Package 'ARZIMM'

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Title Statistical modeling and inference of microbial interaction and stability for microbial dynamical systems
Version 0.0.0.9000
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Description This package is developed to model microbial dynamical systems from longitudinal microbiame data and infer microbial interaction and stability. ARZIMM models the excess zero abundance and the non-zero abundances separately; and use a random effect model to borrow strength across subjects.
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ARZIMM-package	ARZIMM: Statistical modeling and inference of microbial interaction
	and stability for microbial dynamical systems

Description

This package is developed to model microbial dynamical systems from longitudinal microbiome data and infer microbial interaction and stability.

Details

Package: ARZIMM
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Author(s)

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References

Modeling and inference of microbial interaction and stability on the longitudinal microbiome data

```
## Not run:
require(ARZIMM),
data(sampleparameters)
set.seed(1234)
simMixTime(baseFdataN2M=parameters$baseFdataN2M,conFdataN2L=parameters$conFdataN2L,timeN=parameters$timeN,
interceptM=parameters$interceptM,betaMM=parameters$betaMM,gammaLM=parameters$gammaLM,
sigmaM=parameters$sigmaM,biN2M=parameters$biN2M)

data(sampledata)
Varname=colnames(sampledata)[1:20]
Conname=colnames(sampledata)[21:26]
Tname=colnames(sampledata)[27]
IDname=colnames(sampledata)[28]
ARZIMM::ARZIMM(Varname = Varname,Conname = Conname,fdata = sampledata,
IDname = IDname,Tname = Tname,bootpara=list(bootpval=TRUE,nboot=100))

## End(Not run)
```

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ARZIMM

Auto-Regressive Zero-Inflated Mixed Model

Description

This function allows you to fit the ARZIMM.

Usage

```
ARZIMM(
  phy,
  Varname,
  Conname = NA,
  Covname = NA,
  IDname = "ID",
  Tname = "Time",
  fdata = NULL,
  family = "Poisson",
   ...
)
```

Arguments

phy	A phyloseq-class experiment-level object example data. See \DataphyExample
Varname	a vector of character string indicating the taxa names in the non-zero autoregressive model
Conname	a vector of character string indicating the concomitant variable names in the zero state logit model
Covname	a vector of character string indicating the covariate names in the non-zero autoregressive model
IDname	a character string indicating the subject ID. Default is ID
Tname	a character string indicating the time variable. Default is Time
fdata	a data frame containing all variables to be analysized
family	a character string indicating the distribtuion. default is Poisson
	See ARZIMM.control

Value

an object of class "ARZIMMObject" is returned, which is a list with the ingredients of fit.

nwtable the matrix of network table of fit mseest a list of mean square error:

rmseest the root square of mean standard error

rmseest the root square of mean pearson standardized error

paralist a list of parameter estimates:

beta the matrix of fixed effects for the non-zero auto-regressive model **gamma** the matrix of fixed effects for the zero state logit model

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> sigma the measurement error standard deviation for both the non-zero autoregressive model and the zero state logit model

> ciest the estimated random effects part of both the non-zero auto-regressive model and the zero state logit model

runtime running time of the program an object of class "ARZIMMData"

resultall a list of parameter estimates of the fits with ingredients of the lambda

bootparapval a list of p values obtain via bootstrap with componenets:

betapval a vector of p values of fixed effects for the non-zero auto-regressive

gammapval a vector of p values of fixed effects for the zero state logit model **sigmapval** a vector of p values of the measurement error standard deviation for both the non-zero auto-regressive model and the zero state logit model

tunlist the values of parameters used in the fits with components:

> lambdabeta the values of lambda used in the non-zero auto-regressive model lambdagamma the values of lambda used in the zero state logit model weight1all observation weights used in the non-zero auto-regressive model

a list of parameters used to initial the ARZIMM program with components:

initpara a list of initial parameter inputs; if the inputs are absent, default values are included

lambda the values of lambda used in the fits.

tunpara a list of tunning parameter inputs; if the inputs are absent, default values are included

selectpara a list of selection parameter inputs; if the inputs are absent, default values are included

