Package 'STAARpipeline'

May 19, 2024

	LD_pruning	23
	ncRNA	24
	ncRNA_cond	26
	ncRNA_cond_spa	28
	Sliding_Window	30
	Sliding_Window_cond	32
	Sliding_Window_cond_spa	34
	staar2scang_nullmodel	
Index		3'

Description

The Dynamic_Window_SCANG function takes in chromosome, starting location, ending location, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype and variants in a genetic region by using SCANG-STAAR procedure. For each dynamic window, the scan statistic of SCANG-STAAR-O is the set-based p-value of an omnibus test that aggregated p-values across different types of multiple annotation-weighted variant-set tests SKAT(1,1), SKAT(1,25), Burden(1,1) and Burden(1,25) using ACAT method; the scan statistic of SCANG-STAAR-S is the set-based p-value of STAAR-S, which is an omnibus test that aggregated p-values across multiple annotation-weighted variant-set tests SKAT(1,1) and SKAT(1,25) using ACAT method; the scan statistic of SCANG-STAAR-B is the set-based p-value of STAAR-B, which is an omnibus test that aggregated p-values across multiple annotation-weighted variant-set tests Burden(1,1) and Burden(1,25) using ACAT method.

```
Dynamic_Window_SCANG(
  chr,
  start_loc,
  end_loc,
  genofile,
  obj_nullmodel,
  Lmin = 40,
  Lmax = 300,
  steplength = 10,
  rare_maf_cutoff = 0.01,
  p_filter = 1e-08,
  f = 0,
  alpha = 0.1,
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
  Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL,
  silent = FALSE
)
```

Arguments

chr chromosome.

start_loc starting location (position) of the genetic region to be analyzed using SCANG-

STAAR procedure.

end_loc ending location (position) of the genetic region to be analyzed using SCANG-

STAAR procedure.

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is the output from fit_nullmodel

function and transformed using the staar2scang_nullmodel function.

Lmin minimum number of variants in searching windows (default = 40).

Lmax maximum number of variants in searching windows (default = 300).

steplength difference of number of variants in searching windows, that is, the number of

variants in searching windows are Lmin, Lmin+steplength, Lmin+steplength,...,

Lmax (default = 10).

rare_maf_cutoff

a cutoff of maximum minor allele frequency in defining rare variants (default =

0.01).

p_filter a filtering threshold of screening method for SKAT in SCANG-STAAR. SKAT

p-values are calculated for regions whose p-value is possibly smaller than the

filtering threshold (default = 1e-8).

f an overlap fraction, which controls for the overlapping proportion of of detected

regions. For example, when f=0, the detected regions are non-overlapped with each other, and when f=1, we keep every susceptive region as detected regions

(default = 0).

alpha family-wise/genome-wide significance level (default = 0.1).

 $\label{eq:channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").}$

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in SCANG-STAAR (default = NULL).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

The function returns a list with the following members:

SCANG_O_res: A matrix that summarizes the significant region detected by SCANG-STAAR-O, including the negative log transformation of SCANG-STAAR-O p-value ("-logp"), chromosome

4 fit_nullmodel

("chr"), start position ("start_pos"), end position ("end_pos"), family-wise/genome-wide error rate (GWER) and the number of variants ("SNV num").

SCANG_0_top1: A vector of length 4 which summarizes the top 1 region detected by SCANG-STAAR-O. including the negative log transformation of SCANG-STAAR-O p-value ("-logp"), chromosome ("chr"), start position ("start_pos"), end position ("end_pos"), family-wise/genome-wide error rate (GWER) and the number of variants ("SNV_num").

SCANG_O_emthr: A vector of Monte Carlo simulation sample for generating the empirical threshold. The 1-alpha quantile of this vector is the empirical threshold.

SCANG_S_res, SCANG_S_top1, SCANG_S_emthr: Analysis results using SCANG-STAAR-S. Details see SCANG-STAAR-O.

SCANG_B_res, SCANG_B_top1, SCANG_B_emthr: Analysis results using SCANG-STAAR-B. Details see SCANG-STAAR-O.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, Z., Li, X., et al. (2019). Dynamic scan procedure for detecting rare-variant association regions in whole-genome sequencing studies. *The American Journal of Human Genetics*, 104(5), 802-814. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Liu, Y., et al. (2019). Acat: A fast and powerful p value combination method for rare-variant analysis in sequencing studies. *The American Journal of Human Genetics*, 104(3), 410-421. (pub)

fit_nullmodel

Fitting generalized linear mixed model with known relationship matrices under the null hypothesis.

