## Package 'GWAS.BAYES'

May 15, 2024

Type Package

Title Bayesian analysis of Gaussian GWAS data

**Version** 1.15.0

Description This package is built to perform GWAS analysis using Bayesian techniques. Currently, GWAS.BAYES has functionality for the implementation of BICOSS (Williams, J., Ferreira, M. A., and Ji, T. (2022). BICOSS: Bayesian iterative conditional stochastic search for GWAS. BMC Bioinformatics), BGWAS (Williams, J., Xu, S., Ferreira, M. A.. (2023) `BGWAS: Bayesian variable selection in linear mixed models with nonlocal priors for genome-wide association studies." BMC Bioinformatics), and IEB. All methods currently are for the analysis of Gaussian phenotypes The research related to this package was supported in part by National Science Foundation awards DMS 1853549, DMS 1853556, and DMS 2054173.

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**Encoding** UTF-8

LazyData true

biocViews Bayesian, AssayDomain, SNP, GenomeWideAssociation

**Imports** GA (>= 3.2), caret (>= 6.0-86), memoise (>= 1.1.0), Matrix (>= 1.2-18), limma (>= 3.54.0), stats (>= 4.2.2), MASS (>= 7.3-58.1)

**Depends** R (>= 4.3.0)

Suggests BiocStyle, knitr, rmarkdown, formatR, rrBLUP

VignetteBuilder knitr

RoxygenNote 7.2.3

git\_url https://git.bioconductor.org/packages/GWAS.BAYES

git\_branch devel

git\_last\_commit 963cbb5

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

Repository Bioconductor 3.20

**Date/Publication** 2024-05-15

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```
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**BGWAS** 

Performs BGWAS analysis as in the BGWAS manuscript.

#### **Description**

Performs BGWAS analysis as in the BGWAS manuscript.

#### Usage

```
BGWAS(
   Y,
   SNPs,
   FDR_Nominal = 0.05,
   kinship = diag(nrow(SNPs)),
   tau = "IG",
   maxiterations = 4000,
   runs_til_stop = 400
)
```

## Arguments

Υ	The observed numeric phenotypes
SNPs	The SNP matrix, where each column represents a single SNP encoded as the numeric coding 0, 1, 2. This is entered as a matrix object.
FDR_Nominal	The nominal false discovery rate for which SNPs are selected from in the screening step. Defaulted at 0.05.
kinship	The observed kinship matrix, has to be a square positive semidefinite matrix. Defaulted as the identity matrix. The function used to create the kinship matrix used in the BICOSS paper is A.mat() from package rrBLUP.

BICOSS 3

This specifies the prior or the fixed value for the nonlocal prior on the SNP effects. To specify the Inverse Gamma prior set tau = "IG". To specify fixed values of tau set tau = 0.022. Fixed values explored in the BBGWAS manuscript were 0.022 and 0.348.

The maximum iterations the genetic algorithm in the model selection step iterates for. Defaulted at 400 which is the value used in the BICOSS paper simulation studies.

runs\_til\_stop The number of iterations at the same best model before the genetic algorithm in the model selection step converges. Defaulted at 40 which is the value used in

the BICOSS paper simulation studies.

#### Value

maxiterations

A named list that includes the output from the screening step and the output from the model selection step. The model proposed by the BGWAS method is the output of the model selection step.

#### **Examples**

```
library(GWAS.BAYES)
BGWAS(Y = Y, SNPs = SNPs, kinship = kinship,
    FDR_Nominal = 0.05, tau = "IG",
    maxiterations = 400,runs_til_stop = 40)
```

**BICOSS** 

BICOSS for Gaussian Phenotypes

#### **Description**

Performs BICOSS analysis as described in Williams, J., Ferreira, M.A.R. & Ji, T. BICOSS: Bayesian iterative conditional stochastic search for GWAS. BMC Bioinformatics 23, 475 (2022). https://doi.org/10.1186/s12859-022-05030-0.

## Usage

```
BICOSS(
    Y,
    SNPs,
    FDR_Nominal = 0.05,
    kinship = diag(nrow(SNPs)),
    maxiterations = 400,
    runs_til_stop = 40,
    P3D = TRUE
)
```

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#### **Arguments**

Υ The observed numeric phenotypes **SNPs** The SNP matrix, where each column represents a single SNP encoded as the numeric coding 0, 1, 2. This is entered as a matrix object. FDR\_Nominal The nominal false discovery rate for which SNPs are selected from in the screening step. The observed kinship matrix, has to be a square positive semidefinite matrix. kinship Defaulted as the identity matrix. The function used to create the kinship matrix used in the BICOSS paper is A.mat() from package rrBLUP. maxiterations The maximum iterations the genetic algorithm in the model selection step iterates for. Defaulted at 400 which is the value used in the BICOSS paper simulation studies. runs\_til\_stop The number of iterations at the same best model before the genetic algorithm in the model selection step converges. Defaulted at 40 which is the value used in the BICOSS paper simulation studies. P3D Population previous determined, if TRUE BICOSS uses approximated variance parameters estimated from the baseline model when conducting both the screening and the model selection steps. Setting P3D = TRUE is significantly faster. If

FALSE, uses exact estimates of the variance parameters all models in both the

#### Value

The column indices of SNPs that were in the best model identified by BICOSS.

screening and model selection step.

