## Package 'RVS'

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Type Package

**Title** Computes estimates of the probability of related individuals sharing a rare variant

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**Description** Rare Variant Sharing (RVS) implements tests of association and linkage between rare genetic variant genotypes and a dichotomous phenotype, e.g. a disease status, in family samples. The tests are based on probabilities of rare variant sharing by relatives under the null hypothesis of absence of linkage and association between the rare variants and the phenotype and apply to single variants or multiple variants in a region (e.g. gene-based test).

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**Depends** R (>= 3.5.0)

Imports GENLIB, gRain, snpStats, kinship2, methods, stats, utils

Suggests knitr, testthat, rmarkdown, BiocStyle, VariantAnnotation

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ComputeKinshipPropCoef

ratio of excess kinship among descendants over mean kinship among founders

#### Description

Computes, for each pair of final descendants in the pedigree structure contained in the pedigree object, the ratio of the difference between the inferred and expected kinship coefficient for the pair over the mean kinship among founders.

#### Usage

ComputeKinshipPropCoef(ped)

## S4 method for signature 'pedigree'
ComputeKinshipPropCoef(ped)

#### Arguments

ped pedigree object (S3)

#### Details

The ratio for each pair of final descendants is computed using equation (A1) of Bureau et al. Dividing the difference between the inferred and expected kinship coefficient for each pair by this ratio gives a pair-specific estimate of the mean kinship among founders, which can then be averaged over all pairs of final descendants from the same population to obtain a global estimate of the mean kinship among founders.

#### convertMatrix

#### Value

a symmetric matrix of ratios for all pair of final descendants in the pedigree structure contained in the pedigree

#### References

Bureau, A., Younkin, S., Parker, M.M., Bailey-Wilson, J.E., Marazita, M.L., Murray, J.C., Mangold, E., Albacha-Hejazi, H., Beaty, T.H. and Ruczinski, I. (2014) Inferring rare disease risk variants based on exact probabilities of sharing by multiple affected relatives. Bioinformatics, 30(15): 2189-96, doi:10.1093/bioinformatics/btu198.

#### Examples

```
data(samplePedigrees)
ComputeKinshipPropCoef(samplePedigrees$firstCousinTriple)
```

convertMatrix

convert snpMatrix to a list of vectors of sharing

#### Description

convert snpMatrix to a list of vectors of sharing

#### Usage

```
convertMatrix(snpMat, famInfo, minorAllele = NA)
```

#### Arguments

snpMat	SnpMatrix
famInfo	data frame containing pedigree, member, father, mother, sex, affected fields for each sequenced subject
minorAllele	vector specifying the minor allele of each variant

#### Value

list of boolean vectors indicating sharing pattern for each variant

enrichmentPValue

#### Description

Computes a p-value for all variants seen across all families

#### Usage

```
enrichmentPValue(snpMat, famInfo, sharingProbs, threshold = 0)
```

#### Arguments

snpMat	SnpMatrix
famInfo	data frame containing pedigree, member, father, mother, sex, affected fields for each sequenced subject
sharingProbs	vector of sharing probabilites, must be a named vector with famid's for each probability
threshold	minimum p-value threshold passed to multipleFamilyPValue

#### Details

For each variant, the families which have all sequenced subjects sharing the variant and the families which have some sequenced subjects sharing the variant are recorded. All unique (family, variant) pairs are accumulated into a single vector and passed to multipleFamilyPValue

#### Value

p-value

#### References

Fu, J., Beaty, T.H., Scott, A.F., Hetmanski, J., Parker, M.M., Bailey-Wilson, J.E., Marazita, M.L., et al. 2017. Whole Exome Association of Rare Deletions in Multiplex Oral Cleft Families. Genetic Epidemiology 41 (1): 61–69. doi:10.1002/gepi.22010.

ex.ped.mat	matrix of pedigree information and genotype data from famVCF stored
	in the LINKAGE format

#### Description

matrix of pedigree information and genotype data from famVCF stored in the LINKAGE format

#### Usage

ex.ped.mat

fam15157.vcf	VCF objects containing genotype data for two families: fam15157 and
	fam28003 (corresponding to the secondCousinTriple and firstAndSec-
	ondCousinsTriple families in samplePedigrees)

#### Description

VCF objects containing genotype data for two families: fam15157 and fam28003 (corresponding to the secondCousinTriple and firstAndSecondCousinsTriple families in samplePedigrees)