Description

The fit_nullmodel function is a wrapper of the glmmkin function from the GMMAT package that fits a regression model under the null hypothesis, which provides the preliminary step for subsequent variant-set tests in whole-genome sequencing data analysis. See glmmkin for more details.

```
fit_nullmodel(
   fixed,
   data = parent.frame(),
   kins,
   use_sparse = NULL,
   use_SPA = FALSE,
   kins_cutoff = 0.022,
   id,
   random.slope = NULL,
   groups = NULL,
   family = binomial(link = "logit"),
```

fit_nullmodel 5

```
method = "REML",
method.optim = "AI",
maxiter = 500,
tol = 1e-05,
taumin = 1e-05,
taumax = 1e+05,
tauregion = 10,
verbose = FALSE,
...
)
```

Arguments

fixed an object of class formula (or one that can be coerced to that class): a symbolic

description of the fixed effects model to be fitted. For multiple phenotype analysis, formula recognized by lm, such as $cbind(y1, y2, y3) \sim x1 + x2$, can be

used in fixed as fixed effects.

data a data frame or list (or object coercible by as.data.frame to a data frame)

containing the variables in the model.

kins a known positive semi-definite relationship matrix (e.g. kinship matrix in ge-

netic association studies) or a list of known positive semi-definite relationship matrices. The rownames and colnames of these matrices must at least include all samples as specified in the id column of the data frame data. If kins is NULL, fit_nullmodel will switch to the generalized linear model with no random ef-

fects.

use_sparse a logical switch of whether the provided dense kins matrix should be trans-

formed to a sparse matrix (default = NULL).

use_SPA a logical switch determines if the null model fitting occurs in an imbalanced

case-control setting (default = FALSE).

kins_cutoff the cutoff value for clustering samples to make the output matrix sparse block-

diagonal (default = 0.022).

id a column in the data frame data, indicating the id of samples. When there are

duplicates in id, the data is assumed to be longitudinal with repeated measures.

random. slope an optional column indicating the random slope for time effect used in a mixed

effects model for longitudinal data. It must be included in the names of data. There must be duplicates in id and method.optim must be "AI" (default =

NULL).

groups an optional categorical variable indicating the groups used in a heteroscedastic

linear mixed model (allowing residual variances in different groups to be different). This variable must be included in the names of data, and family must be

"gaussian" and method.optim must be "AI" (default = NULL).

family a description of the error distribution and link function to be used in the model.

This can be a character string naming a family function, a family function or the result of a call to a family function. (See family for details of family functions).

method method of fitting the generalized linear mixed model. Either "REML" or "ML"

(default = "REML").

method.optim optimization method of fitting the generalized linear mixed model. Either "AI",

"Brent" or "Nelder-Mead" (default = "AI").

maxiter a positive integer specifying the maximum number of iterations when fitting the

generalized linear mixed model (default = 500).

tol	a positive number specifying tolerance, the difference threshold for parameter estimates below which iterations should be stopped (default = 1e-5).
taumin	the lower bound of search space for the variance component parameter τ (default = 1e-5), used when method.optim = "Brent". See Details.
taumax	the upper bound of search space for the variance component parameter τ (default = 1e5), used when method.optim = "Brent". See Details.
tauregion	the number of search intervals for the REML or ML estimate of the variance component parameter τ (default = 10), used when method.optim = "Brent". See Details.
verbose	a logical switch for printing detailed information (parameter estimates in each

verbose a logical switch i

a logical switch for printing detailed information (parameter estimates in each

iteration) for testing and debugging purpose (default = FALSE).

... additional arguments that could be passed to glm.

Value

The function returns an object of the model fit from glmmkin (obj_nullmodel), whether the samples are under imbalanced case-control design (obj_nullmodel\$use_SPA) and whether the kins matrix is sparse when fitting the null model. See glmmkin for more details.

References

Chen, H., et al. (2016). Control for population structure and relatedness for binary traits in genetic association studies via logistic mixed models. *The American Journal of Human Genetics*, 98(4), 653-666. (pub)

Chen, H., et al. (2019). Efficient variant set mixed model association tests for continuous and binary traits in large-scale whole-genome sequencing studies. *The American Journal of Human Genetics*, 104(2), 260-274. (pub)

Chen, H. (2023). GMMAT: Generalized linear Mixed Model Association Tests Version 1.4.2. (web)

genesis2staar_nullmodel

Transforming the null model object fitted using GENESIS to the null model object to be used for STAAR

Description

The genesis2staar_nullmodel function takes in the object from fitting the null model using the GENESIS package and transforms it to the object from fitting the null model to be used for STAAR procedure.

Usage

```
genesis2staar_nullmodel(obj_nullmodel_genesis, use_SPA = FALSE)
```

Arguments

use_SPA

obj_nullmodel_genesis

an object from fitting the null model, which is the output from fitNullModel function in the GENESIS package.

Tunction in the Genesis package

a logical switch determines if the null model fitting occurs in an imbalanced case-control setting (default = FALSE).

Value

An object from fitting the null model for related samples to be used for STAAR procedure, which is the output from fit_nullmodel function.

