Package 'SNPRelate'

April 15, 2020

Type Package

Title Parallel Computing Toolset for Relatedness and Principal Component Analysis of SNP Data

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Depends R (>= 2.15), gdsfmt (>= 1.8.3)

LinkingTo gdsfmt Imports methods

Suggests parallel, Matrix, RUnit, knitr, MASS, BiocGenerics

Enhances SeqArray (>= 1.12.0)

Description Genome-wide association studies (GWAS) are widely used to investigate the genetic basis of diseases and traits, but they pose many computational challenges. We developed an R package SNPRelate to provide a binary format for single-nucleotide polymorphism (SNP) data in GWAS utilizing CoreArray Genomic Data Structure (GDS) data files. The GDS format offers the efficient operations specifically designed for integers with two bits, since a SNP could occupy only two bits. SNPRelate is also designed to accelerate two key computations on SNP data using parallel computing for multi-core symmetric multiprocessing computer architectures: Principal Component Analysis (PCA) and relatedness analysis using Identity-By-Descent measures. The SNP GDS format is also used by the GWASTools package with the support of S4 classes and generic functions. The extended GDS format is implemented in the SeqArray package to support the storage of single nucleotide variations (SNVs), insertion/deletion polymorphism (indel) and structural variation calls in whole-genome and whole-exome variant data.

License GPL-3
VignetteBuilder knitr

URL http://github.com/zhengxwen/SNPRelate,

http://corearray.sourceforge.net/tutorials/SNPRelate/

BugReports http://github.com/zhengxwen/SNPRelate/issues

biocViews Infrastructure, Genetics, StatisticalMethod, PrincipalComponent

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Description

Genome-wide association studies are widely used to investigate the genetic basis of diseases and traits, but they pose many computational challenges. We developed SNPRelate (R package for multi-core symmetric multiprocessing computer architectures) to accelerate two key computations on SNP data: principal component analysis (PCA) and relatedness analysis using identity-by-descent measures. The kernels of our algorithms are written in C/C++ and highly optimized.

Details

Package: SNPRelate
Type: Package
License: GPL version 3
Depends: gdsfmt (>= 1.0.4)

The genotypes stored in GDS format can be analyzed by the R functions in SNPRelate, which utilize the multi-core feature of machine for a single computer.

Webpage: http://github.com/zhengxwen/SNPRelate, http://corearray.sourceforge.net/ Tutorial: http://corearray.sourceforge.net/tutorials/SNPRelate/

Author(s)

Xiuwen Zheng <zhengxwen@gmail.com>

References

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Zheng X, Levine D, Shen J, Gogarten SM, Laurie C, Weir BS. A High-performance Computing Toolset for Relatedness and Principal Component Analysis of SNP Data. Bioinformatics (2012); doi: 10.1093/bioinformatics/bts610

```
# Convert the PLINK BED file to the GDS file
# PLINK BED files
\verb|bed.fn <- system.file("extdata", "plinkhapmap.bed.gz", package="SNPRelate")| \\
fam.fn <- system.file("extdata", "plinkhapmap.fam.gz", package="SNPRelate")</pre>
bim.fn <- system.file("extdata", "plinkhapmap.bim.gz", package="SNPRelate")</pre>
# convert
snpgdsBED2GDS(bed.fn, fam.fn, bim.fn, "HapMap.gds")
# Principal Component Analysis
#
genofile <- snpgdsOpen("HapMap.gds")</pre>
RV <- snpgdsPCA(genofile)</pre>
plot(RV$eigenvect[,2], RV$eigenvect[,1], xlab="PC 2", ylab="PC 1",
   col=rgb(0,0,150, 50, maxColorValue=255), pch=19)
# close the file
snpgdsClose(genofile)
# Identity-By-Descent (IBD) Analysis
# open
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
RV <- snpgdsIBDMoM(genofile)</pre>
flag <- lower.tri(RV$k0)</pre>
plot(RV$k0[flag], RV$k1[flag], xlab="k0", ylab="k1",
   col=rgb(0,0,150, 50, maxColorValue=255), pch=19)
abline(1, -1, col="red", lty=4)
# close the file
snpgdsClose(genofile)
# Identity-By-State (IBS) Analysis
```

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```
# open
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
RV <- snpgdsIBS(genofile)</pre>
m <- 1 - RV$ibs
colnames(m) <- rownames(m) <- RV$sample.id</pre>
GeneticDistance <- as.dist(m[1:45, 1:45])</pre>
HC <- hclust(GeneticDistance, "ave")</pre>
plot(HC)
# close the file
snpgdsClose(genofile)
# Linkage Disequilibrium (LD) Analysis
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
snpset <- read.gdsn(index.gdsn(genofile, "snp.id"))[1:200]</pre>
L1 <- snpgdsLDMat(genofile, snp.id=snpset, method="composite", slide=-1)
# plot
image(abs(L1$LD), col=terrain.colors(64))
# close the file
snpgdsClose(genofile)
```

hapmap_geno

SNP genotypes of HapMap samples

Description

```
sample.id - a vector of sample ids;
snp.id - a vector of SNP ids;
snp.position - a vector of SNP positions;
snp.chromosome - a vector of chromosome indices;
snp.allele - a character vector of "reference / non-reference";
```

genotype – a "# of SNPs" X "# of samples" genotype matrix.

A list object including the following components:

Usage

hapmap_geno

Value

A list

6 snpgdsAdmixPlot

Description

Plot the admixture proportions according to their ancestries.

Usage

Arguments

propmat	$a sample-by-ancestry\ matrix\ of\ proportion\ estimates, returned\ from\ {\tt snpgdsAdmixProp()}$
group	a character vector of a factor according to the samples in propmat
col	specify colors
multiplot	single plot or multiple plots
showgrp	show group names in the plot
shownum	TRUE: show the number of each group in the figure
ylim	TRUE: y-axis is limited to [0, 1]; FALSE: ylim <-range(propmat); a 2-length numeric vector: ylim used in plot()
na.rm	TRUE: remove the sample(s) according to the missing value(s) in group
sort	TRUE: rearranges the rows of proportion matrices into descending order

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

Value

```
snpgdsAdmixPlot(): none.
snpgdsAdmixTable(): a list of data.frame consisting of group, num, mean, sd, min, max
```

Author(s)

Xiuwen Zheng

References

Zheng X, Weir BS. Eigenanalysis on SNP Data with an Interpretation of Identity by Descent. Theoretical Population Biology. 2015 Oct 23. pii: S0040-5809(15)00089-1. doi: 10.1016/j.tpb.2015.09.004.

See Also

```
snpgdsEIGMIX, snpgdsAdmixProp
```

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Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# get population information
    or pop_code <- scan("pop.txt", what=character())</pre>
   if it is stored in a text file "pop.txt"
pop_code <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))</pre>
# get sample id
samp.id <- read.gdsn(index.gdsn(genofile, "sample.id"))</pre>
# run eigen-analysis
RV <- snpgdsEIGMIX(genofile)</pre>
# define groups
groups <- list(CEU = samp.id[pop_code == "CEU"],</pre>
    YRI = samp.id[pop_code == "YRI"],
    CHB = samp.id[is.element(pop_code, c("HCB", "JPT"))])
prop <- snpgdsAdmixProp(RV, groups=groups)</pre>
snpgdsAdmixPlot(prop, group=pop_code)
# close the genotype file
snpgdsClose(genofile)
```

snpgdsAdmixProp

Estimate ancestral proportions from the eigen-analysis

Description

Estimate ancestral (admixture) proportions based on the eigen-analysis.

Usage

```
snpgdsAdmixProp(eigobj, groups, bound=FALSE)
```

Arguments

eigobj an object of snpgdsEigMixClass from snpgdsEIGMIX, or an object of snpgdsPCAClass from snpgdsPCA
groups a list of sample IDs, such like groups = list(CEU = c("NA0101", "NA1022", ...), YRI = c("NAxxxx", ...), Asia = c("NA1234", ...)) bound if TRUE, the estimates are bounded so that no component < 0 or > 1, and the sum

of proportions is one

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

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Value

Return a snpgdsEigMixClass object, and it is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis eigenval eigenvalues

eigenvect eigenvactors, "# of samples" x "eigen.cnt"

ibdmat the IBD matrix

Author(s)

Xiuwen Zheng

References

Zheng X, Weir BS. Eigenanalysis on SNP Data with an Interpretation of Identity by Descent. Theoretical Population Biology. 2015 Oct 23. pii: S0040-5809(15)00089-1. doi: 10.1016/j.tpb.2015.09.004. [Epub ahead of print]

See Also

```
snpgdsEIGMIX, snpgdsPCA, snpgdsAdmixPlot
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# get population information
# or pop_code <- scan("pop.txt", what=character())</pre>
# if it is stored in a text file "pop.txt"
pop_code <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))</pre>
# get sample id
samp.id <- read.gdsn(index.gdsn(genofile, "sample.id"))</pre>
# run eigen-analysis
RV <- snpgdsEIGMIX(genofile)</pre>
# eigenvalues
RV$eigenval
# make a data.frame
tab <- data.frame(sample.id = samp.id, pop = factor(pop_code),</pre>
    EV1 = RV$eigenvect[,1],  # the first eigenvector
EV2 = RV$eigenvect[,2],  # the second eigenvector
    stringsAsFactors = FALSE)
head(tab)
# draw
plot(tab$EV2, tab$EV1, col=as.integer(tab$pop),
    xlab="eigenvector 2", ylab="eigenvector 1")
legend("topleft", legend=levels(tab$pop), pch="o", col=1:4)
```

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```
# define groups
groups <- list(CEU = samp.id[pop_code == "CEU"],</pre>
    YRI = samp.id[pop_code == "YRI"],
    CHB = samp.id[is.element(pop_code, c("HCB", "JPT"))])
prop <- snpgdsAdmixProp(RV, groups=groups)</pre>
# draw
plot(prop[, "YRI"], prop[, "CEU"], col=as.integer(tab$pop),
    xlab = "Admixture Proportion from YRI",
    ylab = "Admixture Proportion from CEU")
abline(v=0, col="gray25", lty=2)
abline(h=0, col="gray25", lty=2)
abline(a=1, b=-1, col="gray25", lty=2)
legend("topright", legend=levels(tab$pop), pch="o", col=1:4)
# draw
snpgdsAdmixPlot(prop, group=pop_code)
# close the genotype file
snpgdsClose(genofile)
```

snpgdsAlleleSwitch

Allele-switching

Description

Switch alleles according to the reference if needed.

Usage

```
snpgdsAlleleSwitch(gdsobj, A.allele, verbose=TRUE)
```

Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file

A. allele characters, referring to A allele verbose if TRUE, show information

Value

A logical vector with TRUE indicating allele-switching and NA when it is unable to determine. NA occurs when A.allele = NA or A.allele is not in the list of alleles.

Author(s)

Xiuwen Zheng

Examples

```
# the file name of SNP GDS
(fn <- snpgdsExampleFileName())</pre>
# copy the file
file.copy(fn, "test.gds", overwrite=TRUE)
# open the SNP GDS file
genofile <- snpgdsOpen("test.gds", readonly=FALSE)</pre>
# allelic information
allele <- read.gdsn(index.gdsn(genofile, "snp.allele"))</pre>
allele.list <- strsplit(allele, "/")</pre>
A.allele <- sapply(allele.list, function(x) { x[1] })
B.allele <- sapply(allele.list, function(x) { x[2] })</pre>
set.seed(1000)
flag <- rep(FALSE, length(A.allele))</pre>
flag[sample.int(length(A.allele), 50, replace=TRUE)] <- TRUE</pre>
A.allele[flag] <- B.allele[flag]
A.allele[sample.int(length(A.allele), 10, replace=TRUE)] <- NA
table(A.allele, exclude=NULL)
# allele switching
z <- snpgdsAlleleSwitch(genofile, A.allele)</pre>
table(z, exclude=NULL)
# close the file
snpgdsClose(genofile)
# delete the temporary file
unlink("test.gds", force=TRUE)
```

snpgdsApartSelection Select SNPs with a basepair distance

Description

Randomly selects SNPs for which each pair is at least as far apart as the specified basepair distance.

Usage

```
snpgdsApartSelection(chromosome, position, min.dist=100000,
    max.n.snp.perchr=-1, verbose=TRUE)
```

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Arguments

chromosome chromosome codes

position SNP positions in base pair

min.dist A numeric value to specify minimum distance required (in basepairs)

max.n.snp.perchr

A numeric value specifying the maximum number of SNPs to return per chro-

mosome, "-1" means no number limit

verbose if TRUE, show information

Value

A logical vector indicating which SNPs were selected.

Author(s)

Xiuwen Zheng

See Also

```
snpgdsLDpruning
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
genofile

chr <- read.gdsn(index.gdsn(genofile, "snp.chromosome"))
pos <- read.gdsn(index.gdsn(genofile, "snp.position"))

set.seed(1000)
flag <- snpgdsApartSelection(chr, pos, min.dist=250000, verbose=TRUE)
table(flag)

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsBED2GDS

Conversion from PLINK BED to GDS

Description

Convert a PLINK binary ped file to a GDS file.

Usage

```
snpgdsBED2GDS(bed.fn, fam.fn, bim.fn, out.gdsfn, family=FALSE,
    snpfirstdim=NA, compress.annotation="LZMA_RA", compress.geno="",
    option=NULL, cvt.chr=c("int", "char"), cvt.snpid=c("auto", "int"),
    verbose=TRUE)
```

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Arguments

bed.fn	the file name of binary file, genotype information	
fam.fn	the file name of first six columns of " $. \mbox{ped}$ "; if it is missing, ".fam" is added to bed $. \mbox{fn}$	
bim.fn	the file name of extended MAP file: two extra columns = allele names; if it is missing, ".bim" is added to bim.fn	
out.gdsfn	the output file name of GDS file	
family	if TRUE, to include family information in the sample annotation	
snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc); NA, the dimension is determined by the BED file	
compress.annotation		
	the compression method for the GDS variables, except "genotype"; optional values are defined in the function add.gdsn	
compress.geno	the compression method for "genotype"; optional values are defined in the function ${\sf add.gdsn}$	
option	NULL or an object from snpgdsOption, see details	
cvt.chr	"int" – chromosome code in the GDS file is integer; "char" – chromosome code in the GDS file is character	
cvt.snpid	"int" – to create an integer snp.id starting from 1; "auto" – if SNP IDs in the PLINK file are not unique, to create an an integer snp.id, otherwise to use SNP IDs for snp.id	
verbose	if TRUE, show information	

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format is used in the gdsfmt package.

BED – the PLINK binary ped format.

The user could use option to specify the range of code for autosomes. For humans there are 22 autosomes (from 1 to 22), but dogs have 38 autosomes. Note that the default settings are used for humans. The user could call option = snpgdsOption(autosome.end=38) for importing the BED file of dog. It also allow define new chromosome coding, e.g., option = snpgdsOption(Z=27).

Value

Return the file name of GDS format with an absolute path.

Author(s)

Xiuwen Zheng

References

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

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See Also

```
{\tt snpgdsOption, snpgdsPED2GDS, snpgdsGDS2PED}
```

Examples

```
# PLINK BED files
bed.fn <- system.file("extdata", "plinkhapmap.bed.gz", package="SNPRelate")
fam.fn <- system.file("extdata", "plinkhapmap.fam.gz", package="SNPRelate")
bim.fn <- system.file("extdata", "plinkhapmap.bim.gz", package="SNPRelate")

# convert
snpgdsBED2GDS(bed.fn, fam.fn, bim.fn, "HapMap.gds")

# open
genofile <- snpgdsOpen("HapMap.gds")
genofile

# close
snpgdsClose(genofile)

# delete the temporary file
unlink("HapMap.gds", force=TRUE)</pre>
```

snpgdsClose

Close the SNP GDS File

Description

Close the SNP GDS file

Usage

```
snpgdsClose(gdsobj)
```

Arguments

gdsobj

an object of class ${\tt SNPGDSFileClass},$ a ${\tt SNPGDS}$ file

Details

It is suggested to call snpgdsClose instead of closefn.gds.

Value

None.

