

Package ‘tigger’

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Title R Tools for Inferring New IGHV Alleles from Rep-Seq Data

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Description The 'tigger' package infers the V genotype of an individual from immunoglobulin (Ig) repertoire-sequencing (Rep-Seq) data. This includes detection of any novel alleles. This information is then used to correct existing V allele calls from among the sample sequences.

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LazyData true

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cleanSeqs	<i>Clean up nucleotide sequences</i>
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Description

cleanSeqs capitalizes nucleotides, replaces "." with "-", and then replaces all characters besides ACGT- with "N".

Usage

```
cleanSeqs(seqs)
```

Arguments

seqs a vector of nucleotide sequences

Value

A vector of nucleotide sequences

See Also

[sortAlleles](#) and [updateAlleleNames](#) can help format a list of allele names.

Examples

```
# Create messy nucleotide sequences
seqs = c("AGAT.taa-GAG..ATA",
         "GATACAGTXXXXXAGNNPPACA")
# Clean them up
cleanSeqs(seqs)
```

findNovelAlleles	<i>Find novel alleles from repertoire sequencing data</i>
------------------	---

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(clip_db, germline_db, germline_min = 200, nproc = 4,
  min_seqs = 50, auto_mutrange = TRUE, mut_range = 1:10,
  pos_range = 1:312, y_intercept = 1/8, alpha = 0.05, j_max = 0.15,
  min_frac = 0.75)
```

Arguments

<code>clip_db</code>	a <code>data.frame</code> in Change-O format. See details.
<code>germline_db</code>	a vector of named nucleotide germline sequences matching the V calls in <code>clip_db</code>
<code>germline_min</code>	the minimum number of sequences that must have a particular germline allele call for the allele to be analyzed
<code>nproc</code>	the number of processors to use
<code>min_seqs</code>	the minimum number of total sequences (within the desired mutational range and nucleotide range) required for the samples to be considered
<code>auto_mutrange</code>	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
<code>mut_range</code>	the range of mutations that sampled may carry and be considered by the algorithm
<code>pos_range</code>	the range of IMGT-numbered positions that should be considered by the algorithm
<code>y_intercept</code>	the y-intercept above which positions should be considered potentially polymorphic
<code>alpha</code>	the alpha cutoff to be used when constructing the confidence interval for the y-intercept
<code>j_max</code>	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
<code>min_frac</code>	the minimum fraction of sequences that must have usable nucleotides in a given position for that position to be considered

Details

A `data.frame` in Change-O format contains the following columns:

- "SEQUENCE_IMGT" containing the IMGT-gapped nucleotide sequence
- "V_CALL" containing the IMGT/V-QUEST V allele call(s)
- "J_CALL" containing the IMGT/V-QUEST J allele call(s)
- "JUNCTION_LENGTH" containing the junction length

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 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.

See Also

[plotTigger](#) to visualize the data supporting any novel alleles hypothesized to be present in the data and [inferGenotype](#) to determine if the novel alleles are frequent enough to be included in the subject's genotype

Examples

```
# Load example data and germlines
data(sample_db)
data(germline_ighv)

# Find novel alleles and return relevant data
novel_df = findNovelAlleles(sample_db, germline_ighv)
```

findUnmutatedCalls *Determine which calls represent an unmutated allele*

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	a vector of strings representing Ig allele calls, where multiple calls are separated by a comma
sample_seqs	V(D)J-rearranged sample sequences matching the order of the given allele_calls
germline_db	a vector of named nucleotide germline sequences

Value

A vector of strings containing the members of allele_calls that represent unmutated sequences

Examples

```
# Load data
data(germline_ighv)
data(sample_db)

# Find which of the sample alleles are unmutated
findUnmutatedCalls(sample_db$V_CALL, sample_db$SEQUENCE_IMGT, germline_ighv)
```

genotypeFasta	<i>Return the nucleotide sequences of a genotype</i>
---------------	--

Description

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

Usage

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

Arguments

genotype	a table of alleles denoting a genotype, as returned by inferGenotype
germline_db	a vector of named nucleotide germline sequences matching the alleles detailed in genotype
novel_df	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](#)

Examples

```
# Load example data
data(germline_ighv)
data(sample_db)

# Infer and view a genotype from the sample
novel_df = findNovelAlleles(sample_db, germline_ighv)
geno = inferGenotype(sample_db, find_unmutated = TRUE,
                    germline_db = germline_ighv, novel_df = novel_df)
print(geno)

# Find the sequences that correspond to the genotype
genotype_seqs = genotypeFasta(geno, germline_ighv, novel_df)
```

germline_ighv	<i>Human IGHV germlines</i>
---------------	-----------------------------

Description

A character vector of all 344 human IGHV germline gene segment alleles in IMGT Gene-db release 201408-4.

Format

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

References

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	<i>Find the location of mutations in a sequence</i>
---------------------	---

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)
```