References

Gogarten, S.M., Sofer, T., Chen, H., et al. (2019). Genetic association testing using the GENESIS R/Bioconductor package. *Bioinformatics*, *35*(24), 5346-5348. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Gene_Centric_Coding

Gene-centric analysis of coding functional categories using STAAR procedure

Description

The Gene_Centric_Coding function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype (including imbalanced case-control design) and coding functional categories of a gene by using STAAR procedure. For each coding functional category, the STAAR-O p-value is a p-value from an omnibus test that aggregated SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For imbalance case-control setting, the results correspond to the STAAR-B p-value, which is a p-value from an omnibus test that aggregated Burden(1,25) and Burden(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait association p-values (e.g. MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

```
Gene_Centric_Coding(
   chr,
   gene_name,
   category = c("all_categories", "plof", "plof_ds", "missense", "disruptive_missense",
        "synonymous", "ptv", "ptv_ds", "all_categories_incl_ptv"),
   genofile,
   obj_nullmodel,
   rare_maf_cutoff = 0.01,
   rv_num_cutoff = 2,
   QC_label = "annotation/filter",
   variant_type = c("SNV", "Indel", "variant"),
   geno_missing_imputation = c("mean", "minor"),
   Annotation_dir = "annotation/info/FunctionalAnnotation",
   Annotation_name_catalog,
   Use_annotation_weights = c(TRUE, FALSE),
```

```
Annotation_name = NULL,
SPA_p_filter = TRUE,
p_filter_cutoff = 0.05,
silent = FALSE
```

Arguments

chr chromosome.

gene_name name of the gene to be analyzed using STAAR procedure.

category the coding functional category to be analyzed using STAAR procedure. Choices

include all_categories, plof, plof_ds, missense, disruptive_missense, synonymous, ptv, ptv_ds, all_categories_incl_ptv (default = all_categories).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/Functional Annotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter

logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = TRUE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

A list of data frames containing the STAAR p-values (including STAAR-O or STAAR-B in imbalanced case-control setting) corresponding to the coding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Gene_Centric_Coding_cond

Gene-centric conditional analysis of coding functional categories using STAAR procedure

Description

The Gene_Centric_Coding_cond function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between a quantitative/dichotomous phenotype and coding functional categories of a gene by using STAAR procedure. For each coding functional category, the conditional STAAR-O p-value is a p-value from an omnibus test that aggregated conditional SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with conditional p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait conditional p-values (e.g. conditional MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

```
Gene_Centric_Coding_cond(
  chr,
  gene_name,
 category = c("plof", "plof_ds", "missense", "disruptive_missense", "synonymous", "ptv",
    "ptv_ds"),
  genofile,
 obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
 method_cond = c("optimal", "naive"),
 QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
 Annotation_dir = "annotation/info/FunctionalAnnotation",
 Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL
)
```

Arguments

chr chromosome.

gene_name name of the gene to be analyzed using STAAR procedure.

category the coding functional category to be analyzed using STAAR procedure. Choices

include plof, plof_ds, missense, disruptive_missense, synonymous, ptv,

ptv_ds (default = plof).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

Value

A data frame containing the conditional STAAR p-values (including STAAR-O) corresponding to each coding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

```
Gene_Centric_Coding_cond_spa
```

Gene-centric conditional analysis of coding functional categories using STAAR procedure for imbalance case-control setting

Description

The Gene_Centric_Coding_cond_spa function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between an imbalanced case-control phenotype and coding functional categories of a gene by using STAAR procedure. For each coding functional category, the conditional STAAR-B p-value is a p-value from an omnibus test that aggregated conditional Burden(1,25) and Burden(1,1), together with conditional p-values of each test weighted by each annotation using Cauchy method.

Usage

```
Gene_Centric_Coding_cond_spa(
  chr,
 category = c("plof", "plof_ds", "missense", "disruptive_missense", "synonymous", "ptv",
    "ptv_ds"),
  genofile,
  obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  method_cond = c("optimal", "naive"),
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
  Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL,
  SPA_p_filter = FALSE,
  p_filter_cutoff = 0.05
)
```

Arguments

```
chr chromosome.

gene_name name of the gene to be analyzed using STAAR procedure.
```

category the coding functional category to be analyzed using STAAR procedure. Choices

include plof, plof_ds, missense, disruptive_missense, synonymous, ptv,

 $ptv_ds (default = plof).$

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

 ${\tt geno_missing_imputation}$

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = FALSE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

Value

a data frame containing the conditional STAAR p-values (including STAAR-B) corresponding to each coding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

Gene_Centric_Noncoding

Gene-centric analysis of noncoding functional categories using STAAR procedure

Description

The Gene_Centric_Noncoding function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype (including imbalanced case-control design) and noncoding functional categories of a gene by using STAAR procedure. For each noncoding functional category, the STAAR-O p-value is a p-value from an omnibus test that aggregated SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For imbalance case-control setting, the results correspond to the STAAR-B p-value, which is a p-value from an omnibus test that aggregated Burden(1,25) and Burden(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait association p-values (e.g. MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

```
Gene_Centric_Noncoding(
  chr,
  gene_name,
 category = c("all_categories", "downstream", "upstream", "UTR", "promoter_CAGE",
    "promoter_DHS", "enhancer_CAGE", "enhancer_DHS"),
  genofile,
 obj_nullmodel,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL,
  SPA_p_filter = TRUE,
  p_filter_cutoff = 0.05,
  silent = FALSE
```

Arguments

chr chromosome.