See Also

ARZIMM.control

datalist

parasetup

```
data(phyExample)
Varname=colnames(otu_table(phyExample))
Conname=colnames(sample_data(phyExample))[1:6]
Tname=colnames(sample_data(phyExample))[7]
IDname=colnames(sample_data(phyExample))[8]
ARZIMMresult=ARZIMM::ARZIMM(phyExample, Varname = Varname, Conname = Conname,
IDname = IDname,Tname = Tname,bootpara=list(bootpval=TRUE,nboot=5))
data(sampledata)
Varname=colnames(sampledata)[1:20]
Conname=colnames(sampledata)[21:26]
Tname=colnames(sampledata)[27]
IDname=colnames(sampledata)[28]
```

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```
ARZIMMresult=ARZIMM::ARZIMM(phy=NULL, Varname = Varname, Conname = Conname, fdata=sampledata, IDname = IDname, Tname = Tname, bootpara=list(bootpval=TRUE, nboot=5))
```

ARZIMM.control

internal ARZIMM parameters

Description

View and/or change the factory default parameters in ARZIMM

Usage

```
ARZIMM.control(
  initpara = list(betaini = NULL, gammaini = NULL, sigmaini = NULL, weight1all = NULL,
    weight2all = NULL, calini = TRUE, iniw = FALSE),
  tunpara = list(lambdaseq1 = NULL, lambdaseq2 = NULL, ntun = 50, epsilon = c(50000, 5)),
  selectpara = list(selgamma = TRUE, selcri = "BIC", pen = "adalasso"),
  bootpara = list(bootpval = TRUE, nboot = 500)
)
```

Arguments

initpara

a named list of user-specified initial values:

betaini the matrix of fixed effects for the non-zero auto-regressive model **gammaini** the matrix of fixed effects for the zero state logit model

sigmaini the measurement error standard deviation for both the non-zero autoregressive model and the zero state logit model

weight1all observation weights for the non-zero auto-regressive model. Default is 1 for each observation

weight2all observation weights for the zero state logit model. Default is 1 for each observation

calini=T logical; should initial parameters be calculated. Default is Ture

iniw logical; should observation weights be calculated according to initial parameters. Default is False When this list of initial values does not contain some of these components or contains components not of the appropriate length, then the default initial values are used instead.

tunpara

a list of control values with components:

lambdaseq1 a user supplied lambda sequence for the non-zero auto-regressive model. Typical usage is to have the program compute its own lambda sequence. Supplying a value of lambda overrides this. WARNING: use with care. Avoid supplying a single value for lambda

lambdaseq2 a user supplied lambda sequence for the zero state logit model.
Typical usage is to have the program compute its own lambda sequence.
Supplying a value of lambda overrides this. WARNING: use with care.
Avoid supplying a single value for lambda

ntun the number of lambda values - default is 50 **epsilon** the range of lambda values; default= c(5e4.5)

selectpara

a list of control values with components:

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selgamma logical; should concomitant variables in the zero state logit model be selected

selcri method to be use for variable selection. Currently three options. The default is BIC. Other choices are AIC and CV

pen penalty; defualt is 'adalasso'

bootpara a list of control values with components:

bootpval logical; should p value be calculated using bootstrap **nboot** the number of bootstrap simulations; default is 500

Details

If called with no arguments, ARZIMM.control() returns a list with the current settings of these parameters. Any arguments included in the call sets those parameters to the new values, and then silently returns. The values set are persistent for the duration of the R session.

Value

A list with named elements as in the argument list

Author(s)

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See Also

ARZIMM

Examples

```
ARZIMM.control(bootpara=list(bootpval=FALSE))
ARZIMM.control(selectpara=list(selgamma=FALSE,pen='lasso'))
```

emnr

EM algorithm

Description

EM algorithm used in the ARZIMM model.

Usage