#### Usage

fam15157.vcf

fam28003.vcf	VCF objects containing genotype data for two families: fam15157 and
	fam28003 (corresponding to the secondCousinTriple and firstAndSec-
	ondCousinsTriple families in samplePedigrees)

#### Description

VCF objects containing genotype data for two families: fam15157 and fam28003 (corresponding to the secondCousinTriple and firstAndSecondCousinsTriple families in samplePedigrees)

#### Usage

fam28003.vcf

GeneDrop

deprecated function

#### Description

This function is deprecated with version  $\geq 2.0$  and should not be used, instead use RVsharing with nSim option

#### Usage

```
GeneDrop(...)
```

GeneDropSim.allsubsets.fn(...)

GeneDropSim.fn(...)

GeneDropSimExcessSharing.fn(...)

#### Arguments

... arguments to the old function

#### Value

none

#### Examples

```
tryCatch(GeneDrop(), error = function(e) message(e))
```

get.psubset deprecated function

#### Description

This function is deprecated with version  $\geq 2.0$  and should not be used, instead use multipleFamilyPValue

#### Usage

get.psubset(vec, not, pshare.data)

#### Arguments

vec	a vector of names of all families where a variant is seen
not	a vector of names of families where not all affected subjects share the rare variant
pshare.data	a data frame with at least two of the following columns: pshare: vector of RV sharing probabilities ped.tocompute.vec: vector of names of the families whose sharing probability is contained in pshare. The names in the arguments vec and not must be found in ped.tocompute.vec

#### Value

P-value of the exact rare variant sharing test requiring sharing by all affected subjects.

#### Examples

```
data(samplePedigrees)
notSharedFams <- c(15159, 15053, 15157)
famids <- sapply(samplePedigrees, function(p) p$famid[1])
notShared <- famids %in% notSharedFams
probs <- sapply(samplePedigrees, RVsharing)
get.psubset(famids, notShared, data.frame(pshare=probs,
ped.tocompute.vec=famids))</pre>
```

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multipleFamilyPValue probability of sharing of rare variants in a subset of families

#### Description

Computing probability of sharing of rare variants in a subset of families where rare variants are seen based on precomputed family-specific rare variant sharing probabilities.

#### Usage

```
multipleFamilyPValue(sharingProbs, observedSharing, minPValue = 0)
```

#### Arguments

sharingProbs	named vector of sharing probabilties, where names correspond to famid value of pedigree
observedSharing	S
	boolean vector describing if all affected subjects in the family share the variant (TRUE if all share)
minPValue	the minimum p-value threshold, once the true p-value is determined to be less than this, the computation stops and minPValue is returned - this prevents ex- tremely long computations for extremely small p-values

#### Details

All the subsets of families of size equal or inferior to the length of not are created, and the joint probability of each such subset not sharing a rare variant and the remaining families sharing a rare variant is obtained as the product of the family-specific rare variant sharing probabilities or its complement. The function then sums the pattern probabilities inferior or equal to the probability of the observed pattern of the not families not sharing a rare variant and the remaining families sharing a rare variant.

#### Value

P-value of the exact rare variant sharing test requiring sharing by all affected subjects

#### References

Bureau, A., Younkin, S., Parker, M.M., Bailey-Wilson, J.E., Marazita, M.L., Murray, J.C., Mangold, E., Albacha-Hejazi, H., Beaty, T.H. and Ruczinski, I. (2014) Inferring rare disease risk variants based on exact probabilities of sharing by multiple affected relatives. Bioinformatics, 30(15): 2189-96, doi:10.1093/bioinformatics/btu198.

```
data(samplePedigrees)
probs <- sapply(samplePedigrees, RVsharing)
notSharedFams <- c(15159, 15053, 15157)
famids <- sapply(samplePedigrees, function(p) p$famid[1])
shared <- !famids %in% notSharedFams
names(shared) <- names(probs)
multipleFamilyPValue(probs, shared)</pre>
```

multipleVariantPValue generalization of multipleFamilyPValue to multiple variants

#### Description

Computes a p-value for each variant sharing pattern across families

#### Usage

```
multipleVariantPValue(snpMat, famInfo, sharingProbs, minorAllele = NA,
filter = NULL, alpha = 0)
```

#### Arguments

snpMat	SnpMatrix
famInfo	data frame containing pedigree, member, father, mother, sex, affected fields for each sequenced subject
sharingProbs	vector of sharing probabilites, must be a named vector with famid's for each probability
minorAllele	vector specifying the minor allele of each variant
filter	criteria for filtering pvalues
alpha	parameter for filter

#### Details

For each variant, the families which have all sequenced subjects sharing the variant and the families which have some sequenced subjects sharing the variant are recorded. These values are passed to multipleFamilyPValue

#### Value

list containing p-values and potential p-values for each variant

ped2trio

deprecated function

#### Description

This function is deprecated with version  $\geq 2.0$  and should not be used.