gene_name name of the gene to be analyzed using STAAR procedure.

category the noncoding functional category to be analyzed using STAAR procedure. Choices

include all_categories, downstream, upstream, UTR, promoter_CAGE, promoter_DHS,

enhancer_CAGE, enhancer_DHS (default = all_categories).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = TRUE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

A list of data frames containing the STAAR p-values (including STAAR-O or STAAR-B in imbalanced case-control setting) corresponding to each noncoding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Gene_Centric_Noncoding_cond

Gene-centric conditional analysis of noncoding functional categories using STAAR procedure

Description

The Gene_Centric_Noncoding_cond function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between a quantitative/dichotomous phenotype and noncoding functional categories of a gene by using STAAR procedure. For each noncoding functional category, the conditional STAAR-O p-value is a p-value from an omnibus test that aggregated conditional SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with conditional p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait conditional p-values (e.g. conditional MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

Usage

```
Gene_Centric_Noncoding_cond(
 chr,
 gene_name,
 category = c("downstream", "upstream", "UTR", "promoter_CAGE", "promoter_DHS",
    "enhancer_CAGE", "enhancer_DHS"),
  genofile,
  obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
 method_cond = c("optimal", "naive"),
 QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
 Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL
)
```

Arguments

chr chromosome.

gene_name name of the gene to be analyzed using STAAR procedure.

category the noncoding functional category to be analyzed using STAAR procedure. Choices

include downstream, upstream, UTR, promoter_CAGE, promoter_DHS, enhancer_CAGE,

enhancer_DHS (default = downstream).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

Value

A data frame containing the conditional STAAR p-values (including STAAR-O) corresponding to the noncoding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

```
Gene_Centric_Noncoding_cond_spa
```

Gene-centric conditional analysis of noncoding functional categories using STAAR procedure for imbalance case-control setting

Description

The Gene_Centric_Noncoding_cond_spa function takes in chromosome, gene name, functional category, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between an imbalanced case-control phenotype and noncoding functional categories of a gene by using STAAR procedure. For each noncoding functional category, the conditional STAAR-B p-value is a p-value from an omnibus test that aggregated conditional Burden(1,25) and Burden(1,1), together with conditional p-values of each test weighted by each annotation using Cauchy method.

Usage

```
Gene_Centric_Noncoding_cond_spa(
  chr,
  category = c("downstream", "upstream", "UTR", "promoter_CAGE", "promoter_DHS",
    "enhancer_CAGE", "enhancer_DHS"),
  genofile,
  obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  method_cond = c("optimal", "naive"),
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
  Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL,
  SPA_p_filter = FALSE,
  p_filter_cutoff = 0.05
```

Arguments

chr	chromosome.
gene_name	name of the gene to be analyzed using STAAR procedure.
category	the noncoding functional category to be analyzed using STAAR procedure. Choices include downstream, upstream, UTR, promoter_CAGE, promoter_DHS, enhancer_CAGE, enhancer_DHS (default = downstream).
genofile	an object of opened annotated GDS (aGDS) file.
obj_nullmodel	an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = FALSE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

Value

A data frame containing the conditional STAAR p-values (including STAAR-B) corresponding to the noncoding functional category of the given gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, *52*(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

Individual_Analysis 19

Individual_Analysis Individual-variant analysis using score test

Description

The Individual_Analysis function takes in chromosome, starting location, ending location, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype (including imbalanced case-control design) and each individual variant in a genetic region by using score test. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait score test p-values by leveraging the correlation structure between multiple phenotypes.

Usage

```
Individual_Analysis(
  chr,
  start_loc,
  end_loc,
  genofile,
  obj_nullmodel,
  mac\_cutoff = 20,
  subset_variants_num = 5000,
  QC_label = "annotation/filter",
  variant_type = c("variant", "SNV", "Indel"),
  geno_missing_imputation = c("mean", "minor"),
  tol = .Machine$double.eps^0.25,
  max_iter = 1000,
  SPA_p_filter = TRUE,
  p_filter_cutoff = 0.05
)
```

"Indel" (default = "variant").

Arguments

chr	chromosome.	
start_loc	starting location (position) of the genetic region for each individual variant to be analyzed using score test.	
end_loc	ending location (position) of the genetic region for each individual variant to be analyzed using score test.	
genofile	an object of opened annotated GDS (aGDS) file.	
obj_nullmodel	an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function.	
mac_cutoff	the cutoff of minimum minor allele count in defining individual variants (default = 20).	
subset_variants_num		
	the number of variants to run per subset for each time (default = 5e3).	
QC_label	channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").	
variant_type	type of variant included in the analysis. Choices include "variant", "SNV", or	

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

tol a positive number specifying tolerance, the difference threshold for parameter

estimates in saddlepoint approximation algorithm below which iterations should

be stopped (default = ".Machine\$double.eps^0.25").

max_iter a positive integer specifying the maximum number of iterations for applying the

saddlepoint approximation algorithm (default = "1000").