Author(s)

Xiuwen Zheng

See Also

snpgds0pen

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
genofile
# close the file
snpgdsClose(genofile)</pre>
```

snpgdsCombineGeno

Merge SNP datasets

Description

To merge GDS files of SNP genotypes into a single GDS file

Usage

```
snpgdsCombineGeno(gds.fn, out.fn, method=c("position", "exact"),
    compress.annotation="ZIP_RA.MAX", compress.geno="ZIP_RA",
    same.strand=FALSE, snpfirstdim=FALSE, verbose=TRUE)
```

Arguments

gds.fn a character vector of GDS file names to be merged

 $\hbox{out.fn} \hspace{1.5cm} \hbox{the name of output GDS file} \\$

method "exact": matching by all snp.id, chromosomes, positions and alleles; "position":

matching by chromosomes and positions

compress.annotation

the compression method for the variables except genotype

 $\begin{array}{ll} \text{compress.geno} & \text{the compression method for the variable genotype} \\ \text{same.strand} & \text{if TRUE, assuming the alleles on the same strand} \end{array}$

snpfirstdim if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs

for the first individual, and then list all SNPs for the second individual, etc)

verbose if TRUE, show information

Details

This function calls snpgdsSNPListIntersect internally to determine the common SNPs. Allele definitions are taken from the first GDS file.

Value

None.

Author(s)

Xiuwen Zheng

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See Also

snpgds Create Geno, snpgds Create Geno Set, snpgds SNPL ist, snpgds SNPL ist Intersect the supplies of the s

Examples

```
# get the file name of a gds file
fn <- snpgdsExampleFileName()</pre>
f <- snpgdsOpen(fn)</pre>
samp_id <- read.gdsn(index.gdsn(f, "sample.id"))
snp_id <- read.gdsn(index.gdsn(f, "snp.id"))</pre>
geno <- read.gdsn(index.gdsn(f, "genotype"), start=c(1,1), count=c(-1, 3000))</pre>
snpgdsClose(f)
# split the GDS file with different samples
snpgdsCreateGenoSet(fn, "t1.gds", sample.id=samp_id[1:10],
    snp.id=snp_id[1:3000])
snpgdsCreateGenoSet(fn, "t2.gds", sample.id=samp_id[11:30],
    snp.id=snp_id[1:3000])
# combine with different samples
snpgdsCombineGeno(c("t1.gds", "t2.gds"), "test.gds", same.strand=TRUE)
f <- snpgdsOpen("test.gds")</pre>
g <- read.gdsn(index.gdsn(f, "genotype"))</pre>
snpgdsClose(f)
identical(geno[1:30, ], g) # TRUE
# split the GDS file with different SNPs
snpgdsCreateGenoSet(fn, "t1.gds", snp.id=snp_id[1:100])
snpgdsCreateGenoSet(fn, "t2.gds", snp.id=snp_id[101:300])
# combine with different SNPs
snpgdsCombineGeno(c("t1.gds", "t2.gds"), "test.gds")
f <- snpgdsOpen("test.gds")</pre>
g <- read.gdsn(index.gdsn(f, "genotype"))</pre>
snpgdsClose(f)
identical(geno[, 1:300], g) # TRUE
# delete the temporary files
unlink(c("t1.gds", "t2.gds", "t3.gds", "t4.gds", "test.gds"), force=TRUE)
```

snpgds Create Geno

Create a SNP genotype dataset from a matrix

Description

To create a GDS file of genotypes from a matrix.

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Usage

```
snpgdsCreateGeno(gds.fn, genmat, sample.id=NULL, snp.id=NULL, snp.rs.id=NULL,
    snp.chromosome=NULL, snp.position=NULL, snp.allele=NULL, snpfirstdim=TRUE,
    compress.annotation="ZIP_RA.max", compress.geno="", other.vars=NULL)
```

Arguments

gds.fn	the file name of gds	
genmat	a matrix of genotypes	
sample.id	the sample ids, which should be unique	
snp.id	the SNP ids, which should be unique	
snp.rs.id	the rs ids for SNPs, which can be not unique	
snp.chromosome	the chromosome indices	
snp.position	the SNP positions in basepair	
snp.allele	the reference/non-reference alleles	
snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc)	
compress.annotation		
	the compression method for the variables except genotype	
compress.geno	the compression method for the variable genotype	
other.vars	a list object storing other variables	

Details

There are possible values stored in the variable genmat: 0, 1, 2 and other values. "0" indicates two B alleles, "1" indicates one A allele and one B allele, "2" indicates two A alleles, and other values indicate a missing genotype.

If snpfirstdim is TRUE, then genmat should be "# of SNPs X # of samples"; if snpfirstdim is FALSE, then genmat should be "# of samples X # of SNPs".

The typical variables specified in other.vars are "sample.annot" and "snp.annot", which are data.frame objects.

Value

None.

Author(s)

Xiuwen Zheng

See Also

snpgdsCreateGenoSet, snpgdsCombineGeno

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Examples

 ${\tt snpgdsCreateGenoSet}$

Create a SNP genotype dataset from a GDS file

Description

To create a GDS file of genotypes from a specified GDS file.

Usage

```
snpgdsCreateGenoSet(src.fn, dest.fn, sample.id=NULL, snp.id=NULL,
    snpfirstdim=NULL, compress.annotation="ZIP_RA.max", compress.geno="",
    verbose=TRUE)
```

Arguments

src.fn	the file name of a specified GDS file	
dest.fn	the file name of output GDS file	
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used	
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used	
snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc)	
compress.annotation		
	the compression method for the variables except genotype	
compress.geno	the compression method for the variable genotype	
verbose	if TRUE, show information	

Value

None.

Author(s)

Xiuwen Zheng

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See Also

snpgdsCreateGeno, snpgdsCombineGeno

```
# open an example dataset (HapMap)
(genofile <- snpgdsOpen(snpgdsExampleFileName()))</pre>
# + [ ] *
# |--+ sample.id { VStr8 279 ZIP(29.9%), 679B }
# |--+ snp.id { Int32 9088 ZIP(34.8%), 12.3K }
# |--+ snp.rs.id { VStr8 9088 ZIP(40.1%), 36.2K }
# |--+ snp.position { Int32 9088 ZIP(94.7%), 33.6K }
# |--+ snp.chromosome { UInt8 9088 ZIP(0.94%), 85B } *
# |--+ snp.allele { VStr8 9088 ZIP(11.3%), 4.0K }
# |--+ genotype { Bit2 279x9088, 619.0K } *
\# \--+  sample.annot [ data.frame ] *
    |--+ family.id { VStr8 279 ZIP(34.4%), 514B }
|--+ father.id { VStr8 279 ZIP(31.5%), 220B }
|--+ mother.id { VStr8 279 ZIP(30.9%), 214B }
    |--+ sex { VStr8 279 ZIP(17.0%), 95B }
    \--+ pop.group { VStr8 279 ZIP(6.18%), 69B }
set.seed(1000)
snpset <- unlist(snpgdsLDpruning(genofile))</pre>
length(snpset)
# 6547
# close the file
snpgdsClose(genofile)
snpgdsCreateGenoSet(snpgdsExampleFileName(), "test.gds", snp.id=snpset)
# check
(gfile <- snpgdsOpen("test.gds"))</pre>
# + [ ] *
# |--+ sample.id { Str8 279 ZIP_ra(31.2%), 715B }
# |--+ snp.id { Int32 6547 ZIP_ra(34.9%), 8.9K }
# |--+ snp.rs.id { Str8 6547 ZIP_ra(41.5%), 27.1K }
\# |--+ snp.position { Int32 6547 ZIP_ra(94.9%), 24.3K }
# |--+ snp.chromosome { Int32 6547 ZIP_ra(0.45%), 124B }
# |--+ snp.allele { Str8 6547 ZIP_ra(11.5%), 3.0K }
# \--+ genotype { Bit2 279x6547, 446.0K } *
# close the file
snpgdsClose(gfile)
unlink("test.gds", force=TRUE)
```

snpgdsCutTree 19

Description

To determine sub groups of individuals using a specified dendrogram from hierarchical cluster analysis

Usage

```
snpgdsCutTree(hc, z.threshold=15, outlier.n=5, n.perm = 5000, samp.group=NULL,
    col.outlier="red", col.list=NULL, pch.outlier=4, pch.list=NULL,
    label.H=FALSE, label.Z=TRUE, verbose=TRUE)
```

Arguments

hc	an object of snpgdsHCluster
z.threshold	the threshold of Z score to determine whether split the node or not
outlier.n	the cluster with size less than or equal to outlier.n is considered as outliers
n.perm	the times for permutation
samp.group	if NULL, determine groups by Z score; if a vector of factor, assign each individual in dendrogram with respect to $samp$. group
col.outlier	the color of outlier
col.list	the list of colors for different clusters
pch.outlier	plotting 'character' for outliers
pch.list	plotting 'character' for different clusters
label.H	if TRUE, plotting heights in a dendrogram
label.Z	if TRUE, plotting Z scores in a dendrogram
verbose	if TRUE, show information

Details

The details will be described in future.

Value

Return a list:

sample.id the sample ids used in the analysis

z.threshold the threshold of Z score to determine whether split the node or not outlier.n the cluster with size less than or equal to outlier.n is considered as outliers

samp.order the order of samples in the dendrogram

samp.group a vector of factor, indicating the group of each individual

dmat a matrix of pairwise group dissimilarity

dendrogram the dendrogram of individuals

merge a data.frame of (z,n1,n2) describing each combination: z, the Z score; n1, the

size of the first cluster; n2, the size of the second cluster

clust.count the counts for clusters

Author(s)

Xiuwen Zheng

20 snpgdsCutTree

See Also

```
snpgdsHCluster, snpgdsDrawTree, snpgdsIBS, snpgdsDiss
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
pop.group <- as.factor(read.gdsn(index.gdsn(</pre>
   genofile, "sample.annot/pop.group")))
pop.level <- levels(pop.group)</pre>
diss <- snpgdsDiss(genofile)</pre>
hc <- snpgdsHCluster(diss)</pre>
# close the genotype file
snpgdsClose(genofile)
# cluster individuals
#
set.seed(100)
rv <- snpgdsCutTree(hc, label.H=TRUE, label.Z=TRUE)</pre>
# the distribution of Z scores
snpgdsDrawTree(rv, type="z-score", main="HapMap Phase II")
# draw dendrogram
snpgdsDrawTree(rv, main="HapMap Phase II",
   edgePar=list(col=rgb(0.5, 0.5, 0.5, 0.75), t.col="black"))
# or cluster individuals by ethnic information
rv2 <- snpgdsCutTree(hc, samp.group=pop.group)</pre>
# cluster individuals by Z score, specifying 'clust.count'
snpgdsDrawTree(rv2, rv$clust.count, main="HapMap Phase II",
   edgePar = list(col=rgb(0.5, 0.5, 0.5, 0.75), t.col="black"),
labels = c("YRI", "CHB/JPT", "CEU"), y.label=0.1)
legend("bottomleft", legend=levels(pop.group), col=1:nlevels(pop.group),
   pch=19, ncol=4, bg="white")
# zoom in ...
snpgdsDrawTree(rv2, rv$clust.count, dend.idx = c(1),
   main="HapMap Phase II -- YRI",
```

snpgdsDiss 21

```
edgePar=list(col=rgb(0.5,0.5,0.5, 0.75), t.col="black"),
    y.label.kinship=TRUE)

snpgdsDrawTree(rv2, rv$clust.count, dend.idx = c(2,2),
    main="HapMap Phase II -- CEU",
    edgePar=list(col=rgb(0.5,0.5,0.5, 0.75), t.col="black"),
    y.label.kinship=TRUE)

snpgdsDrawTree(rv2, rv$clust.count, dend.idx = c(2,1),
    main="HapMap Phase II -- CHB/JPT",
    edgePar=list(col=rgb(0.5,0.5,0.5, 0.75), t.col="black"),
    y.label.kinship=TRUE)
```

snpgdsDiss

Individual dissimilarity analysis

Description

Calculate the individual dissimilarities for each pair of individuals.

Usage

```
snpgdsDiss(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, num.thread=1, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
verbose	if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

snpgdsDiss() returns 1 -beta_ij which is formally described in Weir&Goudet (2017).

Value

Return a class "snpgdsDissClass":

```
sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis diss a matrix of individual dissimilarity
```

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Author(s)

Xiuwen Zheng

References

Zheng, Xiuwen. 2013. Statistical Prediction of HLA Alleles and Relatedness Analysis in Genome-Wide Association Studies. PhD dissertation, the department of Biostatistics, University of Washington.

Weir BS, Zheng X. SNPs and SNVs in Forensic Science. 2015. Forensic Science International: Genetics Supplement Series.

Weir BS, Goudet J. A Unified Characterization of Population Structure and Relatedness. Genetics. 2017 Aug;206(4):2085-2103. doi: 10.1534/genetics.116.198424.

See Also

snpgdsHCluster

Examples

 ${\tt snpgdsDrawTree}$

Draw a dendrogram

Description

To draw a dendrogram or the distribution of Z scores

snpgdsDrawTree 23

Usage

```
snpgdsDrawTree(obj, clust.count=NULL, dend.idx=NULL,
    type=c("dendrogram", "z-score"), yaxis.height=TRUE, yaxis.kinship=TRUE,
    y.kinship.baseline=NaN, y.label.kinship=FALSE, outlier.n=NULL,
    shadow.col=c(rgb(0.5, 0.5, 0.5, 0.25), rgb(0.5, 0.5, 0.5, 0.05)),
    outlier.col=rgb(1, 0.50, 0.50, 0.5), leaflab="none",
    labels=NULL, y.label=0.2, ...)
```

Arguments

obj an object returned by snpgdsCutTree clust.count the counts for clusters, drawing shadows

dend.idx the index of sub tree, plot obj\$dendrogram[[dend.idx]], or NULL for the whole

tree

type "dendrogram", draw a dendrogram; or "z-score", draw the distribution of Z score

yaxis.height if TRUE, draw the left Y axis: height of tree yaxis.kinship if TRUE, draw the right Y axis: kinship coefficient

y.kinship.baseline

the baseline value of kinship; if NaN, it is the height of the first split from top in

a dendrogram; only works when yaxis.kinship = TRUE

y.label.kinship

if TRUE, show 'PO/FS' etc on the right axis

outlier.n the cluster with size less than or equal to outlier.n is considered as outliers; if

NULL, let outlier.n = obj\$outlier.n

shadow.col two colors for shadow outlier.col the colors for outliers

leaflab a string specifying how leaves are labeled. The default "perpendicular" write

text vertically (by default). "textlike" writes text horizontally (in a rectangle),

and "none" suppresses leaf labels.

labels the legend for different regions

y.label y positions of labels

... Arguments to be passed to the method "plot(,...)", such as graphical param-

eters.

Details

The details will be described in future.

Value

None.

Author(s)

Xiuwen Zheng

See Also

snpgdsCutTree

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Examples

snpgdsEIGMIX

Eigen-analysis on SNP genotype data

Description

Eigen-analysis on IBD matrix based SNP genotypes.

Usage

```
snpgdsEIGMIX(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, num.thread=1L,
    eigen.cnt=32L, diagadj=TRUE, ibdmat=FALSE, verbose=TRUE)
## S3 method for class 'snpgdsEigMixClass'
plot(x, eig=c(1L,2L), ...)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome †
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically

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eigen.cnt output the number of eigenvectors; if eigen.cnt < 0, returns all eigenvectors; if eigen.cnt==0, no eigen calculation

TRUE for diagonal adjustment by default
ibdmat if TRUE, returns the IBD matrix
verbose if TRUE, show information

x a snpgdsEigMixClass object
eig indices of eigenvectors, like 1:2 or 1:4
... the arguments passed to or from other methods, like pch, col

Value

Return a snpgdsEigMixClass object, and it is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

eigenvect eigenvactors, "# of samples" x "eigen.cnt"

afreq allele frequencies

ibd the IBD matrix when ibdmat=TRUE

diagadj the argument diagadj

Author(s)

Xiuwen Zheng

References

Zheng X, Weir BS. Eigenanalysis on SNP Data with an Interpretation of Identity by Descent. Theoretical Population Biology. 2016 Feb;107:65-76. doi: 10.1016/j.tpb.2015.09.004

See Also

snpgdsAdmixProp, snpgdsAdmixPlot, snpgdsPCAS, snpgdsPCASNPLoading, snpgdsPCASampLoading, snpgdsPCASampLoadin

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

# get population information
# or pop_code <- scan("pop.txt", what=character())
# if it is stored in a text file "pop.txt"
pop_code <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))

# get sample id
samp.id <- read.gdsn(index.gdsn(genofile, "sample.id"))

# run eigen-analysis
RV <- snpgdsEIGMIX(genofile)

# eigenvalues
RV$eigenval</pre>
```

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```
# make a data.frame
tab <- data.frame(sample.id = samp.id, pop = factor(pop_code),</pre>
   EV1 = RV$eigenvect[,1],  # the first eigenvector
    EV2 = RV$eigenvect[,2],
                               # the second eigenvector
    stringsAsFactors = FALSE)
head(tab)
# draw
plot(tab$EV2, tab$EV1, col=as.integer(tab$pop),
    xlab="eigenvector 2", ylab="eigenvector 1")
legend("topleft", legend=levels(tab$pop), pch="o", col=1:4)
# define groups
groups <- list(CEU = samp.id[pop_code == "CEU"],</pre>
    YRI = samp.id[pop_code == "YRI"],
    CHB = samp.id[is.element(pop_code, c("HCB", "JPT"))])
prop <- snpgdsAdmixProp(RV, groups=groups)</pre>
plot(prop[, "YRI"], prop[, "CEU"], col=as.integer(tab$pop),
    xlab = "Admixture Proportion from YRI",
    ylab = "Admixture Proportion from CEU")
abline(v=0, col="gray25", lty=2)
abline(h=0, col="gray25", lty=2)
abline(a=1, b=-1, col="gray25", lty=2)
legend("topright", legend=levels(tab$pop), pch="o", col=1:4)
# close the genotype file
snpgdsClose(genofile)
```

snpgdsErrMsg

Get the last error information

Description

Return the last error message.

Usage

snpgdsErrMsg()

Value

Characters

Author(s)

Xiuwen Zheng

Examples

snpgdsErrMsg()

snpgdsExampleFileName Example GDS file

Description

Return the file name of example data

Usage

snpgdsExampleFileName()

Details

A GDS genotype file was created from a subset of HapMap Phase II dataset consisting of 270 individuals and duplicates.

Value

Characters

Author(s)

Xiuwen Zheng

Examples

snpgdsExampleFileName()

 ${\tt SNPGDSFileClass}$

SNPGDSFileClass

Description

A SNPGDSFileClass object provides access to a GDS file containing genome-wide SNP data. It extends the class gds.class in the gdsfmt package.

Author(s)

Xiuwen Zheng

See Also

snpgdsOpen, snpgdsClose

28 snpgdsFst

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
genofile

class(genofile)
# "SNPGDSFileClass" "gds.class"

# close the file
snpgdsClose(genofile)</pre>
```

snpgdsFst

F-statistics (fixation indices)

Description

Calculate relatedness measures F-statistics (also known as fixation indices) for given populations

Usage

```
snpgdsFst(gdsobj, population, method=c("W&C84", "W&H02"), sample.id=NULL,
    snp.id=NULL, autosome.only=TRUE, remove.monosnp=TRUE, maf=NaN,
    missing.rate=NaN, with.id=FALSE, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
population	a factor, indicating population information for each individual
method	"W&C84" – Fst estimator in Weir & Cockerham 1984 (by default), "W&H02" – relative beta estimator in Weir & Hill 2002, see details
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
with.id	if TRUE, the returned value with sample.id and sample.id
verbose	if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

The "W&H02" option implements the calculation in Buckleton et. al. 2016.

snpgdsFst 29

Value

Return a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

Fst weighted Fst estimate

MeanFst the average of Fst estimates across SNPs

FstSNP a vector of Fst for each SNP

Beta Beta matrix

Author(s)

Xiuwen Zheng

References

Weir, BS. & Cockerham, CC. Estimating F-statistics for the analysis of population structure. (1984).

Weir, BS. & Hill, WG. Estimating F-statistics. Annual review of genetics 36, 721-50 (2002).

Population-specific FST values for forensic STR markers: A worldwide survey. Buckleton J, Curran J, Goudet J, Taylor D, Thiery A, Weir BS. Forensic Sci Int Genet. 2016 Jul;23:91-100. doi: 10.1016/j.fsigen.2016.03.004.

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
group <- as.factor(read.gdsn(index.gdsn(</pre>
    genofile, "sample.annot/pop.group")))
# Fst estimation
v <- snpgdsFst(genofile, population=group, method="W&C84")</pre>
v$Fst
v$MeanFst
summary(v$FstSNP)
v \leftarrow snpgdsFst(genofile, population=group, method="W&H02")
v$Fst
v$MeanFst
v$Beta
summary(v$FstSNP)
# close the genotype file
snpgdsClose(genofile)
```

30 snpgdsGDS2BED

snpgdsGDS2BED Conversion from GDS to PLINK BED	
--	--

Description

Convert a GDS file to a PLINK binary ped (BED) file.

