

A data.frame of example V(D)J immunoglobulin sequences derived from a single individual (PGP1), sequenced on the Roche 454 platform, and assigned by IMGT/HighV-QUEST to IGHV1 family alleles.

#### **Format**

A data. frame where rows correspond to unique V(D)J sequences and columns include:

- "SEQUENCE\_IMGT": IMGT-gapped V(D)J nucleotide sequence.
- "V\_CALL": IMGT/HighV-QUEST V segment allele calls.
- "D\_CALL": IMGT/HighV-QUEST D segment allele calls.
- "J\_CALL": IMGT/HighV-QUEST J segment allele calls.
- "JUNCTION\_LENGTH": Junction region length.

SampleGenotype 25

### References

Gadala-Maria, et al. (2015) Automated analysis of high-throughput B cell sequencing data reveals a high frequency of novel immunoglobulin V gene segment alleles. PNAS. 112(8):E862-70.

#### See Also

See AIRRDb for an AIRR formatted version of SampleDb.

SampleGenotype

Example genotype inferrence results

### **Description**

A data.frame of genotype inference results from inferGenotype after novel allele detection via findNovelAlleles. Source data was a collection of V(D)J immunoglobulin sequences derived from a single individual (PGP1), sequenced on the Roche 454 platform, and assigned by IMGT/HighV-QUEST to IGHV1 family alleles.

#### **Format**

A data. frame where rows correspond to genes carried by an individual and columns lists the alleles of those genes and their counts.

#### References

Gadala-Maria, et al. (2015) Automated analysis of high-throughput B cell sequencing data reveals a high frequency of novel immunoglobulin V gene segment alleles. PNAS. 112(8):E862-70.

## See Also

See inferGenotype for detailed column descriptions.

SampleGermlineIGHV

Example Human IGHV germlines

# **Description**

A character vector of all 344 human IGHV germline gene segment alleles in IMGT/GENE-DB release 2014-08-4.

#### **Format**

Values correspond to IMGT-gaped nuceltoide sequences (with nucleotides capitalized and gaps represented by ".") while names correspond to stripped-down IMGT allele names (e.g. "IGHV1-18\*01").

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### References

1. Xochelli, et al. (2014) Immunoglobulin heavy variable (IGHV) genes and alleles: new entities, new names and implications for research and prognostication in chronic lymphocytic leukaemia. Immunogenetics. 67(1):61-6.

SampleNovel

Example novel allele detection results

# **Description**

A data. frame of novel allele detection results from findNovelAlleles. Source data was a collection of V(D)J immunoglobulin sequences derived from a single individual (PGP1), sequenced on the Roche 454 platform, and assigned by IMGT/HighV-QUEST to IGHV1 family alleles.

#### **Format**

A data.frame where rows correspond to alleles checked for polymorphisms and columns give results as well as paramaters used to run the test.

#### References

Gadala-Maria, et al. (2015) Automated analysis of high-throughput B cell sequencing data reveals a high frequency of novel immunoglobulin V gene segment alleles. PNAS. 112(8):E862-70.

# See Also

See findNovelAlleles for detailed column descriptions.

selectNovel

Select rows containing novel alleles

### **Description**

selectNovel takes the result from findNovelAlleles and selects only the rows containing unique, novel alleles.

#### Usage

```
selectNovel(novel, keep_alleles = FALSE)
```

#### **Arguments**

novel data. frame of the type returned by findNovelAlleles.

keep\_alleles logical indicating if different alleles leading to the same novel sequence should

be kept. See Details.

sortAlleles 27

#### **Details**

If, for instance, subject has in his genome IGHV1-2\*02 and a novel allele equally close to IGHV1-2\*02 and IGHV1-2\*05, the novel allele may be detected by analyzing sequences that best align to either of these alleles. If keep\_alleles is TRUE, both polymorphic allele calls will be retained. In the case that multiple mutation ranges are checked for the same allele, only one mutation range will be kept in the output.

#### Value

A data. frame containing only unique, novel alleles (if any) that were in the input.

#### **Examples**

```
novel <- selectNovel(SampleNovel)</pre>
```

sortAlleles

Sort allele names

## **Description**

sortAlleles returns a sorted vector of strings respresenting Ig allele names. Names are first sorted by gene family, then by gene, then by allele. Duplicated genes have their alleles are sorted as if they were part of their non-duplicated counterparts (e.g. IGHV1-69D\*01 comes after IGHV1-69\*01 but before IGHV1-69\*02), and non-localized genes (e.g. IGHV1-NL1\*01) come last within their gene family.

# Usage

```
sortAlleles(allele_calls, method = c("name", "position"))
```

# Arguments

allele\_calls vector o

vector of strings respresenting Ig allele names.

method

string defining the method to use when sorting alleles. If "name" then sort in lexicographic order. If "position" then sort by position in the locus, as deter-

mined by the final two numbers in the gene name.

#### Value

A sorted vector of strings respresenting Ig allele names.

#### See Also

Like sortAlleles, updateAlleleNames can help format a list of allele names.

28 subsampleDb

### **Examples**

subsampleDb

Subsample repertoire

### **Description**

subsampleDb will sample the same number of sequences for each gene, family or allele (specified with mode) in data. Samples or subjects can be subsampled indepently by setting group.