SPA_p_filter logical: are only the variants with a score-test-based p-value smaller than a pre-

specified threshold use the SPA method to recalculate the p-value, only used for

imbalanced case-control setting (default = TRUE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05)

Value

A data frame containing the score test p-value and the estimated effect size of the minor allele for each individual variant in the given genetic region. The first 4 columns correspond to chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT).

References

Chen, H., et al. (2016). Control for population structure and relatedness for binary traits in genetic association studies via logistic mixed models. *The American Journal of Human Genetics*, 98(4), 653-666. (pub)

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Individual_Analysis_cond

Individual-variant conditional analysis using score test

Description

The Individual_Analysis_cond function takes in the data frame of individual variants, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between a quantitative/dichotomous phenotype and each (significant) individual variant by using score test. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait conditional score test p-values by leveraging the correlation structure between multiple phenotypes.

```
Individual_Analysis_cond(
  chr,
  individual_results,
  genofile,
  obj_nullmodel,
  known_loci = NULL,
```

```
method_cond = c("optimal", "naive"),
QC_label = "annotation/filter",
variant_type = c("variant", "SNV", "Indel"),
geno_missing_imputation = c("mean", "minor"),
geno_position_ascending = TRUE
```

Arguments

chr chromosome.

individual_results

the data frame of (significant) individual variants for conditional analysis using score test. The first 4 columns should correspond to chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

 $contain\ 4\ columns\ in\ the\ following\ order:\ chromosome\ (CHR),\ position\ (POS),$

reference allele (REF), and alternative allele (ALT) (default = NULL).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "variant", "SNV", or

"Indel" (default = "variant").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default = "mean").

geno_position_ascending

logical: are the variant positions in ascending order in the GDS/aGDS file (default = TRUE).

Value

A data frame containing the conditional score test p-value and the estimated effect size of the minor allele for each (significant) individual variant in individual_results.

References

Chen, H., et al. (2016). Control for population structure and relatedness for binary traits in genetic association studies via logistic mixed models. *The American Journal of Human Genetics*, 98(4), 653-666. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

```
Individual_Analysis_cond_spa
```

Individual-variant conditional analysis using score test for imbalance case-control setting

Description

The Individual_Analysis_cond_spa function takes in chromosome, starting location, ending location, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between an imbalanced case-control phenotype and each individual variant in a genetic region by using score test.

Usage

```
Individual_Analysis_cond_spa(
   chr,
   individual_results,
   genofile,
   obj_nullmodel,
   QC_label = "annotation/filter",
   variant_type = c("variant", "SNV", "Indel"),
   geno_missing_imputation = c("mean", "minor"),
   tol = .Machine$double.eps^0.25,
   max_iter = 1000,
   SPA_p_filter = FALSE,
   p_filter_cutoff = 0.05
)
```

Arguments

chr chromosome. individual_results the data frame of (significant) individual variants for conditional analysis using score test. The first 4 columns should correspond to chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT). genofile an object of opened annotated GDS (aGDS) file. an object from fitting the null model, which is either the output from fit_nullmodel obj_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function. QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter"). type of variant included in the analysis. Choices include "variant", "SNV", or variant_type "Indel" (default = "variant"). ${\tt geno_missing_imputation}$ method of handling missing genotypes. Either "mean" or "minor" (default = "mean"). a positive number specifying tolerance, the difference threshold for parameter tol estimates in saddlepoint approximation algorithm below which iterations should be stopped (default = ".Machine\$double.eps^0.25").

LD_pruning 23

CDA to Cilibrate the interest of the control of the		a positive integer specifying the maximum number of iterations for applying the saddlepoint approximation algorithm (default = " 1000 ").
	•	logical: are only the variants with a score-test-based p-value smaller than a prespecified threshold use the SPA method to recalculate the p-value (default = FALSE).
p_filter_cutoff	_	d 1 116 d 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1

threshold for the p-value recalculation using the SPA method (default = 0.05)

Value

A data frame containing the score test p-value and the estimated effect size of the minor allele for each individual variant in the given genetic region. The first 4 columns correspond to chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT).

References

Chen, H., et al. (2016). Control for population structure and relatedness for binary traits in genetic association studies via logistic mixed models. *The American Journal of Human Genetics*, 98(4), 653-666. (pub)

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

LD_pruning

Linkage disequilibrium (LD) pruning procedure

Description

The LD_pruning function takes in chromosome, the object of opened annotated GDS file, the object from fitting the null model, and a given list of variants to perform LD pruning among these variants in sequential conditional analysis by using score test. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait sequential conditional analysis by leveraging the correlation structure between multiple phenotypes.

```
LD_pruning(
   chr,
   genofile,
   obj_nullmodel,
   variants_list,
   maf_cutoff = 0.01,
   cond_p_thresh = 1e-04,
   method_cond = c("optimal", "naive"),
   QC_label = "annotation/filter",
   variant_type = c("variant", "SNV", "Indel"),
   geno_missing_imputation = c("mean", "minor"),
   geno_position_ascending = TRUE
)
```

