# Package 'VERSO'

May 30, 2024

Version 1.14.0

Date 2024-03-21

Title Viral Evolution ReconStructiOn (VERSO)

**Depends** R (>= 4.1.0)

Imports utils, data.tree, ape, parallel, Rfast, stats

Suggests BiocGenerics, BiocStyle, testthat, knitr

Name VERSO: an R package for the inference of viral evolution models

Description Mutations that rapidly accumulate in viral genomes during a pandemic can be used to track the evolution of the virus and, accordingly, unravel the viral infection network. To this extent, sequencing samples of the virus can be employed to estimate models from genomic epidemiology and may serve, for instance, to estimate the proportion of undetected infected people by uncovering cryptic transmissions, as well as to predict likely trends in the number of infected, hospitalized, dead and recovered people. VERSO is an algorithmic framework that processes variants profiles from viral samples to produce phylogenetic models of viral evolution. The approach solves a Boolean Matrix Factorization problem with phylogenetic constraints, by maximizing a log-likelihood function. VERSO includes two separate and subsequent steps; in this package we provide an R implementation of VERSO STEP 1.

# **Encoding** UTF-8

License file LICENSE

URL https://github.com/BIMIB-DISCo/VERSO

#### BugReports https://github.com/BIMIB-DISCo/VERSO

biocViews BiomedicalInformatics, Sequencing, SomaticMutation

RoxygenNote 7.3.1

VignetteBuilder knitr

git\_url https://git.bioconductor.org/packages/VERSO

#### inference

git\_branch RELEASE\_3\_19

git\_last\_commit 9d387e6

git\_last\_commit\_date 2024-04-30

Repository Bioconductor 3.19

Date/Publication 2024-05-29

Author Daniele Ramazzotti [aut] (<https://orcid.org/0000-0002-6087-2666>), Fabrizio Angaroni [aut], Davide Maspero [cre, aut], Alex Graudenzi [aut], Luca De Sano [aut] (<https://orcid.org/0000-0002-9618-3774>)

Maintainer Davide Maspero <d.maspero@campus.unimib.it>

# Contents

| variants | <br>· · · · · · · · · · · · · · · · · · · | 3 |
|----------|---|---|
|          |   |   |
|          |   | 6 |

# Index

inference

Results obtained running VERSO on the provided input dataset.

# Description

Results obtained running VERSO on the provided input dataset.

#### Usage

data(inference)

#### Format

results obtained running VERSO on the provided input dataset

#### Value

results obtained running VERSO on the provided input dataset

2

variants

Mutation data obtained by variant calling from raw data of a selected set of SARS-CoV-2 samples available from NCBI BioProject PRJNA610428.

#### Description

The dataset includes variants for a selected set of 15 SARS-CoV-2 samples obtained by variant calling from raw data available from NCBI BioProject PRJNA610428.

#### Usage

data(variants)

#### Format

SARS-CoV-2 variants

# Value

SARS-CoV-2 variants

#### Source

NCBI BioProject PRJNA610428

VERSO VERSO

#### Description

Perform the inference of the maximum log-likelihood VERSO phylogenetic tree.

# Usage

```
VERSO(
  D,
  alpha = NULL,
  beta = NULL,
  initialization = NULL,
  random_tree = FALSE,
  keep_equivalent = TRUE,
  check_indistinguishable = TRUE,
  marginalize = FALSE,
  num_rs = 10,
  num_iter = 10000,
```

```
n_try_bs = 1000,
num_processes = Inf,
verbose = TRUE,
log_file = ""
```

#### Arguments

| D               | Input data for the inference reporting presence (as 1), absense (as 0) or missing information (as NA) for a set of variants.  |  |  |
|-----------------|---|--|--|
| alpha           | False positive error rate provided as a verctor; if a vector of alpha (and beta) is provided, the inference is performed for multiple values and the solution at maximum-likelihood is returned.                        |  |  |
| beta            | False negative error rate provided as a verctor; if a vector of beta (and alpha) is provided, the inference is performed for multiple values and the solution at maximum-likelihood is returned.                        |  |  |
| initialization  | Binary matrix representing a perfect philogeny tree; genotypes are rows and mutations are columns. This parameter overrides "random_tree".  |  |  |
| random_tree     | Boolean. Shall I start MCMC search from a random tree? If FALSE (default) and initialization is NULL, search is started from a TRaIT tree (BMC Bioinformatics . 2019 Apr 25;20(1):210. doi: 10.1186/s12859-019-2795-4). |  |  |
| keep_equivalent |   |  |  |
| check_indisting | Boolean. Shall I return results (B and C) at equivalent likelihood with the best returned solution?   |  |  |
|                 | Boolean. Shall I remove any indistinguishable variant from input data prior inference?  |  |  |
| marginalize     | Boolean. Shall I marginalize C when computing likelihood?   |  |  |
| num_rs          | Number of restarts during MCMC inference.   |  |  |
| num_iter        | Maximum number of MCMC steps to be performed during the inference.  |  |  |
| n_try_bs        | Number of steps without changes in likelihood of best solution after which to stop the MCMC.  |  |  |
| num_processes   | Number of processes to be used during parallel execution. To execute in single process mode, this parameter needs to be set to either 1, NA or NULL.  |  |  |
| verbose         | Boolean. Shall I print to screen information messages during the execution?   |  |  |
| log_file        | log file where to print outputs when using parallel. If parallel execution is dis-<br>abled, this parameter is ignored.   |  |  |

# Value

A list of 9 elements: B, C, phylogenetic\_tree, corrected\_genotypes, genotypes\_prevalence, genotypes\_summary, log\_likelihood and error\_rates. Here, B returns the maximum likelihood variants tree (inner nodes of the phylogenetic tree), C the attachment of patients to genotypes and phylogenetic\_tree VERSO phylogenetic tree, including both variants tree and patients attachments to variants; corrected\_genotypes is the corrected genotypes, which corrects D given VERSO phylogenetic tree, genotypes\_prevalence the number of patients and observed prevalence of each genotype

4

#### write.newick.tree

and genotypes\_summary provide a summary of association of mutations to genotypes. In equivalent\_solutions, solutions (B and C) with likelihood equivalent to the best solution are returned. Finally log\_likelihood and error\_rates return the likelihood of the inferred phylogenetic moldel and best values of alpha and beta as estimated by VERSO.

#### Examples

write.newick.tree write.newick.tree

#### Description

Write a phylogenetic tree as inferred by VERSO to a newick format file.

#### Usage

```
write.newick.tree(phylogenetic_tree, phylogeny_file = "phylogenetic_tree.new")
```

#### Arguments

phylogenetic\_tree

Inference results by VERSO.

phylogeny\_file File where to save the phylogenetic tree in newick format.

#### Value

A phylogenetic tree as inferred by VERSO in newick format.

#### Examples

# Index

inference, 2

variants,3 VERSO,3

write.newick.tree,5