### Usage

```
subsampleDb(
  data,
  gene = "v_call",
  mode = c("gene", "allele", "family"),
  min_n = 1,
  max_n = NULL,
  group = NULL
)
```

# **Arguments**

data data. frame containing repertoire data.

gene name of the column in data with allele calls. Default is v\_call.

mode one of c("gene", "family", "allele") defining the degree of specificity re-

garding allele calls when subsetting sequences. Determines how data will be split into subsets from which the same number of sequences will be subsampled.

See also group.

min\_n minimum number of observations to sample from each groupe. A group with

less observations than the minimum is excluded.

max\_n maximum number of observations to sample for all mode groups. If NULL, it will

be set automatically to the size of the smallest group. If max\_n is larger than the available number of sequences for any mode group, if will be automatically adjusted and the efective max\_n used will be the size of the smallest mode group.

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group

columns containing additional grouping variables, e.g. sample\_id. These groups will be subsampled independently. If max\_n is NULL, a max\_n will be automatically set for each group.

#### **Details**

data will be split into gene, allele or family subsets (mode) from which the same number of sequences will be subsampled. If mode=gene, for each gene in the field gene from data, a maximum of max\_n sequences will be subsampled. Input sequences that have multiple gene calls (ties), can be subsampled from any of their calls, but these duplicated samplings will be removed, and the final subsampled data will contain unique rows.

#### Value

Subsampled version of the input data.

#### See Also

selectNovel

# **Examples**

subsampleDb(AIRRDb)

tigger tigger

# **Description**

Here we provide a **Tool** for **I**mmuno**g**lobulin **G**enotype **E**lucidation via **R**ep-Seq (TIgGER). TIg-GER inferrs the set of Ig alleles carried by an individual (including any novel alleles) and then uses this set of alleles to correct the initial assignments given to sample sequences by existing tools.

# **Details**

Immunoglobulin repertoire sequencing (AIRR-Seq, Rep-Seq) data is currently the subject of much study. A key step in analyzing these data involves assigning the closest known V(D)J germline alleles to the (often somatically mutated) sample sequences using a tool such as IMGT/HighV-QUEST. However, if the sample utilizes alleles not in the germline database used for alignment, this step will fail. Additionally, this alignment has an associated error rate of ~5 mutations. The purpose of TIgGER is to address these issues.

30 updateAlleleNames

## Allele detection and genotyping

- findNovelAlleles: Detect novel alleles.
- plotNovel: Plot evidence of novel alleles.
- inferGenotype: Infer an Ig genotype using a frequency approach.
- inferGenotypeBayesian: Infer an Ig genotype using a Bayesian approach.
- plotGenotype: A colorful genotype visualization.
- genotypeFasta: Convert a genotype to sequences.
- reassignAlleles: Correct allele calls.
- generateEvidence: Generate evidence for the genotype and allele detection inferrence.

# **Mutation handling**

- getMutatedPositions: Find mutation locations.
- getMutCount: Find distance from germline.
- findUnmutatedCalls: Subset unmutated sequences.
- getPopularMutationCount: Find most common sequence's mutation count.
- insertPolymorphisms: Insert SNPs into a sequence.

# Input, output and formatting

- readIgFasta: Read a fasta file of Ig sequences.
- updateAlleleNames: Correct outdated allele names.
- sortAlleles: Sort allele names intelligently.
- cleanSeqs: Standardize sequence format.

#### References

Gadala-Maria, et al. (2015) Automated analysis of high-throughput B cell sequencing data reveals a high frequency of novel immunoglobulin V gene segment alleles. PNAS. 112(8):E862-70.

updateAlleleNames

Update IGHV allele names

### Description

updateAlleleNames takes a set of IGHV allele calls and replaces any outdated names (e.g. IGHV1-f) with the new IMGT names.

### Usage

updateAlleleNames(allele\_calls)

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## **Arguments**

allele\_calls vector of strings respresenting IGHV allele names.

#### Value

Vector of strings respresenting updated IGHV allele names.

#### Note

IGMT has removed IGHV2-5\*10 and IGHV2-5\*07 as it has determined they are actually alleles 02 and 04, respectively. The updated allele names are based on IMGT release 2014-08-4.

#### References

1. Xochelli et al. (2014) Immunoglobulin heavy variable (IGHV) genes and alleles: new entities, new names and implications for research and prognostication in chronic lymphocytic leukaemia. Immunogenetics. 67(1):61-6

### See Also

Like updateAlleleNames, sortAlleles can help format a list of allele names.

### **Examples**

```
# Create a vector that uses old gene/allele names.
alleles <- c("IGHV1-c*01", "IGHV1-f*02", "IGHV2-5*07")
# Update the alleles to the new names
updateAlleleNames(alleles)</pre>
```

writeFasta

Write to a fasta file

# **Description**

writeFasta writes a named vector of sequences to a file in fasta format.

### Usage

```
writeFasta(named_sequences, file, width = 60, append = FALSE)
```

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# **Arguments**

named\_sequences

vector of named string representing sequences

file the name of the output file.

width the number of characters to be printed per line. if not between 1 and 255, width

with be infinite.

append logical indicating if the output should be appended to file instead of over-

writing it

### Value

A named vector of strings respresenting Ig alleles.

#### See Also

readIgFasta to do the inverse.

# **Examples**

```
## Not run:
# writeFasta(germlines, "ighv.fasta")
## End(Not run)
```

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