24 ncRNA

Arguments

chr chromosome. an object of opened annotated GDS (aGDS) file. genofile obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function. variants_list the data frame of variants to be LD-pruned in sequential conditional analysis and should contain 4 columns in the following order: chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT). maf_cutoff the cutoff of minimum minor allele frequency in defining individual variants to be LD-pruned (default = 0.01). the cutoff of maximum conditional p-value allowed for variants to be kept in the cond_p_thresh LD-pruned list of variants (default = 1e-04). method_cond a character value indicating the method for conditional analysis. optimal refers to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and taking the residuals (default = optimal). channel name of the QC label in the GDS/aGDS file (default = "annotation/filter"). QC_label variant_type type of variant included in the analysis. Choices include "variant", "SNV", or "Indel" (default = "variant"). ${\tt geno_missing_imputation}$ method of handling missing genotypes. Either "mean" or "minor" (default = "mean"). geno_position_ascending

logical:

logical: are the variant positions in ascending order in the GDS/aGDS file (default = TRUE).

Value

A data frame containing the list of LD-pruned variants in the given chromosome.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

ncRNA	Gene-centric analysis of long noncoding RNA (ncRNA) category using
	STAAR procedure

Description

The ncRNA function takes in chromosome, gene name, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype (including imbalanced case-control design) and the exonic and splicing category of an ncRNA gene by using STAAR procedure. For each ncRNA category, the STAAR-O p-value is a p-value from an omnibus test that aggregated SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1),

ncRNA 25

ACAT-V(1,25), and ACAT-V(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For imbalance case-control setting, the results correspond to the STAAR-B p-value, which is a p-value from an omnibus test that aggregated Burden(1,25) and Burden(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait association p-values (e.g. MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

Usage

```
ncRNA(
  chr,
  gene_name,
  genofile,
  obj_nullmodel,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
 Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
 Annotation_name = NULL,
  SPA_p_filter = TRUE,
 p_filter_cutoff = 0.05,
  silent = FALSE
)
```

Arguments

chr chromosome. gene_name name of the ncRNA gene to be analyzed using STAAR procedure. genofile an object of opened annotated GDS (aGDS) file. an object from fitting the null model, which is either the output from fit_nullmodel obj_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function. rare_maf_cutoff the cutoff of maximum minor allele frequency in defining rare variants (default = 0.01). rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (default = 2). channel name of the QC label in the GDS/aGDS file (default = "annotation/filter"). QC_label type of variant included in the analysis. Choices include "SNV", "Indel", or variant_type "variant" (default = "SNV"). geno_missing_imputation method of handling missing genotypes. Either "mean" or "minor" (default = "mean"). Annotation_dir channel name of the annotations in the aGDS file (default = "annotation/info/FunctionalAnnotation").

26 ncRNA_cond

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = TRUE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

A data frame containing the STAAR p-values (including STAAR-O) corresponding to the exonic and splicing category of the given ncRNA gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

ncRNA_cond Gene-centric conditional analysis of long noncoding RNA (ncRNA) category using STAAR procedure

Description

The ncRNA_cond function takes in chromosome, gene name, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between a quantitative/dichotomous phenotype and the exonic and splicing category of an ncRNA gene by using STAAR procedure. For each ncRNA category, the conditional STAAR-O p-value is a p-value from an omnibus test that aggregated conditional SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with conditional p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait conditional p-values (e.g. conditional MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

ncRNA_cond 27

Usage

```
ncRNA_cond(
  chr,
  gene_name,
  genofile,
  obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
 method_cond = c("optimal", "naive"),
 QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
 Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL
)
```

Arguments chr

gene_name name of the ncRNA gene to be analyzed using STAAR procedure.

chromosome.

an object of opened annotated GDS (aGDS) file. genofile

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function.

the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (chr), position (pos), reference allele (ref), and alternative allele (alt) (default = NULL).

rare_maf_cutoff

known_loci

the cutoff of maximum minor allele frequency in defining rare variants (default = 0.01).

the cutoff of minimum number of variants of analyzing a given variant-set (derv_num_cutoff

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

type of variant included in the analysis. Choices include "SNV", "Indel", or variant_type

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default = "mean").

Annotation_dir channel name of the annotations in the aGDS file (default = "annotation/info/FunctionalAnnotation"). 28 ncRNA_cond_spa

Value

A data frame containing the conditional STAAR p-values (including STAAR-O) corresponding to the exonic and splicing category of the given ncRNA gene.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

ncRNA_cond_spa

Gene-centric conditional analysis of long noncoding RNA (ncRNA) category using STAAR procedure for imbalance case-control setting

Description

The ncRNA_cond_spa function takes in chromosome, gene name, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between an imbalanced case-control phenotype and the exonic and splicing category of an ncRNA gene by using STAAR procedure. For each ncRNA category, the conditional STAAR-B p-value is a p-value from an omnibus test that aggregated conditional Burden(1,25) and Burden(1,1), together with conditional p-values of each test weighted by each annotation using Cauchy method.

```
ncRNA_cond_spa(
  chr,
  gene_name,
  genofile,
  obj_nullmodel,
  known_loci,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
```

ncRNA_cond_spa 29

```
Use_annotation_weights = c(TRUE, FALSE),
Annotation_name = NULL,
SPA_p_filter = FALSE,
p_filter_cutoff = 0.05,
silent = FALSE
)
```

Arguments

chr chromosome.

gene_name name of the ncRNA gene to be analyzed using STAAR procedure.