#### Usage

ped2trio(...)

#### Arguments

... arguments to the old function

#### processPedigree

#### Value

none

#### Examples

```
tryCatch(ped2trio(), error = function(e) message(e))
```

processPedigree *extract useful information from a pedigree* 

#### Description

Extract key information from a pedigree object, which makes subsequent computations much easier.

#### Usage

```
processPedigree(ped, carriers = NULL)
```

## S4 method for signature 'pedigree'
processPedigree(ped, carriers = NULL)

#### Arguments

ped	pedigree object (S3)
carriers	subjects in which the rare variant is seen

#### Value

list containing relevant pedigree info

#### Examples

```
data(samplePedigrees)
processPedigree(samplePedigrees$firstCousinPair)
```

RVgene

Probability of sharing of rare variants in a family sample within a gene

#### Description

Computing probability of sharing of rare variants in a family sample within a genomic region such as a gene.

#### Usage

```
RVgene(data, ped.listfams, sites, fams, pattern.prob.list, nequiv.list,
N.list, type = "alleles", minor.allele.vec,
precomputed.prob = list(0), maxdim = 1e+09, partial.sharing = TRUE,
...)
```

## Arguments

A list of SnpMatrix objects corresponding to each pedigree object in ped.listfams, or a data.frame or matrix encoding the pedigree information and genotype data in the standard LINKAGE ped format or the PLINK raw format with additive component only (see PLINK web site [1]). From the pedigree information, only the family ID in the first column, the subject ID in the second column and the affection status in the sixth column are used (columns 3 to 5 are ignored). Also, family members without genotype data do not need to appear in this object. The genotype of each variant can be coded in two ways, each corresponding to a dif- ferent value of the type option: a minor allele count on one column with missing values coded NA, (type="count") or the identity of the two alleles on two con- secutive columns, with missing values coded 0 corresponding to the standard LINKAGE ped format (type="alleles"). If you provide a SnpMatrix object then the genotype should be coded as the minor allele count + 1, i.e. 01 is the ho- mozygous genotype for the common allele.
a list of pedigree objects, one object for each pedigree for which genotype data are included in data.
a vector of the column indices of the variant sites to test in data. If the argument fams is provided, the variant sites are tested in each corresponding family in the fams vector (a variant present in multiple families must then be repeated for every families where it appears).
an optional character vector of the names of families in data and ped.listfams carrying the variants listed in the corresponding position in sites. If missing, the names of the families carrying the minor allele at each position in sites are extracted from data
st
a list of precomputed rare variant sharing probabilities for all possible sharing patterns in the families in data and ped.listfams
an optional vector of the number of configurations of rare variant sharing by the affected subjects corresponding to the same pattern and probability in pattern.prob.list. Default is a vector of 1s
a vector of the number of affected subjects sharing a rare variant in the corre- sponding pattern in pattern.prob.list
an optional character string taking value "alleles" or "count". Default is "alleles"
an optional vector of the minor alleles at each site in the sites vector. It is not needed if type="count". If it is missing and type="alleles", the minor allele is assumed to take the value 2
b
an optional list of vectors precomputed rare variant sharing probabilities for fam- ilies in data and ped.listfams. If the vectors are named, the names must be strings formed by the concatenation of the sorted carrier names separated by semi-columns. If the vectors are not named, the vectors must represent proba- bilities for all the possible values of N.list for the corresponding family (one probability per value of N.list)
upper bound on the dimension of the array containing the joint distribution of the sharing patterns for all families in fams (to avoid running out of memory)
logical indiacting whether the test allowing for sharing by a subset of affected
logical indicating whether the test allowing for sharing by a subset of affected subjects should be performed. If FALSE, only the test requiring sharing by all affected subjects is computed. Default is TRUE