Arguments

samples	a vector of strings representing aligned sequences
germlines	a vector of strings representing aligned sequences to which samples will be compared. If only one string is submitted, it will be used for all samples.
ignored_regex	a 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)
```

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	a vector of IMGT-gapped sample V sequences
allele_calls	a vector of strings representing Ig allele calls for the sequences in samples, where multiple calls are separated by a comma
germline_db	a 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

```
# Load germline database
data(germline_ighv)

# Use createGermlines to insert a mutation into a germline sequence
#sample_seqs = c(germline_ighv[2],
#                createGermlines(germline_ighv[1], 103, "G"),
#                createGermlines(germline_ighv[1], 107, "C"))

# Pretend that one sample sequence has received an ambiguous allele call
#sample_alleles = c(paste(names(germline_ighv[1:2]), collapse=","),
#                  names(germline_ighv[2]),
#                  names(germline_ighv[1]))

# Compare each sequence to its assigned germline(s) to determine the distance
#getMutCount(sample_seqs, sample_alleles, germline_ighv)
```

getPopularMutationCount

Find Frequent Sequences' Mutation Counts

Description

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

Usage

```
getPopularMutationCount(sample_db, germline_db, gene_min = 0.001,
  seq_min = 50, seq_p_of_max = 1/8, full_return = FALSE)
```

Arguments

sample_db	A Change-O db data frame. See findNovelAlleles for a list of required columns.
germline_db	A named list of IMGT-gapped germline sequences.
gene_min	The portion of all unique sequences a gene must constitute to avoid exclusion.
seq_min	The number of copies of the V that must be present for to avoid exclusion.
seq_p_of_max	For each gene, fraction of the most common V sequence's count that a sequence must meet to avoid exclusion.
full_return	If true, will return all sample_db 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

```
data(sample_db, germline_ighv)
getPopularMutationCount(sample_db, germline_ighv)
```

inferGenotype

Infer a subject-specific genotype

Description

inferGenotype infers an subject's genotype 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(clip_db, fraction_to_explain = 7/8, gene_cutoff = 0.001,
              find_unmutated = TRUE, germline_db = NA, novel_df = NA)
```

Arguments

<code>clip_db</code>	a <code>data.frame</code> containing V allele calls from a single subject under "V_CALL". If <code>find_unmutated</code> is TRUE, then the sample IMGT-gapped V(D)J sequence should be provided in a column "SEQUENCE_IMGT"
<code>fraction_to_explain</code>	the portion of each gene that must be explained by the alleles that will be included in the genotype
<code>gene_cutoff</code>	either a number of sequences or a fraction of the length of <code>allele_calls</code> denoting the minimum number of times a gene must be observed in <code>allele_calls</code> to be included in the genotype
<code>find_unmutated</code>	if TRUE, use <code>germline_db</code> to find which samples are unmutated. Not needed if <code>allele_calls</code> only represent unmutated samples.
<code>germline_db</code>	named vector of sequences containing the germline sequences named in <code>allele_calls</code> . Only required if <code>find_unmutated</code> is TRUE.
<code>novel_df</code>	an optional <code>data.frame</code> of the type <code>novel</code> returned by findNovelAlleles containing germline sequences that will be utilized if <code>find_unmutated</code> is TRUE. See details.

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 until one of those groups is included in the genotype.

Value

A table of alleles denoting the genotype of the subject

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.

Examples

```
# Load example data; we'll pretend allele calls are unmutated
data(sample_db)

# Infer the IGHV genotype using all provided sequences
inferGenotype(sample_db, find_unmutated = FALSE)

# Infer the IGHV genotype using only unmutated sequences
data(germline_ighv)
inferGenotype(sample_db, find_unmutated = TRUE, germline_db = germline_ighv)

# Infer the IGHV genotype, using only unmutated sequences,
# including sequences that match novel alleles (recommended)
```

```
novel_df = findNovelAlleles(sample_db, germline_ighv)
inferGenotype(sample_db, find_unmutated = TRUE, germline_db = germline_ighv,
              novel_df = novel_df)
```

`insertPolymorphisms` *Insert polymorphisms into a nucleotide sequence*

Description

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

Usage

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

Arguments

<code>sequence</code>	the starting nucleotide sequence
<code>positions</code>	a vector of positions which to be changed
<code>nucleotides</code>	a vector of nucleotides to which to change the positions

Value

a sequence with the desired nucleotides in provided locations

Examples

```
insertPolymorphisms("hugged", c(1,6,2), c("t","r","i"))
```

`plotTigger` *Visualize evidence of novel V alleles*

Description

`plotTigger` is be used to visualize the evidence of any novel V alleles found using [findNovelAlleles](#).