Usage

```
snpgdsGDS2BED(gdsobj, bed.fn, sample.id=NULL, snp.id=NULL, snpfirstdim=NULL,
    verbose=TRUE)
```

Arguments

gdsobj	an object of class ${\sf SNPGDSFileClass},$ a ${\sf SNP}$ GDS file; or characters, the file name of GDS
bed.fn	the file name of output, without the filename extension ".bed"
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc); if NULL, determine automatically
verbose	if TRUE, show information

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format used in the gdsfmt package.

BED – the PLINK binary ped format.

Value

None.

Author(s)

Xiuwen Zheng

References

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

http://corearray.sourceforge.net/

See Also

snpgdsBED2GDS, snpgdsGDS2PED

snpgdsGDS2Eigen 31

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
snpset <- snpgdsSelectSNP(genofile, missing.rate=0.95)
snpgdsGDS2BED(genofile, bed.fn="test", snp.id=snpset)
# close the genotype file
snpgdsClose(genofile)
# delete the temporary files
unlink(c("test.bed", "test.bim", "test.fam"), force=TRUE)</pre>
```

snpgdsGDS2Eigen

Conversion from GDS to Eigen (EIGENSTRAT)

Description

Convert a GDS file to an EIGENSTRAT file.

Usage

```
snpgdsGDS2Eigen(gdsobj, eigen.fn, sample.id=NULL, snp.id=NULL, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
eigen.fn	the file name of EIGENSTRAT
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
verbose	if TRUE, show information

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format used in the gdsfmt package.

Eigen – the text format used in EIGENSTRAT.

Value

None.

Author(s)

Xiuwen Zheng

32 snpgdsGDS2PED

References

Patterson N, Price AL, Reich D (2006) Population structure and eigenanalysis. PLoS Genetics 2:e190.

Price AL, Patterson NJ, Plenge RM, Weinblatt ME, Shadick NA, Reich D (2006) Principal components analysis corrects for stratification in genome-wide association studies. Nat Genet. 38, 904-909.

http://corearray.sourceforge.net/

See Also

```
snpgdsGDS2PED
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
snpset <- snpgdsSelectSNP(genofile, missing.rate=0.95)
snpgdsGDS2Eigen(genofile, eigen.fn="tmpeigen", snp.id=snpset)
# close the genotype file
snpgdsClose(genofile)
# delete the temporary files
unlink(c("tmpeigen.eigenstratgeno", "tmpeigen.ind", "tmpeigen.snp"), force=TRUE)</pre>
```

snpgdsGDS2PED

Conversion from GDS to PED

Description

Convert a GDS file to a PLINK text ped file.

Usage

```
snpgdsGDS2PED(gdsobj, ped.fn, sample.id=NULL, snp.id=NULL, use.snp.rsid=TRUE, format=c("A/G/C/T", "A/B", "1/2"), verbose=TRUE)\\
```

Arguments

gdsobj	a GDS file object (gds.class)
ped.fn	the file name of output
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
use.snp.rsid	if TRUE, use "snp.rs.id" instead of "snp.id" if available
format	specify the coding: "A/G/C/T" – allelic codes stored in "snp.allele" of the GDS file; "A/B" – A and B codes; " $1/2$ " – 1 and 2 codes
verbose	if TRUE, show information

snpgdsGEN2GDS 33

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format used in the gdsfmt package.

PED – the PLINK text ped format.

Value

None.

Author(s)

Xiuwen Zheng

References

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

```
http://corearray.sourceforge.net/
```

See Also

```
snpgdsGDS2BED
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
# GDS ==> PED
snpgdsGDS2PED(genofile, ped.fn="tmp")
# close the GDS file
snpgdsClose(genofile)
```

snpgdsGEN2GDS

Conversion from Oxford GEN format to GDS

Description

Convert an Oxford GEN file (text format) to a GDS file.

Usage

```
snpgdsGEN2GDS(gen.fn, sample.fn, out.fn, chr.code=NULL,
    call.threshold=0.9, version=c(">=2.0", "<=1.1.5"),
    snpfirstdim=FALSE, compress.annotation="ZIP_RA.max", compress.geno="",
    verbose=TRUE)</pre>
```

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Arguments

gen.fn the file name of Oxford GEN text file(s), it could be a vector indicate merging

all files

sample.fn the file name of sample annotation

out.fn the output GDS file

chr.code a vector of chromosome code according to gen.fn, indicating chromosomes. It

could be either numeric or character-type

call.threshold the threshold to determine missing genotypes

version either ">=2.0" or "<=1.1.5", see details

snpfirstdim if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs

for the first individual, and then list all SNPs for the second individual, etc)

compress.annotation

the compression method for the GDS variables, except "genotype"; optional

values are defined in the function add.gdsn

compress . geno the compression method for "genotype"; optional values are defined in the func-

tion add.gdsn

verbose if TRUE, show information

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format is used in the gdsfmt package.

NOTE: the sample file format (sample.fn) has changed with the release of SNPTEST v2. Specifically, the way in which covariates and phenotypes are coded on the second line of the header file has changed. version has to be specified, and the function uses ">=2.0" by default.

Value

Return the file name of GDS format with an absolute path.

Author(s)

Xiuwen Zheng

References

http://www.stats.ox.ac.uk/~marchini/software/gwas/file_format.html

See Also

```
snpgdsBED2GDS, snpgdsVCF2GDS
```

```
cat("running snpgdsGEN2GDS ...\n")
## Not run:
snpgdsGEN2GDS("test.gen", "test.sample", "output.gds", chr.code=1)
## End(Not run)
```

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annadaCa+Cana	To get a government attitue	
snpgdsGetGeno	To get a genotype matrix	

Description

To get a genotype matrix from a specified GDS file

Usage

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file; or characters to specify the file name of SNP GDS
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc); FALSE for snp-major mode; if NA, determine automatically
.snpread	internal use
with.id	if TRUE, return sample.id and snp.id
verbose	if TRUE, show information

Value

The function returns an integer matrix with values 0, 1, 2 or NA representing the number of reference allele when with.id=FALSE; or list(genotype, sample.id, snp.id) when with.id=TRUE. The orders of sample and SNP IDs in the genotype matrix are actually consistent with sample.id and snp.id in the GDS file, which may not be as the same as the arguments sampel.id and snp.id specified by users.

Author(s)

Xiuwen Zheng

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
set.seed(1000)
snpset <- sample(read.gdsn(index.gdsn(genofile, "snp.id")), 1000)
mat1 <- snpgdsGetGeno(genofile, snp.id=snpset, snpfirstdim=TRUE)
dim(mat1)
# 1000 279
table(c(mat1), exclude=NULL)
mat2 <- snpgdsGetGeno(genofile, snp.id=snpset, snpfirstdim=FALSE)</pre>
```

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```
dim(mat2)
# 279 1000
table(c(mat2), exclude=NULL)
identical(t(mat1), mat2)
# TRUE
# close the file
snpgdsClose(genofile)
```

snpgdsGRM

Genetic Relationship Matrix (GRM) for SNP genotype data

Description

Calculate Genetic Relationship Matrix (GRM) using SNP genotype data.

Usage

```
snpgdsGRM(gdsobj, sample.id=NULL, snp.id=NULL,
   autosome.only=TRUE, remove.monosnp=TRUE, maf=NaN, missing.rate=NaN,
   method=c("GCTA", "Eigenstrat", "EIGMIX", "Weighted", "Corr", "IndivBeta"),
   num.thread=1L, useMatrix=FALSE, out.fn=NULL, out.prec=c("double", "single"),
   out.compress="LZMA_RA", with.id=TRUE, verbose=TRUE)
```

Arguments

out.compress
with.id

verbose

an object of class SNPGDSFileClass, a SNP GDS file gdsobj sample.id a vector of sample id specifying selected samples; if NULL, all samples are used a vector of snp id specifying selected SNPs; if NULL, all SNPs are used snp.id if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep autosome.only SNPs according to the specified chromosome remove.monosnp if TRUE, remove monomorphic SNPs to use the SNPs with ">= maf" only; if NaN, no MAF threshold maf missing.rate to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold method "GCTA" – genetic relationship matrix defined in CGTA; "Eigenstrat" – genetic covariance matrix in EIGENSTRAT; "EIGMIX" - two times coancestry matrix defined in Zheng&Weir (2016), "Weighted" - weighted GCTA, as the same as "EIGMIX", "Corr" - Scaled GCTA GRM (dividing each i,j element by the product of the square root of the i,i and j,j elements), "IndivBeta" – two times individual beta estimate relative to the minimum of beta; see details num.thread the number of (CPU) cores used; if NA, detect the number of cores automatically useMatrix if TRUE, use Matrix::dspMatrix to store the output square matrix to save memory out.fn NULL for no GDS output, or a file name double or single precision for storage out.prec

the compression method for storing the GRM matrix in the GDS file

if TRUE, the returned value with sample.id and sample.id

if TRUE, show information

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Details

"GCTA": the genetic relationship matrix in GCTA is defined as $G_{ij} = avg_{l} [(g_{il} - 2*p_{l})*(g_{jl} - 2*p_{l}) / 2*p_{l}*(1 - p_{l})]$ for individuals i,j and locus l;

"Eigenstrat": the genetic covariance matrix in EIGENSTRAT $G_{ij} = avg_{l} [(g_{il} - 2*p_{l})*(g_{jl} - 2*p_{l}) / 2*p_{l}*(1 - p_{l})]$ for individuals i,j and locus l; the missing genotype is imputed by the dosage mean of that locus.

"EIGMIX" / "Weighted": it is the same as '2 * snpgdsEIGMIX(, ibdmat=TRUE, diagadj=FALSE)\$ibd': \$G_ij = [sum_l (g_il - 2*p_l)*(g_jl - 2*p_l)] / [sum_l 2*p_l*(1 - p_l)]\$ for individuals i,j and locus l:

"IndivBeta": 'beta = snpgdsIndivBeta(, inbreeding=TRUE)' (Weir&Goudet, 2017), and beta-based GRM is \$grm_ij = 2 * (beta_ij - beta_min) / (1 - beta_min)\$ for \$i!=j\$, \$grm_ij = 1 + (beta_i - beta_min) / (1 - beta_min)\$ for \$i=j\$. It is relative to the minimum value of beta estimates.

Value

Return a list if with.id = TRUE:

sample.id the sample ids used in the analysis
snp.id the SNP ids used in the analysis
method characters, the method used

grm the genetic relationship matrix; different methods might have different meanings

and interpretation for estimates

If with.id = FALSE, this function returns the genetic relationship matrix (GRM) without sample and SNP IDs.

Author(s)

Xiuwen Zheng

References

Patterson, N., Price, A. L. & Reich, D. Population structure and eigenanalysis. PLoS Genet. 2, e190 (2006).

Yang, J., Lee, S. H., Goddard, M. E. & Visscher, P. M. GCTA: a tool for genome-wide complex trait analysis. American journal of human genetics 88, 76-82 (2011).

Zheng X, Weir BS. Eigenanalysis on SNP Data with an Interpretation of Identity by Descent. Theoretical Population Biology. 2016 Feb;107:65-76. doi: 10.1016/j.tpb.2015.09.004

Weir BS, Zheng X. SNPs and SNVs in Forensic Science. Forensic Science International: Genetics Supplement Series. 2015. doi:10.1016/j.fsigss.2015.09.106

Weir BS, Goudet J. A Unified Characterization of Population Structure and Relatedness. Genetics. 2017 Aug;206(4):2085-2103. doi: 10.1534/genetics.116.198424.

See Also

snpgdsPCA, snpgdsEIGMIX, snpgdsIndivBeta, snpgdsIndInb, snpgdsFst, snpgdsMergeGRM

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Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

rv <- snpgdsGRM(genofile, method="GCTA")
eig <- eigen(rv$grm) # Eigen-decomposition

# output to a GDS file
snpgdsGRM(genofile, method="GCTA", out.fn="test.gds")

pop <- factor(read.gdsn(index.gdsn(genofile, "sample.annot/pop.group")))
plot(eig$vectors[,1], eig$vectors[,2], col=pop)
legend("topleft", legend=levels(pop), pch=19, col=1:4)

# close the file
snpgdsClose(genofile)

# delete the temporary file
unlink("test.gds", force=TRUE)</pre>
```

snpgdsHCluster

Hierarchical cluster analysis

Description

Perform hierarchical cluster analysis on the dissimilarity matrix.

Usage

```
snpgdsHCluster(dist, sample.id=NULL, need.mat=TRUE, hang=0.25)
```

Arguments

dist an object of "snpgdsDissClass" from snpgdsDiss, an object of "snpgdsIBSClass" from snpgdsIBS, or a square matrix for dissimilarity
sample.id to specify sample id, only work if dist is a matrix
need.mat if TRUE, store the dissimilarity matrix in the result
hang The fraction of the plot height by which labels should hang below the rest of the

plot. A negative value will cause the labels to hang down from 0.

Details

Call the function hclust to perform hierarchical cluster analysis, using method="average".

Value

```
Return a list (class "snpgdsHCClass"):
```

sample.id the sample ids used in the analysis hclust an object returned from hclust

dendrogram

dist the dissimilarity matrix, if need.mat = TRUE

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Author(s)

Xiuwen Zheng

See Also

```
snpgdsIBS, snpgdsDiss, snpgdsCutTree
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
pop.group <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))</pre>
pop.group <- as.factor(pop.group)</pre>
pop.level <- levels(pop.group)</pre>
diss <- snpgdsDiss(genofile)</pre>
hc <- snpgdsHCluster(diss)</pre>
rv <- snpgdsCutTree(hc)</pre>
rv
# call 'plot' to draw a dendrogram
plot(rv$dendrogram, leaflab="none", main="HapMap Phase II")
# the distribution of Z scores
snpgdsDrawTree(rv, type="z-score", main="HapMap Phase II")
# draw dendrogram
snpgdsDrawTree(rv, main="HapMap Phase II",
    edgePar=list(col=rgb(0.5,0.5,0.5, 0.75), t.col="black"))
# close the file
snpgdsClose(genofile)
```

snpgdsHWE

Statistical test of Hardy-Weinberg Equilibrium

Description

Calculate the p-values for the exact SNP test of Hardy-Weinberg Equilibrium.

Usage

```
snpgdsHWE(gdsobj, sample.id=NULL, snp.id=NULL, with.id=FALSE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples will be used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs will be used
with.id	if TRUE, the returned value with sample and SNP IDs

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Value

If with.id=FALSE, return a vector of numeric values (p-value); otherwise, return a list with three components "pvalue", "sample.id" and "snp.id".

Author(s)

Xiuwen Zheng, Janis E. Wigginton

References

Wigginton, J. E., Cutler, D. J. & Abecasis, G. R. A note on exact tests of Hardy-Weinberg equilibrium. Am. J. Hum. Genet. 76, 887-93 (2005).