#### RVgene

#### . . .

#### other arguments to be passed to RVsharing

#### Details

The function extracts the carriers of the minor allele at each entry in sites in each family where it is present in ped.mat (or in the families specified in fams if that argument is specified). It then computes exact rare variant sharing probabilities in each family for each variant by calling RVsharing. If multiple rare variants are seen in the same family, the smallest sharing probability among all rare variants is retained. The joint rare variant sharing probability over all families is obtained as the product of the family-specific probabilities. The p-value of the test allowing for sharing by a subset of affected subjects over the rare variants in the genomic region is then computed as the sum of the probabilities of the possible combinations of sharing patterns among all families with a probability less than or equal to the observed joint probability and a total number of carriers greater than or equal to the sum of the number of carriers in all families, using the values in pattern.prob.list, nequiv.list and N.list. The families where all affected subjects share a rare variant are determined by verifying if the length of the carrier vector equals the maximum value of N.list for that family. The p-value of the test requiring sharing by all affected subjects is computed by calling multipleFamilyPValue.

#### Value

A list with items: p P-value of the exact rare variant sharing test allowing for sharing by a subset of affected subjects. pall P-value of the exact rare variant sharing test requiring sharing by all affected subjects. potentialp Minimum achievable p-value if all affected subjects were carriers of a rare variant.

#### References

Bureau, A., Begum, F., Taub, M.A., Hetmanski, J., Parker, M.M., Albacha-Hejazi, H., Scott, A.F., et al. (2019) Inferring Disease Risk Genes from Sequencing Data in Multiplex Pedigrees Through Sharing of Rare Variants. Genet Epidemiol. 43(1):37-49. doi: 10.1002/gepi.22155.

```
data(samplePedigrees)
data(ex.ped.mat)
fam15157 <- samplePedigrees$secondCousinTriple</pre>
fam15157.pattern.prob = c(RVsharing(fam15157,carriers=c(15,16,17)),
    RVsharing(fam15157,carriers=c(15,16)),
    RVsharing(fam15157,carriers=c(15)))
fam15157.nequiv = c(1,3,3)
# check that distribution sums to 1
sum(fam15157.pattern.prob*fam15157.nequiv)
fam15157.N = 3:1
fam28003 <- samplePedigrees$firstAndSecondCousinsTriple</pre>
fam28003.pattern.prob = c(RVsharing(fam28003,carriers=c(36,104,110)),
    RVsharing(fam28003,carriers=c(36,104)),
    RVsharing(fam28003,carriers=c(104,110)),
    RVsharing(fam28003, carriers=c(36)),
    RVsharing(fam28003,carriers=c(104)))
fam28003.N = c(3,2,2,1,1)
fam 28003.nequiv = c(1,2,1,1,2)
# check that distribution sums to 1
sum(fam28003.pattern.prob*fam28003.nequiv)
# Creating lists
```

```
ex.pattern.prob.list = list("15157"=fam15157.pattern.prob,"28003"=fam28003.pattern.prob)
ex.nequiv.list = list("15157"=fam15157.nequiv,"28003"=fam28003.nequiv)
ex.N.list = list("15157"=fam15157.N,"28003"=fam28003.N)
ex.ped.obj = list(fam15157,fam28003)
names(ex.ped.obj) = c("15157","28003")
sites = c(92, 119)
minor.allele.vec=c(1,4)
RVgene(ex.ped.mat,ex.ped.obj,sites,
    pattern.prob.list=ex.pattern.prob.list,
nequiv.list=ex.nequiv.list,N.list=ex.N.list,
    minor.allele.vec=minor.allele.vec)
# calling with a SnpMatrix list
data(famVCF)
fam15157.snp = suppressWarnings(VariantAnnotation::genotypeToSnpMatrix(fam15157.vcf))
fam28003.snp = suppressWarnings(VariantAnnotation::genotypeToSnpMatrix(fam28003.vcf))
ex.SnpMatrix.list = list(fam15157=fam15157.snp$genotypes,fam28003=fam28003.snp$genotypes)
RVgene(ex.SnpMatrix.list,ex.ped.obj,sites,
    pattern.prob.list=ex.pattern.prob.list, nequiv.list=ex.nequiv.list,
    N.list=ex.N.list,minor.allele.vec=minor.allele.vec)
```