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = FALSE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

A data frame containing the STAAR p-values (including STAAR-O) corresponding to the exonic and splicing category of the given ncRNA gene.

30 Sliding_Window

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sliding_Window

Genetic region analysis of sliding windows using STAAR procedure

Description

The Sliding_Window function takes in chromosome, starting location, ending location, sliding window length, the object of opened annotated GDS file, and the object from fitting the null model to analyze the association between a quantitative/dichotomous phenotype (including imbalanced case-control design) and variants in a genetic region by using STAAR procedure. For each sliding window, the STAAR-O p-value is a p-value from an omnibus test that aggregated SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For imbalance case-control setting, the results correspond to the STAAR-B p-value, which is a p-value from an omnibus test that aggregated Burden(1,25) and Burden(1,1) together with p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait association p-values (e.g. MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

```
Sliding_Window(
  chr,
  start_loc.
  end_loc,
  sliding_window_length = 2000,
  type = c("single", "multiple"),
  genofile,
 obj_nullmodel,
 rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
 Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL,
  SPA_p_filter = TRUE,
  p_filter_cutoff = 0.05,
  silent = FALSE
```

Sliding_Window 31

Arguments

chr chromosome.

start_loc starting location (position) of the genetic region to be analyzed using STAAR

procedure.

end_loc ending location (position) of the genetic region to be analyzed using STAAR

procedure.

sliding_window_length

the (fixed) length of the sliding window to be analyzed using STAAR procedure.

type the type of sliding window to be analyzed using STAAR procedure. Choices

include single, multiple (default = single).

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package $\,$

and transformed using the genesis2staar_nullmodel function.

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

 ${\tt Use_annotation_weights}$

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = TRUE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

silent logical: should the report of error messages be suppressed (default = FALSE).

Value

A data frame containing the STAAR p-values (including STAAR-O or STAAR-B in imbalanced case-control setting) corresponding to each sliding window in the given genetic region.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sliding_Window_cond

Genetic region conditional analysis of sliding windows using STAAR procedure

Description

The Sliding_Window_cond function takes in chromosome, starting location, ending location, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between a quantitative/dichotomous phenotype and variants in a genetic region by using STAAR procedure. For each sliding window, the conditional STAAR-O p-value is a p-value from an omnibus test that aggregated conditional SKAT(1,25), SKAT(1,1), Burden(1,25), Burden(1,1), ACAT-V(1,25), and ACAT-V(1,1) together with conditional p-values of each test weighted by each annotation using Cauchy method. For multiple phenotype analysis (obj_nullmodel\$n.pheno > 1), the results correspond to multi-trait conditional p-values (e.g. conditional MultiSTAAR-O) by leveraging the correlation structure between multiple phenotypes.

Usage

```
Sliding_Window_cond(
  chr,
  start_loc,
  end_loc,
  genofile,
  obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
  method_cond = c("optimal", "naive"),
  QC_label = "annotation/filter",
  variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
  Annotation_dir = "annotation/info/FunctionalAnnotation",
  Annotation_name_catalog,
  Use_annotation_weights = c(TRUE, FALSE),
  Annotation_name = NULL
)
```

Arguments

chr chromosome.

start_loc starting location (position) of the sliding window to be analyzed using STAAR procedure.

end_loc ending location (position) of the sliding window to be analyzed using STAAR

procedure.

genofile an object of opened annotated GDS (aGDS) file.

obj_nullmodel an object from fitting the null model, which is either the output from fit_nullmodel

function, or the output from fitNullModel function in the GENESIS package

and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS),

reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

method_cond a character value indicating the method for conditional analysis. optimal refers

to regressing residuals from the null model on known_loci as well as all covariates used in fitting the null model (fully adjusted) and taking the residuals; naive refers to regressing residuals from the null model on known_loci and

taking the residuals (default = optimal).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

Value

A data frame containing the conditional STAAR p-values (including STAAR-O) corresponding to the sliding window in the given genetic region.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

```
Sliding_Window_cond_spa
```

Genetic region conditional analysis of sliding windows using STAAR procedure for imbalanced case-control setting

Description

The Sliding_Window_cond_spa function takes in chromosome, starting location, ending location, the object of opened annotated GDS file, the object from fitting the null model, and the set of known variants to be adjusted for in conditional analysis to analyze the conditional association between an imbalanced case-control phenotype and variants in a genetic region by using STAAR procedure. For each sliding window, the conditional STAAR-B p-value is a p-value from an omnibus test that aggregated conditional Burden(1,25) and Burden(1,1), together with conditional p-values of each test weighted by each annotation using Cauchy method.