See Also

```
snpgdsSNPRateFreq
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# Japanese samples
sample.id <- read.gdsn(index.gdsn(genofile, "sample.id"))</pre>
pop <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))</pre>
(samp.sel <- sample.id[pop=="JPT"])</pre>
samp.sel <- samp.sel[nchar(samp.sel) == 7]</pre>
# chromosome 1
snp.id <- snpgdsSelectSNP(genofile, sample.id=samp.sel, autosome.only=1L)</pre>
p <- snpgdsHWE(genofile, sample.id=samp.sel, snp.id=snp.id)</pre>
summary(p)
# QQ plot
plot(-log10((1:length(p))/length(p)), -log10(p[order(p)]),
xlab="-log10(expected P)", ylab="-log10(observed P)", main="QQ plot")
abline(a=0, b=1, col="blue")
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIBDKING

KING method of moment for the identity-by-descent (IBD) analysis

Description

Calculate IBD coefficients by KING method of moment.

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Usage

```
snpgdsIBDKING(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN,
    type=c("KING-robust", "KING-homo"), family.id=NULL, num.thread=1L,
    useMatrix=FALSE, verbose=TRUE)
```

Arguments

an object of class SNPGDSFileClass, a SNP GDS file gdsobj sample.id a vector of sample id specifying selected samples; if NULL, all samples are used a vector of snp id specifying selected SNPs; if NULL, all SNPs are used snp.id if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep autosome.only SNPs according to the specified chromosome remove.monosnp if TRUE, remove monomorphic SNPs to use the SNPs with ">= maf" only; if NaN, no MAF threshold missing.rate to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold "KING-robust" - relationship inference in the presence of population stratifitype cation; "KING-homo" – relationship inference in a homogeneous population family.id if NULL, all individuals are treated as singletons; if family id is given, withinand between-family relationship are estimated differently. If sample.id=NULL, family.id should have the same length as "sample.id" in the GDS file, otherwise family.id should have the same length and order as the argument sample.id num.thread the number of (CPU) cores used; if NA, detect the number of cores automatically useMatrix if TRUE, use Matrix::dspMatrix to store the output square matrix to save mem-

ory

verbose if TRUE, show information

Details

KING IBD estimator is a moment estimator, and it is computationally efficient relative to MLE method. The approaches include "KING-robust" – robust relationship inference within or across families in the presence of population substructure, and "KING-homo" – relationship inference in a homogeneous population.

With "KING-robust", the function would return the proportion of SNPs with zero IBS (IBS0) and kinship coefficient (kinship). With "KING-homo" it would return the probability of sharing one IBD (k1) and the probability of sharing zero IBD (k0).

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

Value

Return a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

k0 IBD coefficient, the probability of sharing zero IBD k1 IBD coefficient, the probability of sharing one IBD

IBS0 proportion of SNPs with zero IBS

kinship the estimated kinship coefficients, if the parameter kinship=TRUE

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Author(s)

Xiuwen Zheng

References

Manichaikul A, Mychaleckyj JC, Rich SS, Daly K, Sale M, Chen WM. Robust relationship inference in genome-wide association studies. Bioinformatics. 2010 Nov 15;26(22):2867-73.

See Also

```
snpgdsIBDMLE, snpgdsIBDMoM
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# CEU population
samp.id <- read.gdsn(index.gdsn(genofile, "sample.id"))</pre>
CEU.id <- samp.id[</pre>
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="CEU"]
#### KING-robust:
\#\#\# relationship inference in the presence of population stratification
####
                    robust relationship inference across family
ibd.robust <- snpgdsIBDKING(genofile, sample.id=CEU.id)</pre>
names(ibd.robust)
# [1] "sample.id" "snp.id"
                               "afreq"
                                            "IBS0"
                                                         "kinship"
# select a set of pairs of individuals
dat <- snpgdsIBDSelection(ibd.robust, 1/32)</pre>
head(dat)
plot(dat$IBS0, dat$kinship, xlab="Proportion of Zero IBS",
    ylab="Estimated Kinship Coefficient (KING-robust)")
# using Matrix
ibd.robust <- snpgdsIBDKING(genofile, sample.id=CEU.id, useMatrix=TRUE)</pre>
is(ibd.robust$IBS0) # dspMatrix
is(ibd.robust$kinship) # dspMatrix
#### KING-robust:
#### relationship inference in the presence of population stratification
####
                   within- and between-family relationship inference
# incorporate with pedigree information
family.id <- read.gdsn(index.gdsn(genofile, "sample.annot/family.id"))</pre>
family.id <- family.id[match(CEU.id, samp.id)]</pre>
ibd.robust2 <- snpgdsIBDKING(genofile, sample.id=CEU.id, family.id=family.id)</pre>
```

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```
names(ibd.robust2)
# select a set of pairs of individuals
dat <- snpgdsIBDSelection(ibd.robust2, 1/32)</pre>
head(dat)
plot(dat$IBS0, dat$kinship, xlab="Proportion of Zero IBS",
    ylab="Estimated Kinship Coefficient (KING-robust)")
#### KING-homo: relationship inference in a homogeneous population
ibd.homo <- snpgdsIBDKING(genofile, sample.id=CEU.id, type="KING-homo")</pre>
names(ibd.homo)
# "sample.id" "snp.id"
                                       "k0"
                                                    "k1"
                           "afreg"
# select a subset of pairs of individuals
dat <- snpgdsIBDSelection(ibd.homo, 1/32)</pre>
head(dat)
plot(dat$k0, dat$kinship, xlab="Pr(IBD=0)",
    ylab="Estimated Kinship Coefficient (KING-homo)")
# using Matrix
ibd.homo <- snpgdsIBDKING(genofile, sample.id=CEU.id, type="KING-homo",</pre>
    useMatrix=TRUE)
is(ibd.homo$k0) # dspMatrix
is(ibd.homo$k1) # dspMatrix
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIBDMLE

Maximum likelihood estimation (MLE) for the Identity-By-Descent (IBD) Analysis

Description

Calculate the three IBD coefficients (k0, k1, k2) for non-inbred individual pairs by Maximum Likelihood Estimation.

Usage

```
snpgdsIBDMLE(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, kinship=FALSE,
    kinship.constraint=FALSE, allele.freq=NULL,
    method=c("EM", "downhill.simplex", "Jacquard"), max.niter=1000L,
    reltol=sqrt(.Machine$double.eps), coeff.correct=TRUE,
    out.num.iter=TRUE, num.thread=1, verbose=TRUE)
```

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Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file

sample.id a vector of sample id specifying selected samples; if NULL, all samples are used

snp.id a vector of snp id specifying selected SNPs; if NULL, all SNPs are used

autosome.only if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep

SNPs according to the specified chromosome

remove.monosnp if TRUE, remove monomorphic SNPs

maf to use the SNPs with ">= maf" only; if NaN, no any MAF threshold

missing.rate to use the SNPs with "<= missing.rate" only; if NaN, no any missing threshold

kinship if TRUE, output the estimated kinship coefficients

kinship.constraint

if TRUE, constrict IBD coefficients (\$k_0,k_1,k_2\$) in the geneloical region

 $(\$2 k_0 k_1 >= k_2^2)$

allele.freq to specify the allele frequencies; if NULL, determine the allele frequencies from

gdsobj using the specified samples; if snp. id is specified, allele.freq should

have the same order as snp.id

method "EM", "downhill.simplex", "Jacquard", see details

max.niter the maximum number of iterations

relative convergence tolerance; the algorithm stops if it is unable to reduce the

value of log likelihood by a factor of \$reltol * (abs(log likelihood with the initial

parameters) + reltol)\$ at a step.

coeff.correct TRUE by default, see details

out.num.iter if TRUE, output the numbers of iterations

num. thread the number of (CPU) cores used; if NA, detect the number of cores automatically

verbose if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

The PLINK moment estimates are used as the initial values in the algorithm of searching maximum value of log likelihood function. Two numeric approaches can be used: one is Expectation-Maximization (EM) algorithm, and the other is Nelder-Mead method or downhill simplex method. Generally, EM algorithm is more robust than downhill simplex method. "Jacquard" refers to the estimation of nine Jacquard's coefficients.

If coeff.correct is TRUE, the final point that is found by searching algorithm (EM or downhill simplex) is used to compare the six points (fullsib, offspring, halfsib, cousin, unrelated), since any numeric approach might not reach the maximum position after a finit number of steps. If any of these six points has a higher value of log likelihood, the final point will be replaced by the best one.

Although MLE estimates are more reliable than MoM, MLE is much more computationally intensive than MoM, and might not be feasible to estimate pairwise relatedness for a large dataset.

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Value

Return a snpgdsIBDClass object, which is a list:

sample.id the sample ids used in the analysis

snp.id the SNP ids used in the analysis

afreq the allele frequencies used in the analysis

k0 IBD coefficient, the probability of sharing ZERO IBD, if method="EM" or "downhill.simplex"

k1 IBD coefficient, the probability of sharing ONE IBD, if method="EM" or "downhill.simplex"

D1, ..., D8 Jacquard's coefficients, if method="Jacquard", D9 = 1 - D1 - ... - D8

the estimated kinship coefficients, if the parameter kinship=TRUE

Author(s)

Xiuwen Zheng

kinship

References

Milligan BG. 2003. Maximum-likelihood estimation of relatedness. Genetics 163:1153-1167.

Weir BS, Anderson AD, Hepler AB. 2006. Genetic relatedness analysis: modern data and new challenges. Nat Rev Genet. 7(10):771-80.

Choi Y, Wijsman EM, Weir BS. 2009. Case-control association testing in the presence of unknown relationships. Genet Epidemiol 33(8):668-78.

Jacquard, A. Structures Genetiques des Populations (Masson & Cie, Paris, 1970); English translation available in Charlesworth, D. & Chalesworth, B. Genetics of Human Populations (Springer, New York, 1974).

See Also

```
snpgdsIBDMLELogLik, snpgdsIBDMoM
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]
YRI.id <- YRI.id[1:30]

# SNP pruning
set.seed(10)
snpset <- snpgdsLDpruning(genofile, sample.id=YRI.id, maf=0.05,
    missing.rate=0.05)
snpset <- sample(unlist(snpset), 250)
mibd <- snpgdsIBDMLE(genofile, sample.id=YRI.id, snp.id=snpset)
names(mibd)

# select a set of pairs of individuals
d <- snpgdsIBDSelection(mibd, kinship.cutoff=1/8)
head(d)</pre>
```

```
# log likelihood
loglik <- snpgdsIBDMLELogLik(genofile, mibd)</pre>
loglik 0 <- snpgdsIBDMLELogLik (genofile, mibd, relatedness="unrelated") \\
# likelihood ratio test
p.value <- pchisq(loglik - loglik0, 1, lower.tail=FALSE)</pre>
flag <- lower.tri(mibd$k0)</pre>
plot(NaN, xlim=c(0,1), ylim=c(0,1), xlab="k0", ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(mibd$k0[flag], mibd$k1[flag])
# specify the allele frequencies
afreq <- snpgdsSNPRateFreq(genofile, sample.id=YRI.id,</pre>
    snp.id=snpset)$AlleleFreq
subibd <- snpgdsIBDMLE(genofile, sample.id=YRI.id[1:25], snp.id=snpset,</pre>
    allele.freq=afreq)
summary(c(subibd\$k0 - mibd\$k0[1:25, 1:25]))
summary(c(subibd$k1 - mibd$k1[1:25, 1:25]))
# ZERO
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIBDMLELogLik

Log likelihood for MLE method in the Identity-By-Descent (IBD) Analysis

Description

Calculate the log likelihood values from maximum likelihood estimation.

Usage

Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file
ibdobj the snpgdsIBDClass object returned from snpgdsIBDMLE
k0 specified IBD coefficient
k1 specified IBD coefficient
relatedness specify a relatedness, otherwise use the values of k0 and k1

Details

If (relatedness == "") and (k0 == NaN or k1 == NaN), then return the log likelihood values for each (k0, k1) stored in ibdobj. \ If (relatedness == "") and (k0 != NaN) and (k1 != NaN), then return the log likelihood values for a specific IBD coefficient (k0, k1). \ If relatedness is: "self", then k0 = 0, k1 = 0; "fullsib", then k0 = 0.25, k1 = 0.5; "offspring", then k0 = 0, k1 = 1; "halfsib", then k0 = 0.5, k1 = 0.5; "cousin", then k0 = 0.75, k1 = 0.25; "unrelated", then k0 = 1, k1 = 0.

Value

Return a n-by-n matrix of log likelihood values, where n is the number of samples.

Author(s)

Xiuwen Zheng

References

Milligan BG. 2003. Maximum-likelihood estimation of relatedness. Genetics 163:1153-1167.

Weir BS, Anderson AD, Hepler AB. 2006. Genetic relatedness analysis: modern data and new challenges. Nat Rev Genet. 7(10):771-80.

Choi Y, Wijsman EM, Weir BS. 2009. Case-control association testing in the presence of unknown relationships. Genet Epidemiol 33(8):668-78.

See Also

```
snpgdsIBDMLE, snpgdsIBDMoM
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[</pre>
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]
YRI.id <- YRI.id[1:30]</pre>
# SNP pruning
set.seed(10)
snpset <- snpgdsLDpruning(genofile, sample.id=YRI.id, maf=0.05,</pre>
    missing.rate=0.05)
snpset <- sample(unlist(snpset), 250)</pre>
mibd <- snpgdsIBDMLE(genofile, sample.id=YRI.id, snp.id=snpset)</pre>
# select a set of pairs of individuals
d <- snpgdsIBDSelection(mibd, kinship.cutoff=1/8)</pre>
head(d)
# log likelihood
loglik <- snpgdsIBDMLELogLik(genofile, mibd)</pre>
loglik0 <- snpgdsIBDMLELogLik(genofile, mibd, relatedness="unrelated")</pre>
# likelihood ratio test
```

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```
p.value <- pchisq(loglik - loglik0, 1, lower.tail=FALSE)</pre>
flag <- lower.tri(mibd$k0)</pre>
plot(NaN, xlim=c(0,1), ylim=c(0,1), xlab="k0", ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(mibd$k0[flag], mibd$k1[flag])
# specify the allele frequencies
afreq <- snpgdsSNPRateFreq(genofile, sample.id=YRI.id,</pre>
    snp.id=snpset)$AlleleFreq
subibd <- snpgdsIBDMLE(genofile, sample.id=YRI.id[1:25], snp.id=snpset,</pre>
    allele.freq=afreq)
summary(c(subibd$k0 - mibd$k0[1:25, 1:25]))
# ZERO
summary(c(subibd$k1 - mibd$k1[1:25, 1:25]))
# ZERO
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIBDMoM

PLINK method of moment (MoM) for the Identity-By-Descent (IBD) Analysis

Description

Calculate three IBD coefficients for non-inbred individual pairs by PLINK method of moment (MoM).

Usage

```
snpgdsIBDMoM(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, allele.freq=NULL,
    kinship=FALSE, kinship.constraint=FALSE, num.thread=1L, useMatrix=FALSE,
    verbose=TRUE)
```

Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file sample.id a vector of sample id specifying selected samples; if NULL, all samples are used snp.id a vector of snp id specifying selected SNPs; if NULL, all SNPs are used if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep autosome.only SNPs according to the specified chromosome remove.monosnp if TRUE, remove monomorphic SNPs maf to use the SNPs with ">= maf" only; if NaN, no MAF threshold to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold missing.rate to specify the allele frequencies; if NULL, determine the allele frequencies from allele.freq gdsobj using the specified samples; if snp. id is specified, allele. freq should have the same order as snp.id

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kinship if TRUE, output the estimated kinship coefficients

kinship.constraint

if TRUE, constrict IBD coefficients (\$k_0,k_1,k_2\$) in the geneloical region

 $(\$2 k_0 k_1 >= k_2^2)$

 $\hbox{num. thread} \qquad \quad \hbox{the number of (CPU) cores used; if NA, detect the number of cores automatically}$

useMatrix if TRUE, use Matrix::dspMatrix to store the output square matrix to save mem-

ory

verbose if TRUE, show information

Details

PLINK IBD estimator is a moment estimator, and it is computationally efficient relative to MLE method. In the PLINK method of moment, a correction factor based on allele counts is used to adjust for sampling. However, if allele frequencies are specified, no correction factor is conducted since the specified allele frequencies are assumed to be known without sampling.