RVS

RVS

#### Description

RVS

RVsharing

probability of sharing a rare variant among relatives

#### Description

computing probability that a rare variant is shared by a set of subjects in a pedigree using the gRain package

#### Usage

```
RVsharing(ped, carriers = NULL, alleleFreq = NA, kinshipCoeff = NA,
    nSim = NA, founderDist = NULL, useAffected = FALSE,
    kinshipOrder = 5, ...)
## S4 method for signature 'pedigree'
RVsharing(ped, carriers, alleleFreq, kinshipCoeff,
    nSim, founderDist, useAffected, kinshipOrder, splitPed = FALSE, ...)
## S4 method for signature 'list'
RVsharing(ped, carriers = NULL, alleleFreq = NA,
    kinshipCoeff = NA, nSim = NA, founderDist = NULL,
    useAffected = FALSE, kinshipOrder = 5, ...)
```

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#### **RV**sharing

#### Arguments

ped	S3 pedigree object or a list of pedigree objects
carriers	subjects in pedigree that have the variant, if ped is a list, then this will also be a list of vectors specifying the carriers in each pedigree
alleleFreq	allele frequency among the founders
kinshipCoeff	mean kinship coefficient among the founders
nSim	number of simulations used in monte carlo calculation
founderDist	custom distribution among founders - only used when simulating probability with nSim
useAffected	a logical value indicating whether to condition on seeing the variant among the affected subjects instead of the final descendants
kinshipOrder	order of the polynomial approximation to the distribution of the number of distinct alleles in the founders (d in Bureau et al.). Must be $\leq 5$
	allows for arguments in the style of v1.7
splitPed	a logical value indicating whether to split the pedigree in subpedigrees below each founder to enable computations in pedigrees too large to be stored in a single Bayesian network

#### Details

the function RVsharing computes the probability that all subjects identified as carriers of a rare variant in the vector carriers (or all final descendants in the pedigree if carriers == NULL) share that rare variant AND the final descendants not included in carriers do not carry it, given that the rare variant has been detected in any subject in the union of the carriers and the final descendants of the pedigree. A final descendant is defined as a subject without descendant in the pedigree, it it not necessarily in the youngest generation. If carriers enumerates a subset of pedigree members, the function will then compute the probability these carriers share the rare variant AND the final descendants not included in carriers do not carry it based on the above terms. To obtain the probability that a set of pedigree members carry a rare variant given it was seen in any of the set members (ignoring the carrier status of final descendants not in the set), the pedigree must be trimmed of the other final descendants before calling RVsharing.

#### Value

sharing probability between all carriers in pedigree, or if splitPed = TRUE, a vector of sharing probabilities for all subsets of the carriers

#### References

Bureau, A., Younkin, S., Parker, M.M., Bailey-Wilson, J.E., Marazita, M.L., Murray, J.C., Mangold, E., Albacha-Hejazi, H., Beaty, T.H. and Ruczinski, I. (2014) Inferring rare disease risk variants based on exact probabilities of sharing by multiple affected relatives. Bioinformatics, 30(15): 2189-96, doi:10.1093/bioinformatics/btu198.

Sherman, T., Fu, J., Scharpf, R., Bureau, A., and Ruczinski, I. (2018) Detection of rare disease variants in extended pedigrees using RVS. Bioinformatics, 1-3, doi: 10.1093/bioinformatics/bty976

```
data("samplePedigrees")
RVsharing(samplePedigrees$firstCousinPair)
```

samplePedigrees

#### Description

list of 8 sample pedigree objects

#### Usage

samplePedigrees

snpMat

SnpMatrix with genotype information from famVCF for fam15157

#### Description

SnpMatrix with genotype information from famVCF for fam15157

#### Usage

snpMat

SnpMatrixToCount	convert a list of SnpMatrices to a single matrix in a similiar format as
	LINKAGE except with minor allele counts

#### Description

creates a matrix in LINKAGE format using pedigree information from a list of pedigree objects and genotype information from a list of SnpMatrices

#### Usage

SnpMatrixToCount(matList, pedList)

#### Arguments

matList	list of SnpMatrices
pedList	list of pedigrees

#### Value

matrix in LINKAGE format

```
data(samplePedigrees)
data(snpMat)
ped <- samplePedigrees$secondCousinTriple
ex.ped.mat <- SnpMatrixToCount(list(snpMat), list(ped))</pre>
```

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