Usage

```
Sliding_Window_cond_spa(
  chr,
  start_loc,
  end_loc,
  genofile,
 obj_nullmodel,
  known_loci = NULL,
  rare_maf_cutoff = 0.01,
  rv_num_cutoff = 2,
 QC_label = "annotation/filter",
 variant_type = c("SNV", "Indel", "variant"),
  geno_missing_imputation = c("mean", "minor"),
 Annotation_dir = "annotation/info/FunctionalAnnotation",
 Annotation_name_catalog,
 Use_annotation_weights = c(TRUE, FALSE),
 Annotation_name = NULL,
 SPA_p_filter = FALSE,
 p_filter_cutoff = 0.05
```

Arguments

chr	chromosome.
start_loc	starting location (position) of the sliding window to be analyzed using STAAR procedure.
end_loc	ending location (position) of the sliding window to be analyzed using STAAR procedure.
genofile	an object of opened annotated GDS (aGDS) file.
obj_nullmodel	an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function.

known_loci the data frame of variants to be adjusted for in conditional analysis and should

contain 4 columns in the following order: chromosome (CHR), position (POS), reference allele (REF), and alternative allele (ALT) (default = NULL).

rare_maf_cutoff

the cutoff of maximum minor allele frequency in defining rare variants (default

= 0.01).

rv_num_cutoff the cutoff of minimum number of variants of analyzing a given variant-set (de-

fault = 2).

QC_label channel name of the QC label in the GDS/aGDS file (default = "annotation/filter").

variant_type type of variant included in the analysis. Choices include "SNV", "Indel", or

"variant" (default = "SNV").

geno_missing_imputation

method of handling missing genotypes. Either "mean" or "minor" (default =

"mean").

Annotation_dir channel name of the annotations in the aGDS file

(default = "annotation/info/FunctionalAnnotation").

Annotation_name_catalog

a data frame containing the name and the corresponding channel name in the

aGDS file.

Use_annotation_weights

use annotations as weights or not (default = TRUE).

Annotation_name

a vector of annotation names used in STAAR (default = NULL).

SPA_p_filter logical: are only the variants with a normal approximation based p-value smaller

than a pre-specified threshold use the SPA method to recalculate the p-value,

only used for imbalanced case-control setting (default = FALSE).

p_filter_cutoff

threshold for the p-value recalculation using the SPA method, only used for

imbalanced case-control setting (default = 0.05).

Value

A data frame containing the conditional STAAR p-values (including STAAR-B) corresponding to the sliding window in the given genetic region.

References

Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)

Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)

Sofer, T., et al. (2019). A fully adjusted two-stage procedure for rank-normalization in genetic association studies. *Genetic Epidemiology*, 43(3), 263-275. (pub)

staar2scang_nullmodel Transforming the null model object fitted using STAAR to the null model object to be used for SCANG-STAAR

Description

The staar2scang_nullmodel function takes in the object from fitting the null model and transforms it to the object from fitting the null model to be used for SCANG-STAAR procedure.

Usage

staar2scang_nullmodel(obj_nullmodel)

Arguments

obj_nullmodel

an object from fitting the null model, which is either the output from fit_nullmodel function, or the output from fitNullModel function in the GENESIS package and transformed using the genesis2staar_nullmodel function.

Value

An object from fitting the null model for related samples to be used for SCANG-STAAR procedure, which is the output from fit_null_glmmkin_SCANG function for related samples in the SCANG package.

References

- Li, Z., Li, X., et al. (2022). A framework for detecting noncoding rare-variant associations of large-scale whole-genome sequencing studies. *Nature Methods*, 19(12), 1599-1611. (pub)
- Li, X., Li, Z., et al. (2020). Dynamic incorporation of multiple in silico functional annotations empowers rare variant association analysis of large whole-genome sequencing studies at scale. *Nature Genetics*, 52(9), 969-983. (pub)
- Li, Z., Li, X., et al. (2019). Dynamic scan procedure for detecting rare-variant association regions in whole-genome sequencing studies. *The American Journal of Human Genetics*, 104(5), 802-814. (pub)

Index

```
Dynamic_Window_SCANG, 2
family, 5
fit_nullmodel, 3, 4, 7, 8, 10, 12, 14, 16, 17,
         19, 21, 22, 24, 25, 27, 29, 31, 33, 34,
         36
formula, 5
Gene_Centric_Coding, 7
Gene_Centric_Coding_cond, 9
Gene_Centric_Coding_cond_spa, 11
Gene_Centric_Noncoding, 13
Gene_Centric_Noncoding_cond, 15
Gene_Centric_Noncoding_cond_spa, 17
genesis2staar_nullmodel, 6, 8, 10, 12, 14,
         16, 17, 19, 21, 22, 24, 25, 27, 29, 31,
         33, 34
glm, 6
glmmkin, 6
Individual_Analysis, 19
Individual_Analysis_cond, 20
Individual_Analysis_cond_spa, 22
\texttt{LD\_pruning}, \textcolor{red}{23}
1m, 5
ncRNA, 24
ncRNA_cond, 26
ncRNA_cond_spa, 28
Sliding_Window, 30
Sliding_Window_cond, 32
Sliding_Window_cond_spa, 34
staar2scang_nullmodel, 3, 36
```