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

Value

Return a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

k0 IBD coefficient, the probability of sharing ZERO IBDk1 IBD coefficient, the probability of sharing ONE IBD

kinship the estimated kinship coefficients, if the parameter kinship=TRUE

Author(s)

Xiuwen Zheng

References

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

See Also

```
snpgdsIBDMLE, snpgdsIBDMLELogLik
```

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```
pibd <- snpgdsIBDMoM(genofile, sample.id=CEU.id)</pre>
names(pibd)
flag <- lower.tri(pibd$k0)</pre>
plot(NaN, xlim=c(0,1), ylim=c(0,1), xlab="k0", ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(pibd$k0[flag], pibd$k1[flag])
# select a set of pairs of individuals
d <- snpgdsIBDSelection(pibd, kinship.cutoff=1/8)</pre>
head(d)
# YRI population
YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[</pre>
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]
pibd <- snpgdsIBDMoM(genofile, sample.id=YRI.id)</pre>
flag <- lower.tri(pibd$k0)</pre>
plot(NaN, xlim=c(0,1), ylim=c(0,1), xlab="k0", ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(pibd$k0[flag], pibd$k1[flag])
# specify the allele frequencies
afreq <- snpgdsSNPRateFreq(genofile, sample.id=YRI.id)$AlleleFreq</pre>
\verb| aibd <- snpgdsIBDMoM(genofile, sample.id=YRI.id, allele.freq=afreq)| \\
flag <- lower.tri(aibd$k0)</pre>
plot(NaN, \ xlim=c(0,1), \ ylim=c(0,1), \ xlab="k0", \ ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(aibd$k0[flag], aibd$k1[flag])
# analysis on a subset
subibd <- snpgdsIBDMoM(genofile, sample.id=YRI.id[1:25], allele.freq=afreq)</pre>
summary(c(subibd$k0 - aibd$k0[1:25, 1:25]))
# ZERO
summary(c(subibd$k1 - aibd$k1[1:25, 1:25]))
# ZERO
# close the genotype file
snpgdsClose(genofile)
```

 ${\tt snpgdsIBDSelection}$

Get a table of IBD coefficients

Description

Return a data frame with IBD coefficients.

Usage

```
snpgdsIBDSelection(ibdobj, kinship.cutoff=NaN, samp.sel=NULL)
```

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Arguments

ibdobj an object of snpgdsIBDClass returned by snpgdsIBDMLE or snpgdsIBDMoM
kinship.cutoff select the individual pairs with kinship coefficients >= kinship.cutoff; no filter if kinship.cutoff = NaN
samp.sel a logical vector or integer vector to specify selection of samples

Value

Return a data.frame:

ID1 the id of the first individual
 ID2 the id of the second individual
 k0 the probability of sharing ZERO alleles
 k1 the probability of sharing ONE alleles

kinship kinship coefficient

Author(s)

Xiuwen Zheng

See Also

snpgdsIBDMLE, snpgdsIBDMoM, snpgdsIBDKING

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# YRI population
YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[</pre>
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]
pibd <- snpgdsIBDMoM(genofile, sample.id=YRI.id)</pre>
flag <- lower.tri(pibd$k0)</pre>
plot(NaN, xlim=c(0,1), ylim=c(0,1), xlab="k0", ylab="k1")
lines(c(0,1), c(1,0), col="red", lty=3)
points(pibd$k0[flag], pibd$k1[flag])
# close the genotype file
snpgdsClose(genofile)
# IBD coefficients
dat <- snpgdsIBDSelection(pibd, 1/32)</pre>
head(dat)
                              k0
# 1 NA19152 NA19154 0.010749154 0.9892508 0.24731271
# 2 NA19152 NA19093 0.848207777 0.1517922 0.03794806
# 3 NA19139 NA19138 0.010788047 0.9770181 0.25035144
# 4 NA19139 NA19137 0.012900661 0.9870993 0.24677483
# 5 NA18912 NA18914 0.008633077 0.9913669 0.24784173
# 6 NA19160 NA19161 0.008635754 0.9847777 0.24948770
```

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snpgdsIBS	Identity-By-State (IBS) proportion

Description

Calculate the fraction of identity by state for each pair of samples

Usage

```
snpgdsIBS(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, num.thread=1L,
    useMatrix=FALSE, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome †
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
useMatrix	if TRUE, use ${\tt Matrix::dspMatrix}$ to store the output square matrix to save memory
verbose	if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

The values of the IBS matrix range from ZERO to ONE.

Return a list (class "snpgdsIBSClass"):

Value

```
sample.id the sample ids used in the analysis
snp.id the SNP ids used in the analysis
ibs a matrix of IBS proportion, "# of samples" x "# of samples"
```

Author(s)

Xiuwen Zheng

See Also

```
snpgdsIBSNum
```

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Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

# perform identity-by-state calculations
ibs <- snpgdsIBS(genofile)

# perform multidimensional scaling analysis on
# the genome-wide IBS pairwise distances:
loc <- cmdscale(1 - ibs$ibs, k = 2)
x <- loc[, 1]; y <- loc[, 2]
race <- as.factor(read.gdsn(index.gdsn(genofile, "sample.annot/pop.group")))
plot(x, y, col=race, xlab = "", ylab = "", main = "cmdscale(IBS Distance)")
legend("topleft", legend=levels(race), text.col=1:nlevels(race))

# close the file
snpgdsClose(genofile)</pre>
```

 ${\tt snpgdsIBSNum}$

Identity-By-State (IBS)

Description

Calculate the number of SNPs for identity by state for each pair of samples.

Usage

```
snpgdsIBSNum(gdsobj, sample.id = NULL, snp.id = NULL, autosome.only = TRUE,
    remove.monosnp = TRUE, maf = NaN, missing.rate = NaN, num.thread = 1L,
    verbose = TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome †
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically $% \left(\frac{1}{2}\right) =\frac{1}{2}\left(\frac{1}{2$
verbose	if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

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Value

Return a list (n is the number of samples):

```
sample.id the sample ids used in the analysis
snp.id the SNP ids used in the analysis
ibs0 a n-by-n matrix, the number of SNPs sharing 0 IBS
ibs1 a n-by-n matrix, the number of SNPs sharing 1 IBS
ibs2 a n-by-n matrix, the number of SNPs sharing 2 IBS
```

Author(s)

Xiuwen Zheng

See Also

```
snpgdsIBS
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

RV <- snpgdsIBSNum(genofile)
pop <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))
L <- order(pop)
image(RV$ibs0[L, L]/length(RV$snp.id))

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsIndInb

Individual Inbreeding Coefficients

Description

To calculate individual inbreeding coefficients using SNP genotype data

Usage

```
snpgdsIndInb(gdsobj, sample.id=NULL, snp.id=NULL,
  autosome.only=TRUE, remove.monosnp=TRUE, maf=NaN, missing.rate=NaN,
  method=c("mom.weir", "mom.visscher", "mle", "gcta1", "gcta2", "gcta3"),
  allele.freq=NULL, out.num.iter=TRUE, reltol=.Machine$double.eps^0.75,
  verbose=TRUE)
```

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Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
method	see details
allele.freq	to specify the allele frequencies; if NULL, the allele frequencies are estimated from the given samples
out.num.iter	output the numbers of iterations
reltol	relative convergence tolerance used in MLE; the algorithm stops if it is unable to reduce the value of log likelihood by a factor of \$reltol * (abs(log likelihood with the initial parameters) + reltol)\$ at a step.
verbose	if TRUE, show information

Details

The method can be: "mom.weir": a modified Visscher's estimator, proposed by Bruce Weir; "mom.visscher": Visscher's estimator described in Yang et al. (2010); "mle": the maximum likelihood estimation; "gcta1": F^I in GCTA, avg [(g_i - 2p_i)^2 / (2*p_i*(1-p_i)) - 1]; "gcta2": F^II in GCTA, avg [1 - g_i*(2 - g_i) / (2*p_i*(1-p_i))]; "gcta3": F^III in GCTA, the same as "mom.visscher", avg [g_i^2 - (1 + 2p_i)*g_i + 2*p_i^2] / (2*p_i*(1-p_i)).

Value

Return estimated inbreeding coefficient.

Author(s)

Xiuwen Zheng

References

Yang J, Benyamin B, McEvoy BP, Gordon S, Henders AK, Nyholt DR, Madden PA, Heath AC, Martin NG, Montgomery GW, Goddard ME, Visscher PM. 2010. Common SNPs explain a large proportion of the heritability for human height. Nat Genet. 42(7):565-9. Epub 2010 Jun 20.

Yang, J., Lee, S. H., Goddard, M. E. & Visscher, P. M. GCTA: a tool for genome-wide complex trait analysis. American journal of human genetics 88, 76-82 (2011).

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

rv <- snpgdsIndInb(genofile, method="mom.visscher")
head(rv$inbreeding)
summary(rv$inbreeding)</pre>
```

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```
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIndInbCoef

Individual Inbreeding Coefficient

Description

To calculate an individual inbreeding coefficient using SNP genotype data

Usage

```
snpgdsIndInbCoef(x, p, method = c("mom.weir", "mom.visscher", "mle"),
    reltol=.Machine$double.eps^0.75)
```

Arguments

x SNP genotypes

p allele frequencies

method see details

relative convergence tolerance used in MLE; the algorithm stops if it is unable

to reduce the value of log likelihood by a factor of \$reltol * (abs(log likelihood

with the initial parameters) + reltol)\$ at a step.

Details

The method can be: "mom.weir": a modified Visscher's estimator, proposed by Bruce Weir; "mom.visscher": Visscher's estimator described in Yang et al. (2010); "mle": the maximum likelihood estimation.

Value

Return estimated inbreeding coefficient.

Author(s)

Xiuwen Zheng

References

Yang J, Benyamin B, McEvoy BP, Gordon S, Henders AK, Nyholt DR, Madden PA, Heath AC, Martin NG, Montgomery GW, Goddard ME, Visscher PM. 2010. Common SNPs explain a large proportion of the heritability for human height. Nat Genet. 42(7):565-9. Epub 2010 Jun 20.

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Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
chr1 <- read.gdsn(index.gdsn(genofile, "snp.id"))[</pre>
    read.gdsn(index.gdsn(genofile, "snp.chromosome"))==1]
chr1idx <- match(chr1, read.gdsn(index.gdsn(genofile, "snp.id")))</pre>
AF <- snpgdsSNPRateFreq(genofile)
g \leftarrow read.gdsn(index.gdsn(genofile, "genotype"), start=c(1,1), count=c(-1,1))
snpgdsIndInbCoef(g[chr1idx], AF$AlleleFreq[chr1idx], method="mom.weir")
snpgdsIndInbCoef(g[chr1idx], AF$AlleleFreq[chr1idx], method="mom.visscher")
snpgdsIndInbCoef(g[chr1idx], AF$AlleleFreq[chr1idx], method="mle")
# close the genotype file
snpgdsClose(genofile)
```

snpgdsIndivBeta

Individual inbreeding and relatedness estimation (beta estimator)

Description

Calculate individual inbreeding and relatedness estimation (beta estimator) using SNP genotype

Usage

```
snpgdsIndivBeta(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
   remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, method=c("weighted"),
   inbreeding=TRUE, num.thread=1L, with.id=TRUE, useMatrix=FALSE, verbose=TRUE)
snpgdsIndivBetaRel(beta, beta_rel, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
method	"weighted" estimator
inbreeding	TRUE, the diagonal is a vector of inbreeding coefficients; otherwise, individual variance estimates
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
with.id	if TRUE, the returned value with sample.id and sample.id

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useMatrix if TRUE, use Matrix::dspMatrix to store the output square matrix to save mem-

ory

beta the object returned from snpgdsIndivBeta()

beta_rel the beta-based matrix is generated relative to beta_rel

verbose if TRUE, show information

Value

Return a list if with.id = TRUE:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

inbreeding a logical value; TRUE, the diagonal is a vector of inbreeding coefficients; other-

wise, individual variance estimates

beta beta estimates

avg_val the average of M_B among all loci, it could be used to calculate each M_ij

If with id = FALSE, this function returns the genetic relationship matrix without sample and SNP IDs.

Author(s)

Xiuwen Zheng

References

Weir BS, Zheng X. SNPs and SNVs in Forensic Science. Forensic Science International: Genetics Supplement Series. 2015. doi:10.1016/j.fsigss.2015.09.106

Weir BS, Goudet J. A Unified Characterization of Population Structure and Relatedness. Genetics. 2017 Aug;206(4):2085-2103. doi: 10.1534/genetics.116.198424.

See Also

```
snpgdsGRM, snpgdsIndInb, snpgdsFst
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
b <- snpgdsIndivBeta(genofile, inbreeding=FALSE)
b$beta[1:10, 1:10]

z <- snpgdsIndivBetaRel(b, min(b$beta))
# close the file
snpgdsClose(genofile)</pre>
```

snpgdsLDMat 59

Description

Return a LD matrix for SNP pairs.

Usage

```
snpgdsLDMat(gdsobj, sample.id=NULL, snp.id=NULL, slide=250L,
    method=c("composite", "r", "dprime", "corr", "cov"), mat.trim=FALSE,
    num.thread=1L, with.id=TRUE, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
slide	# of SNPs, the size of sliding window; if slide < 0, return a full LD matrix; see details
method	"composite", "r", "dprime", "corr", "cov", see details
mat.trim	if TRUE, trim the matrix when slide > 0: the function returns a "num_slide x $(n_snp - slide)$ " matrix
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
with.id	if TRUE, the returned value with sample.id and sample.id
verbose	if TRUE, show information

Details

Four methods can be used to calculate linkage disequilibrium values: "composite" for LD composite measure, "r" for R coefficient (by EM algorithm assuming HWE, it could be negative), "dprime" for D', and "corr" for correlation coefficient. The method "corr" is equivalent to "composite", when SNP genotypes are coded as: 0 - BB, 1 - AB, 2 - AA.

If slide <= 0, the function returns a n-by-n LD matrix where the value of i row and j column is LD of i and j SNPs. If slide > 0, it returns a m-by-n LD matrix where n is the number of SNPs, m is the size of sliding window, and the value of i row and j column is LD of j and j+i SNPs.

Value

Return a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis LD a matrix of LD values

LD a matrix of LD values slide the size of sliding window

Author(s)

Xiuwen Zheng

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References

Weir B: Inferences about linkage disequilibrium. Biometrics 1979; 35: 235-254.

Weir B: Genetic Data Analysis II. Sunderland, MA: Sinauer Associates, 1996.

Weir BS, Cockerham CC: Complete characterization of disequilibrium at two loci; in Feldman MW (ed): Mathematical Evolutionary Theory. Princeton, NJ: Princeton University Press, 1989.

See Also

```
snpgdsLDpair, snpgdsLDpruning
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# missing proportion and MAF
ff <- snpgdsSNPRateFreq(genofile)</pre>
# chromosome 15
snpset <- read.gdsn(index.gdsn(genofile, "snp.id"))[</pre>
    ff$MissingRate==0 & ff$MinorFreq>0 &
    read.gdsn(index.gdsn(genofile, "snp.chromosome"))==15]
length(snpset)
# LD matrix without sliding window
ld.noslide <- snpgdsLDMat(genofile, snp.id=snpset, slide=-1, method="composite")</pre>
# plot
image(t(ld.noslide$LD^2), col=terrain.colors(16))
# LD matrix with a sliding window
ld.slide <- snpgdsLDMat(genofile, snp.id=snpset, method="composite")</pre>
# plot
image(t(ld.slide$LD^2), col=terrain.colors(16))
# close the genotype file
snpgdsClose(genofile)
```

snpgdsLDpair

Linkage Disequilibrium (LD)

Description

Return a LD value between snp1 and snp2.

Usage

```
snpgdsLDpair(snp1, snp2, method = c("composite", "r", "dprime", "corr"))
```

snpgdsLDpair 61

Arguments

```
snp1 a vector of SNP genotypes (0 - BB, 1 - AB, 2 - AA)
snp2 a vector of SNP genotypes (0 - BB, 1 - AB, 2 - AA)
method "composite", "r", "dprime", "corr", see details
```

Details

Four methods can be used to calculate linkage disequilibrium values: "composite" for LD composite measure, "r" for R coefficient (by EM algorithm assuming HWE, it could be negative), "dprime" for D', and "corr" for correlation coefficient. The method "corr" is equivalent to "composite", when SNP genotypes are coded as: 0 - BB, 1 - AB, 2 - AA.

Value

Return a numeric vector:

```
a measure of linkage disequilibrium

if method = "r" or "dprime",

pA_A haplotype frequency of AA, the first locus is A and the second locus is A

pA_B haplotype frequency of AB, the first locus is A and the second locus is B

pB_A haplotype frequency of BA, the first locus is B and the second locus is A

pB_B haplotype frequency of BB, the first locus is B and the second locus is B
```

Author(s)

Xiuwen Zheng

References

```
Weir B: Inferences about linkage disequilibrium. Biometrics 1979; 35: 235-254.

Weir B: Genetic Data Analysis II. Sunderland, MA: Sinauer Associates, 1996.

Weir BS: Cockerham CC: Complete characterization of disequilibrium at two loci: in Feldm
```

Weir BS, Cockerham CC: Complete characterization of disequilibrium at two loci; in Feldman MW (ed): Mathematical Evolutionary Theory. Princeton, NJ: Princeton University Press, 1989.

See Also

```
snpgdsLDMat, snpgdsLDpruning
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
snp1 <- read.gdsn(index.gdsn(genofile, "genotype"), start=c(1,1), count=c(1,-1))
snp2 <- read.gdsn(index.gdsn(genofile, "genotype"), start=c(2,1), count=c(1,-1))
snpgdsLDpair(snp1, snp2, method = "composite")
snpgdsLDpair(snp1, snp2, method = "r")
snpgdsLDpair(snp1, snp2, method = "dprime")
snpgdsLDpair(snp1, snp2, method = "corr")</pre>
```

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```
# close the genotype file
snpgdsClose(genofile)
```

snpgdsLDpruning

Linkage Disequilibrium (LD) based SNP pruning

Description

Recursively removes SNPs within a sliding window

Usage

```
snpgdsLDpruning(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN,
    method=c("composite", "r", "dprime", "corr"), slide.max.bp=500000L,
    slide.max.n=NA, ld.threshold=0.2, start.pos=c("random", "first", "last"),
    num.thread=1L, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome †
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
method	"composite", "r", "dprime", "corr", see details
slide.max.bp	the maximum basepairs in the sliding window
slide.max.n	the maximum number of SNPs in the sliding window
ld.threshold	the LD threshold
start.pos	"random": a random starting position; "first": start from the first position; "last": start from the last position
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
verbose	if TRUE, show information

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

Four methods can be used to calculate linkage disequilibrium values: "composite" for LD composite measure, "r" for R coefficient (by EM algorithm assuming HWE, it could be negative), "dprime" for D', and "corr" for correlation coefficient. The method "corr" is equivalent to "composite", when SNP genotypes are coded as: 0-BB, 1-AB, 2-AA. The argument ld. threshold is the absolute value of measurement.

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It is useful to generate a pruned subset of SNPs that are in approximate linkage equilibrium with each other. The function snpgdsLDpruning recursively removes SNPs within a sliding window based on the pairwise genotypic correlation. SNP pruning is conducted chromosome by chromosome, since SNPs in a chromosome can be considered to be independent with the other chromosomes.

The pruning algorithm on a chromosome is described as follows (n is the total number of SNPs on that chromosome):

- 1) Randomly select a starting position i (start.pos="random"), i=1 if start.pos="first", or i=last if start.pos="last"; and let the current SNP set S={ i };
- 2) For each right position j from i+1 to n: if any LD between j and k is greater than ld. threshold, where k belongs to S, and both of j and k are in the sliding window, then skip j; otherwise, let S be $S + \{j\}$;
- 3) For each left position j from i-1 to 1: if any LD between j and k is greater than 1d. threshold, where k belongs to S, and both of j and k are in the sliding window, then skip j; otherwise, let S be $S + \{j\}$;
- 4) Output S, the final selection of SNPs.