#### **Examples**

```
library(GWAS.BAYES)
BICOSS(Y = Y, SNPs = SNPs, kinship = kinship,
    FDR_Nominal = 0.05,P3D = TRUE,
    maxiterations = 400,runs_til_stop = 40)
```

IEB

IEB for Gaussian Phenotypes

## Description

Performs IEB

## Usage

```
IEB(
Y,
SNPs,
kinship,
```

kinship 5

```
FDR_Nominal = 0.05,
maxiterations = 400,
runs_til_stop = 40
)
```

#### **Arguments**

Y The observed numeric phenotypes

SNPs The SNP matrix, where each column represents a single SNP encoded as the

numeric coding 0, 1, 2. This is entered as a matrix object.

kinship The observed kinship matrix, has to be a square positive semidefinite matrix.

Defaulted as the identity matrix. The function used to create the kinship matrix

used in the BICOSS paper is A.mat() from package rrBLUP.

FDR\_Nominal The nominal false discovery rate for which SNPs are selected from in the screen-

ing step.

maxiterations The maximum iterations the genetic algorithm in the model selection step iter-

ates for. Defaulted at 400 which is the value used in the BICOSS paper simula-

tion studies.

runs\_til\_stop The number of iterations at the same best model before the genetic algorithm in

the model selection step converges. Defaulted at 40 which is the value used in

the BICOSS paper simulation studies.

#### Value

The column indices of SNPs that were in the best model identified by BICOSS.

#### **Examples**

```
library(GWAS.BAYES)
IEB(Y = Y, SNPs = SNPs, kinship = kinship,
    FDR_Nominal = 0.05,
    maxiterations = 400,runs_til_stop = 40)
```

kinship

A. Thaliana Kinship matrix

#### **Description**

This is a kinship matrix from the TAIR9 genotype information for 328 A. Thaliana Ecotypes from the paper Components of Root Architecture Remodeling in Response to Salt Stress. The kinship matrix was computed using all SNPs with minor allele frequency greater than 0.01.

#### Usage

kinship

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#### **Format**

## 'kinship' A matrix with 328 rows and 328 columns corresponding to the 328 ecotypes.

SMA Performs Single Marker Association tests for both Linear Mixed Models and Linear models.

#### **Description**

Performs Single Marker Association tests for both Linear Mixed Models and Linear models.

#### Usage

```
SMA(Y, SNPs, kinship = FALSE, P3D = FALSE)
```

#### **Arguments**

Υ	The observed	numeric p	henotypes

SNPs The SNP matrix, where each column represents a single SNP encoded as the

numeric coding 0, 1, 2. This is entered as a matrix object.

kinship The observed kinship matrix, has to be a square positive semidefinite matrix.

Defaulted as the identity matrix. The function used to create the kinship matrix

used in the BICOSS paper is A.mat() from package rrBLUP.

P3D Population previous determined, if TRUE BICOSS uses approximated variance

parameters estimated from the baseline model when conducting both the screening and the model selection steps. Setting P3D = TRUE is significantly faster. If FALSE, uses exact estimates of the variance parameters all models in both the

screening and model selection step.

#### Value

The p-values corresponding to every column provided in SNPs. These p-values can be used with any threshold of your choosing or with p.adjust().

SNPs A. Thaliana Genotype matrix

#### **Description**

This is a matrix with 328 observations and 9,000 SNPs. Each row is contains 9,000 SNPs from a single A. Thaliana ecotype in the paper Components of Root Architecture Remodeling in Response to Salt Stress.

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## Usage

SNPs

#### **Format**

## 'SNPs' A matrix with 328 observations and 9,000 SNPs.

Υ

A. Thaliana Simulated Phenotype matrix

## Description

This is a phenotype matrix simulated from the 9,000 SNPs. SNPs at positions 450, 1350, 2250, 3150, 4050, 4950, 5850, 6750, 7650, and 8550 have nonzero coefficients. Further, the data was simulated under the linear mixed model specified in the vignette and the BICOSS manuscript using the kinship matrix (kinship).

## Usage

Υ

#### **Format**

## 'Y' A matrix with 328 rows corresponding to the 328 ecotypes.

# **Index**

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