```
emnr(data, para, weight, family, selgamma = FALSE)
```

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Arguments

data a list of data with componenets:

yFdata a vector of

xFdata a matrix of variables corresponding to the non-zero auto-regressive

mode

conFdata a matrix of covariates corresponding to the zero state logit model

group a vector of numbers as group indicator

para a list of parameter estimates:

beta initial value for beta

gamma initial value for gammasigma initial value for sigma

weight a vector of observation weightsfor both the non-zero auto-regressive model and

the zero state logit model

family a character string indicating the distribtuion. default is Poisson

selgamma logical; should concomitant variables in the zero state logit model be selected

Value

a list of fits

para a list of parameter estimates:

beta beta estimates

gamma gamma estimates **sigma** sigma estimates

ciestm the estimated random effects

conv logical; did the algorithm converged

df the number of non-zero parameter estimates bic a vector of BIC, AIC, and log likelihood

mse a vector of square root of mean (pearson) standard error

lambda a vector of lambda sequence

parameters A list of parameters for simulation

Description

This data is a list object which contains the baseline OTU table, sample data, time number and parameters beta matrix gamma matrix sigma and random effects. Details see reference.

Usage

data("parameters")

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Format

A list with 8 objects as following.

baseFdataN2M a numeric matrix containing baseline OTU table

conFdataN2L a numeric matrix containing time-independent concomitant variables

timeN a numeric indicating total number of time points to simulate

interceptM a numeric vector indicating intercept of non-zero autoregressive model

betaMM a numeric matrix indicating the interaction matrix

gammaLM a numeric matrix indicating fixed effects for the zero state logit model

sigmaM a numeric vector indicating the measurement error standard deviation for the non-zero auto-regressive model

biN2M a numeric vector indicating the random effects part of the non-zero auto-regressive model

Examples

data(parameters)

phyExample

A phyloseq-class experiment-level object example data.

Description

This data is a phyloseq-class object which contains the OTU table, sample data, taxonomy table and phylogenetic tree information. Details about the phyloseq class please see the R package "phyloseq".

Usage

```
data("phyExample")
```

Format

A phyloseq-class experiment-level object

otu_table() OTU Table: [20 taxa and 1050 samples]

- ..@ .Data: a matrix where each row represents the suject, each column represents the OTU.
- ..@ taxa_are_rows: logi FALSE

sample_data() Sample Data: [1050 samples by 8 sample variables]

A data frame with 1050 observations for six covariates w1...w6 and two variables time and subjid.

w1...w6: numeric vectors as binary covariates;

time: a numeric vector indicating the time of sampling;

subjid: a string vector indicating which subject the sample belonging to.

```
data(phyExample)
```

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sampledata

a data frame containing all variables to be analysized

Description

This is a data frame object which contains OTU varalbes, concomitant variables, time variable and subject ID.

Usage

```
data("sampledata")
```

Format

A data frame with 1050 observations on the following 28 variables.

```
M1\dots M20\, numeric vectors indicating the absolute abundance of taxa
```

w1...W6 numeric vectors indicating the value of concomitant variables

time a numeric vector indicating the time of sampling

subjid a factor indicating the subject IDs

Examples

```
data(sampledata)
```

simMixTime

A simulation function

Description

Simulation for the ARZIMM model.

Usage

```
simMixTime(
  baseFdataN2M,
  conFdataN2L,
  timeN,
  interceptM,
  betaMM,
  gammaLM = NULL,
  sigmaM,
  biN2M = NULL,
  family = "Poisson"
)
```

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Arguments

baseFdataN2M a matrix of absolute counts at baseline time

conFdataN2L a matrix of concomitant variables

timeN a vector of the number of time points for each subjects

interceptM a vector of the intercepts of the non-zero autoregression model

betaMM a matrix of network table

gammaLM a matrix of the zero state logit model

sigmaM a vector of the measurement error standard deviation for the non-zero autore-

gression model

biN2M a vector of the random effects for the non-zero autoregression model

family a character string indicating the distribtuion. default is Poisson

Value

a list of simulations:

otu. tab a data frame of OTU table

convar a data frame of concomitant variables

subjid a vector of subject-time IDs

df the number of non-zero parameter estimates

zi a list of the random effects

```
require(ARZIMM)
data(parameters)

set.seed(1234)
sim.otu.tab=simMixTime(baseFdataN2M=parameters$baseFdataN2M, conFdataN2L=parameters$conFdataN2L,
timeN=parameters$timeN, interceptM=parameters$interceptM, betaMM=parameters$betaMM,
gammaLM=parameters$gammaLM, sigmaM=parameters$sigmaM, biN2M=parameters$biN2M)

fdata=cbind(sim.otu.tab[[1]], sim.otu.tab[[2]], subjid=sim.otu.tab[[3]])
Varname=colnames(sim.otu.tab[[1]])
Conname=colnames(sim.otu.tab[[2]])[-ncol(sim.otu.tab[[2]])]
IDname='subjid'
Tname='time'

#### NOT RUN
# ARZIMMresult=ARZIMM::ARZIMM(phy=NULL, Varname = Varname, Conname = Conname, fdata=fdata,
# IDname = IDname, Tname = Tname)
```

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