Value

Return a list of SNP IDs stratified by chromosomes.

Author(s)

Xiuwen Zheng

References

Weir B: Inferences about linkage disequilibrium. Biometrics 1979; 35: 235-254.

Weir B: Genetic Data Analysis II. Sunderland, MA: Sinauer Associates, 1996.

Weir BS, Cockerham CC: Complete characterization of disequilibrium at two loci; in Feldman MW (ed): Mathematical Evolutionary Theory. Princeton, NJ: Princeton University Press, 1989.

See Also

```
snpgdsLDMat, snpgdsLDpair
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

set.seed(1000)
snpset <- snpgdsLDpruning(genofile)
names(snpset)
# [1] "chr1" "chr2" "chr3" "chr4" "chr5" "chr6" "chr7" "chr8" "chr9"
# [10] "chr10" "chr11" "chr12" "chr13" "chr14" "chr15" "chr16" "chr17" "chr18"
# ......
head(snpset$chr1)
# [1] 1 2 3 4 5 6

# get SNP ids
snp.id <- unlist(unname(snpset))</pre>
```

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```
# close the genotype file
snpgdsClose(genofile)
```

snpgdsMergeGRM

Merge Multiple Genetic Relationship Matrices (GRM)

Description

Combine multiple genetic relationship matrices with weighted averaging.

Usage

```
snpgdsMergeGRM(filelist, out.fn=NULL, out.prec=c("double", "single"),
   out.compress="LZMA_RA", weight=NULL, verbose=TRUE)
```

Arguments

out.fn NULL, return a GRM object; or characters, the output GDS file name out.prec double or single precision for storage out.compress the compression method for storing the GRM matrix in the GDS file NULL, weights proportional to the numbers of SNPs; a numeric vector, or a logical vector (FALSE for excluding some GRMs with a negative weight, weights proportional to the numbers of SNPs)

Details

The final GRM is the weighted averaged matrix combining multiple GRMs. The merged GRM may not be identical to the GRM calculated using full SNPs, due to missing genotypes or the internal weighting strategy of the specified GRM calculation.

Value

None or a GRM object if out.fn=NULL.

Author(s)

Xiuwen Zheng

See Also

snpgdsGRM

snpgdsOpen 65

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
snpid <- read.gdsn(index.gdsn(genofile, "snp.id"))</pre>
snpid <- snpid[snpgdsSNPRateFreq(genofile)$MissingRate == 0]</pre>
# there is no missing genotype
grm <- snpgdsGRM(genofile, snp.id=snpid, method="GCTA")</pre>
# save two GRMs
set1 <- grm$snp.id[1:(length(grm$snp.id)/2)]</pre>
set2 <- setdiff(grm$snp.id, set1)</pre>
snpgdsGRM(genofile,\ method="GCTA",\ snp.id=set1,\ out.fn="tmp1.gds")
snpgdsGRM(genofile, method="GCTA", snp.id=set2, out.fn="tmp2.gds")
# merge GRMs and export to a new GDS file
snpgdsMergeGRM(c("tmp1.gds", "tmp2.gds"), "tmp.gds")
\# return the GRM
{\tt grm2} \; {\tt <-} \; {\tt snpgdsMergeGRM(c("tmp1.gds", "tmp2.gds"))}
# check
f <- openfn.gds("tmp.gds")</pre>
m <- read.gdsn(index.gdsn(f, "grm"))</pre>
closefn.gds(f)
summary(c(m - grm\$grm)) # ~zero
summary(c(m - grm2$grm)) # zero
# close the file
snpgdsClose(genofile)
# delete the temporary file
unlink(c("tmp1.gds", "tmp2.gds", "tmp.gds"), force=TRUE)
```

snpgds0pen

Open a SNP GDS File

Description

Open a SNP GDS file

Usage

```
snpgdsOpen(filename,\ readonly=TRUE,\ allow.duplicate=FALSE,\ allow.fork=FALSE)
```

Arguments

filename

the file name

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```
readonly whether read-only or not
```

allow.duplicate

if TRUE, it is allowed to open a GDS file with read-only mode when it has been

opened in the same R session, see openfn.gds

allow. fork TRUE for parallel environment using forking, see openfn. gds

Details

It is strongly suggested to call snpgdsOpen instead of openfn.gds, since snpgdsOpen will perform internal checking for data integrality.

Value

Return an object of class SNPGDSFileClass.

Author(s)

Xiuwen Zheng

See Also

```
snpgdsClose
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
genofile
# close the file
snpgdsClose(genofile)</pre>
```

snpgdsOption

Option settings: chromosome coding, etc

Description

Return an option list used by the SNPRelate package or a GDS file

Usage

```
snpgdsOption(gdsobj=NULL, autosome.start=1L, autosome.end=22L, ...)
```

Arguments

```
gdsobj an object of class SNPGDSFileClass, a SNP GDS file autosome.start the starting index of autosome autosome the ending index of autosome optional arguments for new chromosome coding
```

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Value

A list

Author(s)

Xiuwen Zheng

Examples

```
# define the new chromosomes 'Z' and 'W'
snpgdsOption(Z=27L, W=28L)

# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
snpgdsOption(genofile)

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsPairIBD

Calculate Identity-By-Descent (IBD) Coefficients

Description

Calculate the three IBD coefficients (k0, k1, k2) for non-inbred individual pairs by Maximum Likelihood Estimation (MLE) or PLINK Method of Moment (MoM).

Usage

```
snpgdsPairIBD(geno1, geno2, allele.freq,
    method=c("EM", "downhill.simplex", "MoM", "Jacquard"),
    kinship.constraint=FALSE, max.niter=1000L, reltol=sqrt(.Machine$double.eps),
    coeff.correct=TRUE, out.num.iter=TRUE, verbose=TRUE)
```

Arguments

geno1 the SNP genotypes for the first individual, 0 - BB, 1 - AB, 2 - AA, other values

missing

geno2 the SNP genotypes for the second individual, 0 - BB, 1 - AB, 2 - AA, other

values - missing

allele.freq the allele frequencies

method "EM", "downhill.simplex", "MoM" or "Jacquard", see details

kinship.constraint

if TRUE, constrict IBD coefficients (\$k_0,k_1,k_2\$) in the genealogical region

 $(\$2 k_0 k_1 >= k_2^2)$

max.niter the maximum number of iterations

relative convergence tolerance; the algorithm stops if it is unable to reduce the

value of log likelihood by a factor of \$reltol * (abs(log likelihood with the initial

parameters) + reltol)\$ at a step.

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coeff.correct TRUE by default, see details

out.num.iter if TRUE, output the numbers of iterations

verbose if TRUE, show information

Details

If method = "MoM", then PLINK Method of Moment without a allele-count-based correction factor is conducted. Otherwise, two numeric approaches for maximum likelihood estimation can be used: one is Expectation-Maximization (EM) algorithm, and the other is Nelder-Mead method or downhill simplex method. Generally, EM algorithm is more robust than downhill simplex method. "Jacquard" refers to the estimation of nine Jacquard's coefficients.

If coeff.correct is TRUE, the final point that is found by searching algorithm (EM or downhill simplex) is used to compare the six points (fullsib, offspring, halfsib, cousin, unrelated), since any numeric approach might not reach the maximum position after a finit number of steps. If any of these six points has a higher value of log likelihood, the final point will be replaced by the best one.

Value

Return a data.frame:

k0 IBD coefficient, the probability of sharing ZERO IBDk1 IBD coefficient, the probability of sharing ONE IBD

loglik the value of log likelihood niter the number of iterations

Author(s)

Xiuwen Zheng

References

Milligan BG. 2003. Maximum-likelihood estimation of relatedness. Genetics 163:1153-1167.

Weir BS, Anderson AD, Hepler AB. 2006. Genetic relatedness analysis: modern data and new challenges. Nat Rev Genet. 7(10):771-80.

Choi Y, Wijsman EM, Weir BS. 2009. Case-control association testing in the presence of unknown relationships. Genet Epidemiol 33(8):668-78.

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

See Also

snpgdsPairIBDMLELogLik, snpgdsIBDMLE, snpgdsIBDMLELogLik, snpgdsIBDMoMunical structure and structu

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]</pre>
```

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```
# SNP pruning
set.seed(10)
snpset <- snpgdsLDpruning(genofile, sample.id=YRI.id, maf=0.05,</pre>
    missing.rate=0.05)
snpset <- unname(sample(unlist(snpset), 250))</pre>
# the number of samples
n <- 25
# specify allele frequencies
RF <- snpgdsSNPRateFreq(genofile, sample.id=YRI.id, snp.id=snpset,
    with.id=TRUE)
summary(RF$AlleleFreq)
subMLE <- snpgdsIBDMLE(genofile, sample.id=YRI.id[1:n], snp.id=RF$snp.id,</pre>
    allele.freq=RF$AlleleFreq)
subMoM <- snpgdsIBDMoM(genofile, sample.id=YRI.id[1:n], snp.id=RF$snp.id,</pre>
    allele.freq=RF$AlleleFreq)
subJac <- snpgdsIBDMLE(genofile, sample.id=YRI.id[1:n], snp.id=RF$snp.id,</pre>
    allele.freq=RF$AlleleFreq, method="Jacquard")
#############################
# genotype matrix
mat <- snpgdsGetGeno(genofile, sample.id=YRI.id[1:n], snp.id=snpset,</pre>
    snpfirstdim=TRUE)
rv <- NULL
for (i in 2:n)
{
    rv <- rbind(rv, snpgdsPairIBD(mat[,1], mat[,i], RF$AlleleFreq, "EM"))</pre>
    print(snpgdsPairIBDMLELogLik(mat[,1], mat[,i], RF$AlleleFreq,
        relatedness="unrelated", verbose=TRUE))
}
rv
summary(rv$k0 - subMLE$k0[1, 2:n])
summary(rv$k1 - subMLE$k1[1, 2:n])
# ZERO
rv <- NULL
for (i in 2:n)
    rv <- rbind(rv, snpgdsPairIBD(mat[,1], mat[,i], RF$AlleleFreq, "MoM"))</pre>
summary(rv$k0 - subMoM$k0[1, 2:n])
summary(rv$k1 - subMoM$k1[1, 2:n])
# ZERO
rv <- NULL
for (i in 2:n)
    rv <- rbind(rv, snpgdsPairIBD(mat[,1], mat[,i], RF$AlleleFreq, "Jacquard"))</pre>
summary(rv$D1 - subJac$D1[1, 2:n])
summary(rv$D2 - subJac$D2[1, 2:n])
# ZERO
```

```
# close the genotype file
snpgdsClose(genofile)
```

```
snpgdsPairIBDMLELogLik
```

Log likelihood for MLE method in the Identity-By-Descent (IBD) Analysis

Description

Calculate the log likelihood values from maximum likelihood estimation.

Usage

```
snpgdsPairIBDMLELogLik(geno1, geno2, allele.freq, k0=NaN, k1=NaN,
    relatedness=c("", "self", "fullsib", "offspring", "halfsib",
    "cousin", "unrelated"), verbose=TRUE)
```

Arguments

geno1	the SNP genotypes	s for the first individual,	. 0 – BB. 1 -	– AB, 2 – AA,	other values

- missing

geno2 the SNP genotypes for the second individual, 0 - BB, 1 - AB, 2 - AA, other

values - missing

allele.freq the allele frequencies
k0 specified IBD coefficient
k1 specified IBD coefficient

relatedness specify a relatedness, otherwise use the values of k0 and k1

verbose if TRUE, show information

Details

If (relatedness == "") and (k0 == NaN or k1 == NaN), then return the log likelihood values for each (k0, k1) stored in ibdobj.

If (relatedness == "") and (k0 != NaN) and (k1 != NaN), then return the log likelihood values for a specific IBD coefficient (k0, k1).

If relatedness is: "self", then k0=0, k1=0; "fullsib", then k0=0.25, k1=0.5; "offspring", then k0=0, k1=1; "halfsib", then k0=0.5, k1=0.5; "cousin", then k0=0.75, k1=0.25; "unrelated", then k0=1, k1=0.

Value

The value of log likelihood.

Author(s)

Xiuwen Zheng

References

Milligan BG. 2003. Maximum-likelihood estimation of relatedness. Genetics 163:1153-1167.

Weir BS, Anderson AD, Hepler AB. 2006. Genetic relatedness analysis: modern data and new challenges. Nat Rev Genet. 7(10):771-80.

Choi Y, Wijsman EM, Weir BS. 2009. Case-control association testing in the presence of unknown relationships. Genet Epidemiol 33(8):668-78.

See Also

```
snpgdsPairIBD, snpgdsIBDMLE, snpgdsIBDMLELogLik, snpgdsIBDMoM
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
YRI.id <- read.gdsn(index.gdsn(genofile, "sample.id"))[</pre>
    read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))=="YRI"]
# SNP pruning
set.seed(10)
snpset <- snpgdsLDpruning(genofile, sample.id=YRI.id, maf=0.05,</pre>
    missing.rate=0.05)
snpset <- unname(sample(unlist(snpset), 250))</pre>
# the number of samples
n <- 25
# specify allele frequencies
RF <- snpgdsSNPRateFreq(genofile, sample.id=YRI.id, snp.id=snpset,
    with.id=TRUE)
summary(RF$AlleleFreq)
subMLE <- snpgdsIBDMLE(genofile, sample.id=YRI.id[1:n], snp.id=RF$snp.id,</pre>
    allele.freq=RF$AlleleFreq)
subMoM <- snpgdsIBDMoM(genofile, sample.id=YRI.id[1:n], snp.id=RF$snp.id,</pre>
    allele.freq=RF$AlleleFreq)
# genotype matrix
mat <- snpgdsGetGeno(genofile, sample.id=YRI.id[1:n], snp.id=snpset,</pre>
    snpfirstdim=TRUE)
###########################
rv <- NULL
for (i in 2:n)
    rv <- rbind(rv, snpgdsPairIBD(mat[,1], mat[,i], RF$AlleleFreq, "EM"))</pre>
    print(snpgdsPairIBDMLELogLik(mat[,1], mat[,i], RF$AlleleFreq,
        relatedness="unrelated", verbose=TRUE))
}
summary(rv$k0 - subMLE$k0[1, 2:n])
```

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```
summary(rv$k1 - subMLE$k1[1, 2:n])
# ZERO

rv <- NULL
for (i in 2:n)
        rv <- rbind(rv, snpgdsPairIBD(mat[,1], mat[,i], RF$AlleleFreq, "MoM"))
rv
summary(rv$k0 - subMoM$k0[1, 2:n])
summary(rv$k1 - subMoM$k1[1, 2:n])
# ZERO

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsPairScore

Genotype Score for Pairs of Individuals

Description

Calculate the genotype score for pairs of individuals based on identity-by-state (IBS) measure

Usage

```
snpgdsPairScore(gdsobj, sample1.id, sample2.id, snp.id=NULL,
  method=c("IBS", "GVH", "HVG", "GVH.major", "GVH.minor", "GVH.major.only",
  "GVH.minor.only"), type=c("per.pair", "per.snp", "matrix", "gds.file"),
  dosage=TRUE, with.id=TRUE, output=NULL, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample1.id	a vector of sample id specifying selected samples; if NULL, all samples are used
sample2.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
method	"IBS" - identity-by-state score, "GVH" or "HVG", see Details
type	"per.pair", "per.snp" or "matrix", see Value
dosage	TRUE, uses dosages 0, 1, 2; FALSE, uses 0, 1 (changing a return value of 1 or 2 to be 1)
with.id	if TRUE, returns "sample.id" and "snp.id"; see Value
output	if type="gds.file", the file name
verbose	if TRUE, show information

Details

sample1.id	sample2.id							
Patient	Donor	IBS	GVH	HVG	GVH.major	GVH.minor	GVH.major.only	GVH.minor.only
AA / 2	AA / 2	2	0	0	0	0	0	0
AA / 2	AB / 1	1	0	1	0	0	0	0
AA / 2	BB / 0	0	2	2	1	0	1	NA

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AB / 1	AA / 2	1	1	0	0	1	NA	1
AB / 1	AB / 1	2	0	0	0	0	0	0
AB / 1	BB / 0	1	1	0	1	0	1	NA
BB / 0	AA / 2	0	2	2	0	1	NA	1
BB / 0	AB / 1	1	0	1	0	0	0	0
BB / 0	BB / 0	2	0	0	0	0	0	0

Value

Return a list:

score

sample.id the sample ids used in the analysis, if with.id=TRUE snp.id the SNP ids used in the analysis, if with.id=TRUE

a matrix of genotype score: if type="per.pair", a data.frame with the first column for average scores, the second column for standard deviation and the third column for the valid number of SNPs; the additional columns for pairs of samples. if type="per.snp", a 3-by-# of SNPs matrix with the first row for average scores, the second row for standard deviation and the third row for the valid number of individual pairs; if type="matrix", a # of pairs-by-# of SNPs matrix with rows for pairs of individuals

Author(s)

Xiuwen Zheng

References

Warren, E. H., Zhang, X. C., Li, S., Fan, W., Storer, B. E., Chien, J. W., Boeckh, M. J., et al. (2012). Effect of MHC and non-MHC donor/recipient genetic disparity on the outcome of allogeneic HCT. Blood, 120(14), 2796-806. doi:10.1182/blood-2012-04-347286

See Also

```
snpgdsIBS
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

# autosomal SNPs
selsnp <- snpgdsSelectSNP(genofile, autosome.only=TRUE, remove.monosnp=FALSE)

# sample ID
sample.id <- read.gdsn(index.gdsn(genofile, "sample.id"))
father.id <- read.gdsn(index.gdsn(genofile, "sample.annot/father.id"))

offspring.id <- sample.id[father.id != ""]
father.id <- father.id[father.id != ""]</pre>
```

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```
# calculate average genotype scores
z1 <- snpgdsPairScore(genofile, offspring.id, father.id, snp.id=selsnp,</pre>
    method="IBS", type="per.pair")
names(z1)
head(z1$score)
# calculate average genotype scores
z1 <- snpgdsPairScore(genofile, offspring.id, father.id, snp.id=selsnp,</pre>
    method="IBS", type="per.pair", dosage=FALSE)
names(z1)
head(z1$score)
# calculate average genotype scores
z2 <- snpgdsPairScore(genofile, offspring.id, father.id, snp.id=selsnp,</pre>
    method="IBS", type="per.snp")
names(z2)
mean(z2$score["Avg",])
mean(z2$score["SD",])
plot(z2$score["Avg",], pch=20, cex=0.75, xlab="SNP Index", ylab="IBS score")
# calculate a matrix of genotype scores over samples and SNPs
z3 <- snpgdsPairScore(genofile, offspring.id, father.id, snp.id=selsnp,</pre>
    method="IBS", type="matrix")
dim(z3$score)
# output the score matrix to a GDS file
snpgdsPairScore(genofile, offspring.id, father.id, snp.id=selsnp,
    method="IBS", type="gds.file", output="tmp.gds")
(f <- snpgdsOpen("tmp.gds"))</pre>
snpgdsClose(f)
# close the file
snpgdsClose(genofile)
unlink("tmp.gds", force=TRUE)
```

snpgdsPCA

Principal Component Analysis (PCA) on SNP genotype data

Description

To calculate the eigenvectors and eigenvalues for principal component analysis in GWAS.