Usage

```
plotTigger(clip_db, novel_df_row, ncol = 1)
```

Arguments

<code>clip_db</code>	a <code>data.frame</code> in Change-O format. See findNovelAlleles for details.
<code>novel_df_row</code>	a single row from a data frame as output by findNovelAlleles that contains a polymorphism-containing germline allele
<code>ncol</code>	number of columns to use when laying out the plots

Examples

```
## Not run:
# Load example data and germlines
data(sample_db)
data(germline_ighv)

# Find novel alleles and return relevant data
novel_df = findNovelAlleles(sample_db, germline_ighv)
# Plot the evidence for the first (and only) novel allele in the example data
novel = selectNovel(novel_df)
pdf(paste(gsub("\\*", "+", novel$POLYMORPHISM_CALL), ".pdf", sep=""), 5, 15)
plotTigger(sample_db, novel[1,])
dev.off()

## End(Not run)
```

readGermlineDb	<i>Read a germline database</i>
----------------	---------------------------------

Description

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

Usage

```
readGermlineDb(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

Value

a named vector of strings representing Ig alleles

reassignAlleles	<i>Correct allele calls based on a personalized genotype</i>
-----------------	--

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(clip_db, genotype_db)
```

Arguments

`clip_db` a `data.frame` containing V allele calls from a single subject under "V_CALL" and the sample IMGT-gapped V(D)J sequences under "SEQUENCE_IMGT"

`genotype_db` a vector of named nucleotide germline sequences matching the calls detailed in `allele_calls` and personalized to the subject

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 single-column `data.frame` corresponding to `clip_db` and containing the best allele call from among the sequences listed in `genotype_db`

Examples

```
# Load example data
data(germline_ighv)
data(sample_db)

# Infer genotype from the sample
novel_df = findNovelAlleles(sample_db, germline_ighv)
geno = inferGenotype(sample_db, find_unmutated = TRUE,
                    germline_db = germline_ighv, novel_df = novel_df)

# Find the sequences that correspond to the genotype
genotype_seqs = genotypeFasta(geno, germline_ighv, novel_df)

# Use the personalized genotype to determine corrected allele assignments
V_CALL_GENOTYPED = reassignAlleles(sample_db, genotype_seqs)
sample_db = bind_cols(sample_db, V_CALL_GENOTYPED)
```

sample_db

Example human Rep-Seq data

Description

Example VDJ-rearranged immunoglobulin Rep-Seq sequences derived from a single individual (PGP1), sequenced on the Roche 454 platform, and thought by IMGT/V-QUEST to utilize IGHV1 family alleles.

Format

A `data.frame` where rows correspond to unique VDJ sequences and columns include:

- IMGT-gapped nucleotide sequence ("SEQUENCE_IMGT")
- IMGT/V-QUEST allele calls ("V_CALL", "D_CALL", and "J_CALL")
- Junction length ("JUNCTION_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.

selectNovel	<i>Select rows containing novel alleles</i>
-------------	---

Description

selectNovel takes the result from [findNovelAlleles](#) and selects only the rows containing unique, novel alleles.

Usage

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

Arguments

novel_df A data.frame of the type returned by [findNovelAlleles](#)

keep_alleles A logical indicating if different alleles leading to the same novel sequence should be kept. See details.

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_df = findNovelAlleles(sample_db, germline_ighv)
novel = selectNovel(novel_df)
```

sortAlleles	<i>Sort allele names</i>
-------------	--------------------------

Description

sortAlleles returns a sorted vector of strings representing Ig allele names. Names are first sorted by gene family, then by gene, then by allele. Duplicated genes have their alleles 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)
```

Arguments

allele_calls a vector of strings representing Ig allele names

Value

A sorted vector of strings representing Ig allele names

See Also

Like sortAlleles, [updateAlleleNames](#) can help format a list of allele names.

Examples

```
# Create a list of allele names
alleles = c("IGHV1-69D*01", "IGHV1-69*01", "IGHV1-2*01", "IGHV1-69-2*01",
"IGHV2-5*01", "IGHV1-NL1*01", "IGHV1-2*01", "IGHV1-2*05", "IGHV1-2",
"IGHV1-2*02", "IGHV1-69*02")

# Sort the alleles
sortAlleles(alleles)
```

tigger	<i>tigger</i>
--------	---------------

Description

Here we provide a **T**ool for **I**mmunoglobulin **G**enotype **E**lucidation via **R**ep-Seq (TigGER). TigGER infers 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 (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 percent, notably among sequences carrying a large number of somatic mutations. The purpose of TIGGER is to address these issues.

Core tigger functions

- `findNovelAlleles`: Detect novel alleles
- `plotTigger`: Plot evidence of novel alleles
- `inferGenotype`: Infer an Ig genotype
- `genotypeFasta`: Convert a genotype to sequences
- `reassignAlleles`: Correct allele calls

Mutation-related functions

- `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 and formatting

- `readGermlineDb`: Read a fasta file
- `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	<i>Update IGHV allele names</i>
-------------------	---------------------------------

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)
```

Arguments

allele_calls a vector of strings representing IGHV allele names

Details

The updated allele names are based on IMGT release 201408-4.

Value

vector of strings representing updated IGHV allele names

Note

IMGT has removed IGHV2-5*10 and IGHV2-5*07 as it has determined they are actually alleles *02 and *04, respectively.

References

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)
```


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