Usage

```
snpgdsPCA(gdsobj, sample.id=NULL, snp.id=NULL,
  autosome.only=TRUE, remove.monosnp=TRUE, maf=NaN, missing.rate=NaN,
  algorithm=c("exact", "randomized"),
  eigen.cnt=ifelse(identical(algorithm, "randomized"), 16L, 32L),
```

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```
num.thread=1L, bayesian=FALSE, need.genmat=FALSE,
   genmat.only=FALSE, eigen.method=c("DSPEVX", "DSPEV"),
   aux.dim=eigen.cnt*2L, iter.num=10L, verbose=TRUE)
## S3 method for class 'snpgdsPCAClass'
plot(x, eig=c(1L,2L), ...)
```

Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file sample.id a vector of sample id specifying selected samples; if NULL, all samples are used snp.id a vector of snp id specifying selected SNPs; if NULL, all SNPs are used autosome.only if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome remove.monosnp if TRUE, remove monomorphic SNPs to use the SNPs with ">= maf" only; if NaN, no MAF threshold maf to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold missing.rate eigen.cnt output the number of eigenvectors; if eigen.cnt <= 0, then return all eigenvectors "exact", traditional exact calculation; "randomized", fast PCA with randomized algorithm algorithm introduced in Galinsky et al. 2016 the number of (CPU) cores used; if NA, detect the number of cores automatically num.thread bayesian if TRUE, use bayesian normalization need.genmat if TRUE, return the genetic covariance matrix genmat.only return the genetic covariance matrix only, do not compute the eigenvalues and eigenvectors "DSPEVX" - compute the top eigen.cnt eigenvalues and eigenvectors using eigen.method LAPACK::DSPEVX; "DSPEV" - to be compatible with SNPRelate_1.1.6 or earlier, using LAPACK::DSPEV; "DSPEVX" is significantly faster than "DSPEV" if only top principal components are of interest aux.dim auxiliary dimension used in fast randomized algorithm iter.num iteration number used in fast randomized algorithm verbose if TRUE, show information a snpgdsPCAClass object Χ indices of eigenvectors, like 1:2 or 1:4 eig the arguments passed to or from other methods, like pch, col . . .

Details

The minor allele frequency and missing rate for each SNP passed in snp.id are calculated over all the samples in sample.id.

Value

Return a snpgdsPCAClass object, and it is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

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```
eigenvect eigenvactors, "# of samples" x "eigen.cnt"
varprop variance proportion for each principal component
TraceXTX the trace of the genetic covariance matrix
Bayesian whether use bayerisan normalization
genmat the genetic covariance matrix
```

Author(s)

Xiuwen Zheng

References

Patterson N, Price AL, Reich D. Population structure and eigenanalysis. PLoS Genet. 2006 Dec;2(12):e190.

Galinsky KJ, Bhatia G, Loh PR, Georgiev S, Mukherjee S, Patterson NJ, Price AL. Fast Principal-Component Analysis Reveals Convergent Evolution of ADH1B in Europe and East Asia. Am J Hum Genet. 2016 Mar 3;98(3):456-72. doi: 10.1016/j.ajhg.2015.12.022. Epub 2016 Feb 25.

See Also

snpgdsPCACorr, snpgdsPCASNPLoading, snpgdsPCASampLoading, snpgdsAdmixProp, snpgdsEIGMIX

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# run PCA
RV <- snpgdsPCA(genofile)</pre>
# eigenvalues
head(RV$eigenval)
# variance proportion (%)
head(round(RV$varprop*100, 2))
# [1] 12.23 5.84 1.01 0.95 0.84 0.74
# draw
plot(RV)
plot(RV, 1:4)
#### there is no population information ####
# make a data.frame
tab <- data.frame(sample.id = RV$sample.id,</pre>
   EV1 = RV$eigenvect[,1],  # the first eigenvector
                               # the second eigenvector
    EV2 = RV$eigenvect[,2],
   stringsAsFactors = FALSE)
head(tab)
# sample.id
                     EV1
# 1 NA19152 -0.08411287 -0.01226860
# 2 NA19139 -0.08360644 -0.01085849
# 3 NA18912 -0.08110808 -0.01184524
```

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```
NA19160 -0.08680864 -0.01447106
      NA07034 0.03109761 0.07709255
# 5
     NA07055 0.03228450 0.08155730
# 6
# draw
plot(tab$EV2, tab$EV1, xlab="eigenvector 2", ylab="eigenvector 1")
#### there are population information ####
# get population information
  or pop_code <- scan("pop.txt", what=character())
# if it is stored in a text file "pop.txt"
pop_code <- read.gdsn(index.gdsn(genofile, "sample.annot/pop.group"))</pre>
# get sample id
samp.id <- read.gdsn(index.gdsn(genofile, "sample.id"))</pre>
# assume the order of sample IDs is as the same as population codes
cbind(samp.id, pop_code)
         samp.id
                       pop_code
   [1,] "NA19152"
                       "YRI"
   [2,] "NA19139"
                       "YRI"
   [3,] "NA18912"
                       "YRI"
   [4,] "NA19160"
                       "YRI"
   [5,] "NA07034"
                       "CEU"
# make a data.frame
tab <- data.frame(sample.id = RV$sample.id,</pre>
    pop = factor(pop_code)[match(RV$sample.id, samp.id)],
    EV1 = RV$eigenvect[,1], # the first eigenvector
    EV2 = RV$eigenvect[,2],
                               # the second eigenvector
    stringsAsFactors = FALSE)
head(tab)
# sample.id pop
                         FV1
# 1 NA19152 YRI -0.08411287 -0.01226860
# 2 NA19139 YRI -0.08360644 -0.01085849
# 3
     NA18912 YRI -0.08110808 -0.01184524
     NA19160 YRI -0.08680864 -0.01447106
# 4
# 5
     NA07034 CEU 0.03109761 0.07709255
     NA07055 CEU 0.03228450 0.08155730
# draw
plot(tab$EV2, tab$EV1, col=as.integer(tab$pop),
    xlab="eigenvector 2", ylab="eigenvector 1")
legend("bottomright", legend=levels(tab$pop), pch="o", col=1:4)
# close the file
snpgdsClose(genofile)
```

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Description

To calculate the SNP correlations between eigenvactors and SNP genotypes

Usage

```
snpgdsPCACorr(pcaobj, gdsobj, snp.id=NULL, eig.which=NULL, num.thread=1L,
    with.id=TRUE, outgds=NULL, verbose=TRUE)
```

Arguments

pcaobj	a snpgdsPCAClass object returned from the function snpgdsPCA, a snpgdsEigMixClass from snpgdsEIGMIX, or an eigenvector matrix with row names (sample id)
gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
eig.which	a vector of integers, to specify which eigenvectors to be used
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
with.id	if TRUE, the returned value with sample.id and sample.id
outgds	NULL or a character of file name for exporting correlations to a GDS file, see details
verbose	if TRUE, show information

Details

If an output file name is specified via outgds, "sample.id", "snp.id" and "correlation" will be stored in the GDS file. The GDS node "correlation" is a matrix of correlation coefficients, and it is stored with the format of packed real number ("packedreal16" preserving 4 digits, 0.0001 is the smallest number greater zero, see add.gdsn).

Value

Return a list if outgds=NULL,

```
sample.id the sample ids used in the analysis
snp.id the SNP ids used in the analysis
```

snpcorr a matrix of correlation coefficients, "# of eigenvectors" x "# of SNPs"

Author(s)

Xiuwen Zheng

References

Patterson N, Price AL, Reich D (2006) Population structure and eigenanalysis. PLoS Genetics 2:e190.

See Also

```
snpgdsPCA, snpgdsPCASampLoading, snpgdsPCASNPLoading
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# get chromosome index
chr <- read.gdsn(index.gdsn(genofile, "snp.chromosome"))</pre>
pca <- snpgdsPCA(genofile)</pre>
cr <- snpgdsPCACorr(pca, genofile, eig.which=1:4)</pre>
plot(abs(cr$snpcorr[3,]), xlab="SNP Index", ylab="PC 3", col=chr)
# output to a gds file if limited memory
snpgdsPCACorr(pca, genofile, eig.which=1:4, outgds="test.gds")
(f <- openfn.gds("test.gds"))</pre>
m <- read.gdsn(index.gdsn(f, "correlation"))</pre>
closefn.gds(f)
# check
summary(c(m - cr$snpcorr)) # should < 1e-4
# close the file
snpgdsClose(genofile)
# delete the temporary file
unlink("test.gds", force=TRUE)
```

snpgdsPCASampLoading Project individuals onto existing principal component axes

Description

To calculate the sample eigenvectors using the specified SNP loadings

Usage

```
snpgdsPCASampLoading(loadobj, gdsobj, sample.id=NULL, num.thread=1L,
    verbose=TRUE)
```

Arguments

loadobj	$a \ snpgds PCASNPLoading Class \ or \ snpgds EigMixSNPLoading Class \ object \ returned \ from \ snpgds PCASNPLoading$
gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
num.thread	the number of CPU cores used
verbose	if TRUE, show information

Details

The sample.id are usually different from the samples used in the calculation of SNP loadings.

Value

Returns a snpgdsPCAClass object, and it is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

eigenvect eigenvactors, "# of samples" x "eigen.cnt"

TraceXTX the trace of the genetic covariance matrix

Bayesian whether use bayerisan normalization

Or returns a snpgdsEigMixClass object, and it is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

eigenvect eigenvactors, "# of samples" x "eigen.cnt"

afreq allele frequencies

Author(s)

Xiuwen Zheng

References

Patterson N, Price AL, Reich D (2006) Population structure and eigenanalysis. PLoS Genetics 2:e190.

Zhu, X., Li, S., Cooper, R. S., and Elston, R. C. (2008). A unified association analysis approach for family and unrelated samples correcting for stratification. Am J Hum Genet, 82(2), 352-365.

See Also

```
snpgdsPCA, snpgdsPCACorr, snpgdsPCASNPLoading
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
sample.id <- read.gdsn(index.gdsn(genofile, "sample.id"))

PCARV <- snpgdsPCA(genofile, eigen.cnt=8)
SnpLoad <- snpgdsPCASNPLoading(PCARV, genofile)

# calculate sample eigenvectors from SNP loadings
SL <- snpgdsPCASampLoading(SnpLoad, genofile, sample.id=sample.id[1:100])

diff <- PCARV$eigenvect[1:100,] - SL$eigenvect
summary(c(diff))
# ~ ZERO

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsPCASNPLoading SNP loadings in principal component analysis

Description

To calculate the SNP loadings in Principal Component Analysis

Usage

```
snpgdsPCASNPLoading(pcaobj, gdsobj, num.thread=1L, verbose=TRUE)
```

Arguments

pcaobj a snpgdsPCAClass object returned from the function snpgdsPCA or a snpgdsEigMixClass

from snpgdsEIGMIX

gdsobj an object of class SNPGDSFileClass, a SNP GDS file

num. thread the number of (CPU) cores used; if NA, detect the number of cores automatically

verbose if TRUE, show information

Details

Calculate the SNP loadings (or SNP eigenvectors) from the principal component analysis conducted in snpgdsPCA.

Value

Returns a snpgdsPCASNPLoading object if pcaobj is snpgdsPCAClass, which is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

snploading SNP loadings, or SNP eigenvectors

TraceXTX the trace of the genetic covariance matrix

Bayesian whether use bayerisan normalization

avgfreq two times allele frequency used in snpgdsPCA

scale internal parameter

Or returns a snpgdsEigMixSNPLoadingClass object if pcaobj is snpgdsEigMixClass, which is a list:

sample.id the sample ids used in the analysis snp.id the SNP ids used in the analysis

eigenval eigenvalues

 $snploading \hspace{1cm} SNP \ loadings, \ or \ SNP \ eigenvectors$

afreq allele frequency

Author(s)

Xiuwen Zheng

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References

Patterson N, Price AL, Reich D (2006) Population structure and eigenanalysis. PLoS Genetics 2:e190.

Price AL, Patterson NJ, Plenge RM, Weinblatt ME, Shadick NA, Reich D (2006) Principal components analysis corrects for stratification in genome-wide association studies. Nat Genet. 38, 904-909.

Zhu, X., Li, S., Cooper, R. S., and Elston, R. C. (2008). A unified association analysis approach for family and unrelated samples correcting for stratification. Am J Hum Genet, 82(2), 352-365.

See Also

```
snpgdsPCA, snpgdsEIGMIX, snpgdsPCASampLoading, snpgdsPCACorr
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
PCARV <- snpgdsPCA(genofile, eigen.cnt=8)
SnpLoad <- snpgdsPCASNPLoading(PCARV, genofile)</pre>
names(SnpLoad)
                                               "snploading" "TraceXTX"
# [1] "sample.id"
                   "snp.id"
                                 "eigenval"
# [6] "Bayesian"
                    "avgfreq"
                                 "scale"
dim(SnpLoad$snploading)
# [1]
          8 8722
plot(SnpLoad$snploading[1,], type="h", ylab="PC 1")
# close the genotype file
snpgdsClose(genofile)
```

 ${\tt snpgdsPED2GDS}$

Conversion from PLINK PED to GDS

Description

Convert a PLINK PED text file to a GDS file.

Usage

```
snpgdsPED2GDS(ped.fn, map.fn, out.gdsfn, family=TRUE, snpfirstdim=FALSE,
    compress.annotation="ZIP_RA.max", compress.geno="", verbose=TRUE)
```

Arguments

ped.fn	the file name of PED file, genotype information
map.fn	the file name of MAP file
out.gdsfn	the output GDS file
family	if TRUE, to include family information in the sample annotation

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snpfirstdim if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs

for the first individual, and then list all SNPs for the second individual, etc)

compress.annotation

the compression method for the GDS variables, except "genotype"; optional

values are defined in the function add.gdsn

compress.geno the compression method for "genotype"; optional values are defined in the func-

tion add.gdsn

verbose if TRUE, show information

Details

GDS – Genomic Data Structures, the extended file name used for storing genetic data, and the file format is used in the gdsfmt package.

PED - PLINK PED format.

Value

None.

Author(s)

Xiuwen Zheng

References

Purcell S, Neale B, Todd-Brown K, Thomas L, Ferreira MAR, Bender D, Maller J, Sklar P, de Bakker PIW, Daly MJ & Sham PC. 2007. PLINK: a toolset for whole-genome association and population-based linkage analysis. American Journal of Human Genetics, 81.

See Also

snpgdsGDS2PED, snpgdsBED2GDS, snpgdsGDS2BED

```
# open
genofile <- snpgdsOpen(snpgdsExampleFileName())
snpgdsGDS2PED(genofile, "tmp")
# close
snpgdsClose(genofile)

# PED ==> GDS
snpgdsPED2GDS("tmp.ped", "tmp.map", "test.gds")
# delete the temporary file
unlink(c("tmp.ped", "tmp.map", "test.gds"), force=TRUE)
```

snpgdsSampMissRate

Description

Return the missing fraction for each sample

Usage

```
snpgdsSampMissRate(gdsobj, sample.id=NULL, snp.id=NULL, with.id=FALSE)\\
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples will be used $% \left(1\right) =\left(1\right) \left($
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs will be used
with.id	if TRUE, the returned value with sample id

Value

A vector of numeric values.

Author(s)

Xiuwen Zheng

See Also

```
{\tt snpgdsSNPRateFreq}
```

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
RV <- snpgdsSampMissRate(genofile)
summary(RV)
# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsSelectSNP 85

Description

Create a list of candidate SNPs based on specified criteria

Usage

```
snpgdsSelectSNP(gdsobj, sample.id=NULL, snp.id=NULL, autosome.only=TRUE,
    remove.monosnp=TRUE, maf=NaN, missing.rate=NaN, verbose=TRUE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if \ensuremath{NULL} , all samples will be used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs will be used
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no any MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no any missing threshold
verbose	if TRUE, show information

Value

Return a list of snp ids.

Author(s)

Xiuwen Zheng

See Also

snpgdsSampMissRate, snpgdsSNPRateFreq, snpgdsLDpruning

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
snpset <- snpgdsSelectSNP(genofile, maf=0.05, missing.rate=0.95)
length(snpset)
# 7502
# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsSlidingWindow
Sliding window

Description

Apply a user-defined function with a sliding window.

Usage

```
snpgdsSlidingWindow(gdsobj, sample.id=NULL, snp.id=NULL,
   FUN=NULL, winsize=100000L, shift=10000L, unit=c("basepair", "locus"),
   winstart=NULL, autosome.only=FALSE, remove.monosnp=TRUE, maf=NaN,
   missing.rate=NaN, as.is=c("list", "numeric", "array"),
   with.id=c("snp.id", "snp.id.in.window", "none"), num.thread=1,
   verbose=TRUE, ...)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples are used
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs are used
FUN	a character or a user-defined function, see details
winsize	the size of sliding window
shift	the amount of shifting the sliding window
unit	"basepair" — winsize and shift are applied with SNP coordinate of basepair; "locus" — winsize and shift are applied according to the SNP order in the GDS file
winstart	NULL – no specific starting position; an integer – a starting position for all chromosomes; or a vector of integer – the starting positions for each chromosome
autosome.only	if TRUE, use autosomal SNPs only; if it is a numeric or character value, keep SNPs according to the specified chromosome
remove.monosnp	if TRUE, remove monomorphic SNPs
maf	to use the SNPs with ">= maf" only; if NaN, no MAF threshold
missing.rate	to use the SNPs with "<= missing.rate" only; if NaN, no missing threshold
as.is	save the value returned from FUN as "list" or "numeric"; "array" is equivalent to "numeric" except some cases, see details
with.id	"snp.id", "snp.id.in.window" or "none"
num.thread	the number of (CPU) cores used; if NA, detect the number of cores automatically
verbose	if TRUE, show information
• • •	optional arguments to FUN

Details

If FUN="snpgdsFst", two additional arguments "population" and "method" should be specified. "population" and "method" are defined in snpgdsFst. "as.is" could be "list" (returns a list of the values from snpgdsFst), "numeric" (population-average Fst, returns a vector) or "array" (population-average and -specific Fst, returns a '# of pop + 1'-by-'# of windows' matrix, and the first row is population-average Fst).

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Value

Return a list

Author(s)

Xiuwen Zheng

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

# sliding windows
rv <- snpgdsSlidingWindow(genofile, winsize=500000, shift=100000,
        FUN=function(...) NULL)

# plot
plot(rv$chr1.num, ylab="# of SNPs in the sliding window")

# close the genotype file
snpgdsClose(genofile)</pre>
```

snpgdsSNPList

Create a SNP list object

Description

A list object of SNP information including rs, chr, pos, allele and allele frequency.

Usage

```
snpgdsSNPList(gdsobj, sample.id=NULL)
```

Arguments

gdsobj an object of class SNPGDSFileClass, a SNP GDS file

sample.id a vector of sample id specifying selected samples; if NULL, all samples are used

Value

Return an object of snpgdsSNPListClass including the following components:

snp.id SNP id

chromosome SNP chromosome index

position SNP physical position in basepair

allele reference / non-ref alleles

afreq allele frequency

Author(s)

Xiuwen Zheng

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See Also

```
snpgdsSNPListIntersect
```

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())
# to get a snp list object
snplist <- snpgdsSNPList(genofile)
head(snplist)
# close the file
snpgdsClose(genofile)</pre>
```

snpgdsSNPListClass

the class of a SNP list

Description

the class of a SNP list, and its instance is returned from snpgdsSNPList.

Value

Return an object of "snpgdsSNPListClass" including the following components:

snp.id SNP id

 ${\color{red} \text{chromosome index}}$

position SNP physical position in basepair

allele reference / non-ref alleles

afreq allele frequency

Author(s)

Xiuwen Zheng

See Also

```
{\tt snpgdsSNPListIntersect}
```

```
snpgdsSNPListIntersect
```

Get a common SNP list between/among SNP list objects

Description

Get a common SNP list by comparing their snp id, chromosome, positions and allele frequency if needed.

Usage

```
snpgdsSNPListIntersect(snplist1, snplist2, ..., method=c("position", "exact"),
na.rm=TRUE, same.strand=FALSE, verbose=TRUE)
```

Arguments

snplist1 the SNP list object snpgdsSNPListClass snplist2 the SNP list object snpgdsSNPListClass

... the other SNP list objects

method "exact": matching by all snp.id, chromosomes, positions and alleles; "position":

matching by chromosomes and positions

na.rm if TRUE, remove mismatched alleles

same.strand if TRUE, assuming the alleles on the same strand

verbose if TRUE, show information

Value

Return a list of snpgdsSNPListClass including the following components:

idx1 the indices of common SNPs in the first GDS file idx2 the indices of common SNPs in the second GDS file

idx...

idxn the indices of common SNPs in the n-th GDS file

flag2 an integer vector, flip flag for each common SNP for the second GDS file (as-

suming a value v): bitwAnd(v,1): 0 – no flip of allele names, 1 – flip of allele names; bitwAnd(v,2): 0 – on the same strand, 2 – on the different strands, comparing with the first GDS file; bitwAnd(v,4): 0 – no strand ambiguity, 4 – ambiguous allele names, determined by allele frequencies; NA – mismatched

allele names (there is no NA if na.rm=TRUE)

flag...

flagn flip flag for each common SNP for the n-th GDS file

Author(s)

Xiuwen Zheng

See Also

```
snpgdsSNPList
```

snpgdsSNPRateFreq

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())</pre>
# to get a snp list object
snplist1 <- snpgdsSNPList(genofile)</pre>
snplist2 <- snpgdsSNPList(genofile)</pre>
# a common snp list, exactly matching
v <- snpgdsSNPListIntersect(snplist1, snplist2)</pre>
names(v)
# "idx1" "idx2"
# a common snp list, matching by position
v \leftarrow snpgdsSNPListIntersect(snplist1, snplist2, method="pos")
names(v)
# "idx1" "idx2" "flag2"
table(v$flag2, exclude=NULL)
# close the file
snpgdsClose(genofile)
```

snpgdsSNPRateFreq

Allele Frequency, Minor Allele Frequency, Missing Rate of SNPs

Description

Calculate the allele frequency, minor allele frequency and missing rate per SNP.

Usage

```
snpgdsSNPRateFreq(gdsobj, sample.id=NULL, snp.id=NULL, with.id=FALSE,
    with.sample.id=FALSE, with.snp.id=FALSE)
```

Arguments

gdsobj	an object of class SNPGDSFileClass, a SNP GDS file
sample.id	a vector of sample id specifying selected samples; if NULL, all samples will be used $% \left(1\right) =\left(1\right) \left($
snp.id	a vector of snp id specifying selected SNPs; if NULL, all SNPs will be used
with.id	if TRUE, return both sample and SNP IDs
with.sample.id	if TRUE, return sample IDs
with.snp.id	if TRUE, return SNP IDs

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Value

Return a list:

AlleleFreq allele frequencies
MinorFreq minor allele frequencies

MissingRate missing rates

sample.id sample id, if with.id=TRUE or with.sample.id=TRUE snp.id SNP id, if with.id=TRUE or with.snp.id=TRUE

Author(s)

Xiuwen Zheng

See Also

snpgdsSampMissRate

Examples

```
# open an example dataset (HapMap)
genofile <- snpgdsOpen(snpgdsExampleFileName())

RV <- snpgdsSNPRateFreq(genofile, with.snp.id=TRUE)
head(data.frame(RV))

hist(RV$AlleleFreq, breaks=128)
summary(RV$MissingRate)

# close the file
snpgdsClose(genofile)</pre>
```

snpgdsSummary

Summary of GDS genotype file

Description

Print the information stored in the gds object

Usage

```
snpgdsSummary(gds, show=TRUE)
```

Arguments

gds a GDS file name, or an object of class ${\tt SNPGDSFileClass}$

show if TRUE, show information

Value

Return a list:

sample.id the IDs of valid samples snp.id the IDs of valid SNPs

92 snpgdsTranspose

Author(s)

Xiuwen Zheng

Examples

```
snpgdsSummary(snpgdsExampleFileName())
```

snpgdsTranspose

Transpose genotypic matrix

Description

Transpose the genotypic matrix if needed.

Usage

```
snpgdsTranspose(gds.fn, \ snpfirstdim=FALSE, \ compress=NULL, \ optimize=TRUE, \\ verbose=TRUE)
```

Arguments

gds.fn the file name of SNP GDS format

snpfirstdim if TRUE, genotypes are stored in snp-by-sample; if FALSE, sample-by-snp mode;

if NA, force to transpose the SNP matrix

compress the compression mode for SNP genotypes, optional values are defined in the

function of add.gdsn; if NULL, to use the compression mode

optimize if TRUE, call cleanup.gds after transposing

verbose if TRUE, show information

Value

None.

Author(s)

Xiuwen Zheng

```
# the file name of SNP GDS
(fn <- snpgdsExampleFileName())
# copy the file
file.copy(fn, "test.gds", overwrite=TRUE)
# summary
snpgdsSummary("test.gds")
# transpose the SNP matrix
snpgdsTranspose("test.gds", snpfirstdim=TRUE)</pre>
```

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```
# summary
snpgdsSummary("test.gds")

# delete the temporary file
unlink("test.gds", force=TRUE)
```

snpgdsVCF2GDS

Reformat VCF file(s)

CTIOTIC

if TRUE, show information

Description

Reformat Variant Call Format (VCF) file(s)

Usage

```
snpgdsVCF2GDS(vcf.fn, out.fn, method=c("biallelic.only", "copy.num.of.ref"),
    snpfirstdim=FALSE, compress.annotation="LZMA_RA", compress.geno="",
    ref.allele=NULL, ignore.chr.prefix="chr", verbose=TRUE)
```

Arguments

	vcf.fn	the file name of VCF format, vcf. fn can be a vector, see details
	out.fn	the file name of output GDS
	method	either "biallelic.only" by default or "copy.num.of.ref", see details
	snpfirstdim	if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs for the first individual, and then list all SNPs for the second individual, etc)
	compress.annota	ation
		the compression method for the GDS variables, except "genotype"; optional values are defined in the function add.gdsn
	compress.geno	the compression method for "genotype"; optional values are defined in the function add.gdsn
	ref.allele	NULL or a character vector indicating reference allele (like "A", "G", "T", NA,) for each site where NA to use the original reference allele in the VCF file(s). The length of character vector should be the total number of variants in the VCF file(s).
ignore.chr.prefix		
		a vector of character, indicating the prefix of chromosome which should be ignored, like "chr"; it is not case-sensitive

Details

verbose

GDS – Genomic Data Structures used for storing genetic array-oriented data, and the file format used in the gdsfmt package.

VCF – The Variant Call Format (VCF), which is a generic format for storing DNA polymorphism data such as SNPs, insertions, deletions and structural variants, together with rich annotations.

If there are more than one file names in vcf.fn, snpgdsVCF2GDS will merge all dataset together if they all contain the same samples. It is useful to combine genetic/genomic data together if VCF data are divided by chromosomes.

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method = "biallelic.only": to exact bi-allelic and polymorhpic SNP data (excluding monomorphic variants); method = "copy.num.of.ref": to extract and store dosage (0, 1, 2) of the reference allele for all variant sites, including bi-allelic SNPs, multi-allelic SNPs, indels and structural variants.

Haploid and triploid calls are allowed in the transfer, the variable snp.id stores the original the row index of variants, and the variable snp.rs.id stores the rs id.

When snp.chromosome in the GDS file is character, SNPRelate treats a chromosome as autosome only if it can be converted to a numeric value (like "1", "22"). It uses "X" and "Y" for non-autosomes instead of numeric codes. However, some software format chromosomes in VCF files with a prefix "chr". Users should remove that prefix when importing VCF files by setting ignore.chr.prefix = "chr".

Value

Return the file name of GDS format with an absolute path.

Author(s)

Xiuwen Zheng

References

The variant call format and VCFtools. Danecek P, Auton A, Abecasis G, Albers CA, Banks E, DePristo MA, Handsaker RE, Lunter G, Marth GT, Sherry ST, McVean G, Durbin R; 1000 Genomes Project Analysis Group. Bioinformatics. 2011 Aug 1;27(15):2156-8. Epub 2011 Jun 7.

```
http://corearray.sourceforge.net/
```

See Also

snpgdsBED2GDS

snpgdsVCF2GDS 95

```
# open "test1.gds"
(genofile <- snpgdsOpen("test1.gds"))</pre>
read.gdsn(index.gdsn(genofile, "sample.id"))
read.gdsn(index.gdsn(genofile, "snp.rs.id"))
read.gdsn(index.gdsn(genofile, "genotype"))
# close the file
snpgdsClose(genofile)
# open "test2.gds"
(genofile <- snpgdsOpen("test2.gds"))</pre>
read.gdsn(index.gdsn(genofile, "sample.id"))
read.gdsn(index.gdsn(genofile, "snp.rs.id"))
read.gdsn(index.gdsn(genofile, "genotype"))
# close the file
snpgdsClose(genofile)
# open "test3.gds"
(genofile <- snpgdsOpen("test3.gds"))</pre>
read.gdsn(index.gdsn(genofile, "sample.id"))
read.gdsn(index.gdsn(genofile, "snp.rs.id"))
read.gdsn(index.gdsn(genofile, "genotype"))
# close the file
snpgdsClose(genofile)
# open "test4.gds"
(genofile <- snpgdsOpen("test4.gds"))</pre>
read.gdsn(index.gdsn(genofile, "sample.id"))
read.gdsn(index.gdsn(genofile, "snp.rs.id"))
read.gdsn(index.gdsn(genofile, "snp.allele"))
read.gdsn(index.gdsn(genofile, "genotype"))
# close the file
snpgdsClose(genofile)
# open "test5.gds"
(genofile <- snpgdsOpen("test5.gds"))</pre>
read.gdsn(index.gdsn(genofile, "sample.id"))
read.gdsn(index.gdsn(genofile, "snp.rs.id"))
read.gdsn(index.gdsn(genofile, "snp.allele"))
read.gdsn(index.gdsn(genofile, "genotype"))
# close the file
snpgdsClose(genofile)
```

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```
# delete the temporary files
unlink(paste("test", 1:5, ".gds", sep=""), force=TRUE)
```

snpgdsVCF2GDS_R

Reformat a VCF file (R implementation)

Description

Reformat a Variant Call Format (VCF) file

Usage

```
snpgdsVCF2GDS_R(vcf.fn, out.fn, nblock=1024,
  method = c("biallelic.only", "copy.num.of.ref"),
  compress.annotation="LZMA_RA", snpfirstdim=FALSE, option = NULL,
  verbose=TRUE)
```

Arguments

vcf.fn the file name of VCF format, vcf.fn can be a vector, see details

out.fn the output gds file nblock the buffer lines

method either "biallelic.only" by default or "copy.num.of.ref", see details

 ${\tt compress.annotation}$

the compression method for the GDS variables, except "genotype"; optional

values are defined in the function add.gdsn

snpfirstdim if TRUE, genotypes are stored in the individual-major mode, (i.e, list all SNPs

for the first individual, and then list all SNPs for the second individual, etc)

option NULL or an object from snpgdsOption, see details

verbose if TRUE, show information

Details

GDS – Genomic Data Structures used for storing genetic array-oriented data, and the file format used in the gdsfmt package.

VCF – The Variant Call Format (VCF), which is a generic format for storing DNA polymorphism data such as SNPs, insertions, deletions and structural variants, together with rich annotations.

If there are more than one file name in vcf.fn, snpgdsVCF2GDS will merge all dataset together once they all contain the same samples. It is useful to combine genetic data if VCF data are divided by chromosomes.

method = "biallelic.only": to exact bi-allelic and polymorhpic SNP data (excluding monomorphic variants); method = "biallelic.only": to exact bi-allelic and polymorhpic SNP data; method = "copy.num.of.ref": to extract and store dosage (0, 1, 2) of the reference allele for all variant sites, including bi-allelic SNPs, multi-allelic SNPs, indels and structural variants.

Haploid and triploid calls are allowed in the transfer, the variable snp.id stores the original the row index of variants, and the variable snp.rs.id stores the rs id.

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The user could use option to specify the range of code for autosomes. For humans there are 22 autosomes (from 1 to 22), but dogs have 38 autosomes. Note that the default settings are used for humans. The user could call option = snpgdsOption(autosome.end=38) for importing the VCF file of dog. It also allows defining new chromosome coding, e.g., option = snpgdsOption(Z=27), then "Z" will be replaced by the number 27.

Value

None.

Author(s)

Xiuwen Zheng

References

The variant call format and VCFtools. Danecek P, Auton A, Abecasis G, Albers CA, Banks E, DePristo MA, Handsaker RE, Lunter G, Marth GT, Sherry ST, McVean G, Durbin R; 1000 Genomes Project Analysis Group. Bioinformatics. 2011 Aug 1;27(15):2156-8. Epub 2011 Jun 7.

See Also

snpgdsVCF2GDS_R, snpgdsOption, snpgdsBED2GDS

```
# The VCF file
vcf.fn <- system.file("extdata", "sequence.vcf", package="SNPRelate")
cat(readLines(vcf.fn), sep="\n")
snpgdsVCF2GDS_R(vcf.fn, "test1.gds", method="biallelic.only")
snpgdsSummary("test1.gds")
snpgdsVCF2GDS_R(vcf.fn, "test2.gds", method="biallelic.only")
snpgdsSummary("test2.gds")
snpgdsVCF2GDS_R(vcf.fn, "test3.gds", method="copy.num.of.ref")
snpgdsVCF2GDS_R(vcf.fn, "test4.gds", method="copy.num.of.ref")
snpgdsVCF2GDS_R(vcf.fn, "test4.gds", method="copy.num.of.ref")
snpgdsSummary("test4.gds")</pre>
```

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