# Package 'GIMMEgVAR'

May 16, 2024

Title Group Iterative Multiple Model Estimation with 'graphicalVAR'

Type Package

Version 0.1.0
Imports graphicalVAR, here, qgraph, png
Data-driven approach for arriving at person-specific time series models from within a Graphical Vector Autoregression (VAR) framework. The method first identifies which relations replicate across the majority of individuals to detect signal from noise. These group-level relations are then used as a foundation for starting the search for person-specific (or individual-level) relations. All estimates are obtained uniquely for each individual in the final models. The method for the 'graphicalVAR' approach is found in Epskamp, Waldorp, Mottus & Borsboom (2018) <doi:10.1080 00273171.2018.1454823="">.</doi:10.1080>
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R topics documented:
environmentSetup
1

2 fitGIMMEgVAR

	fitGraphicalVAR																		 				5
																		 				7	
	graphKappa																		 				9
	prepareData																		 				10
	sampleData																		 				11
Index																							12
environmentSetup GIMMEgV							Er	ıvir	on	ım	eni	t S	'etı	ир									

# **Description**

Loads needed packages and creates directories where logfiles and output from 'GIMMEgVAR' will be stored

# Usage

```
environmentSetup(outputPath)
```

## **Arguments**

outputPath

The user specified path to the directory where results files should be stored.

 ${\tt fitGIMMEgVAR}$ 

FIT 'GIMMEgVAR'

# **Description**

This function fits 'GIMMEgVAR' using the original input data supplied by the user and the logical matrices that result across people after fitting individual 'graphicalVAR'. The logical matrices are determined via the gimmeThreshold specified by the user

# Usage

```
fitGIMMEgVAR(
   inData,
   variableNames,
   gimmeGVARThreshold = 0.5,
   nLambda = 50,
   verbose = TRUE,
   gamma = 0.5,
   scale = TRUE,
   lambda_beta,
   lambda_kappa,
   maxit.in = 100,
   maxit.out = 100,
```

fitGIMMEgVAR 3

```
deleteMissings = TRUE,
  penalize.diagonal = TRUE,
  lambda_min_kappa = 0.05,
  lambda_min_beta = lambda_min_kappa,
 mimic = c("current", "0.1.2", "0.1.4", "0.1.5", "0.2"),
 beepvar,
  dayvar,
  idvar,
  lags = 1,
  centerWithin = TRUE,
  likelihood = c("unpenalized", "penalized"),
  logicals,
 RES_matrixData,
 outputPath,
  labelNames = variableNames
)
```

## **Arguments**

inData A matrix or data frame containing repeated measures (rows) on a set of variables

(columns). Must not contain missing data.

variableNames The vector containing name of variables to be analyzed

gimmeGVARThreshold

The cutoff value for group-level paths. Defaults to .50, indicating that a path

must be non-zero across >= .50 included as a group-level path.

nLambda The number of both lambda parameters to test. Defaults to 50, which results in

2500 models to evaluate.

verbose Logical, should a progress bar be printed to the console?

gamma The EBIC hyper-parameter. Set to 0 to use regular BIC.

scale Logical, should responses be standardized before estimation?

lambda\_beta An optional vector of lambda beta values to test. Set lambda beta = 0 argument

and lambda\_kappa = 0 for unregularized estimation.

lambda\_kappa An optional vector of lambda\_kappa values to test. Set lambda\_beta = 0 argu-

ment and lambda\_kappa = 0 for unregularized estimation.

maxit.in Maximum number of iterations in the inner loop (computing beta)

maxit.out Maximum number of iterations in the outer loop

deleteMissings Logical, should missing responses be deleted?

penalize.diagonal

Logical, should the diagonal of beta be penalized (i.e., penalize auto-regressions)?

lambda\_min\_kappa

Multiplier of maximal tuning parameter for kappa

lambda\_min\_beta

Multiplier of maximal tuning parameter for beta

mimic Allows one to mimic earlier versions of 'graphicalVAR'

4 fitGIMMEgVAR

beepvar String indicating assessment beep per day (if missing, is added). Adding this

argument will cause non-consecutive beeps to be treated as missing!

dayvar String indicating assessment day. Adding this argument makes sure that the first

measurement of a day is not regressed on the last measurement of the previous day. IMPORTANT: only add this if the data has multiple observations per day.

idvar String indicating the subject ID

lags Vector of lags to include

centerWithin logical, should subject data be within-person centered before estimating fixed

effects?

likelihood Should likelihood be computed based on penalized contemporaneous matrix or

logicals Logical matrices that determine which elements of the beta and kappa matri-

ces will be regularized when fitting 'GIMMEgVAR'. The matrices are determined in the algorithm by obtaining counts across all fitted individual network results for beta and kappa, respectively. Elements with proportions >= gimmeG-VARThreshold value will not be regularized when fitting 'GIMMEgVAR'.

RES\_matrixData List containing results of fitting individual 'graphicalVAR' to each individual.

outputPath The user specified path to the directory where results files should be stored.

labelNames Vector of names used to label nodes in Network graph. Defaults to variable

names if no vector is supplied.

#### **Details**

The user can pass in additional 'graphicalVAR' options as specified in the R package 'graphical-VAR' created by Sacha Epskamp. See 'graphicalVAR' documentation for details.

The following results are returned in the 'GIMMEgVAR' Files directory: (1) Data frames containing individual paths. These are the person-specific results for each individual obtained by not regularizing the group paths indicated by the logical matrices for both beta and kappa. They are prefaced RESULTS\_GIMMEgVAR\_SUBJECT\_.

- (2) Data frames that indicate the proportion of paths across individuals: These are dataframes containing the proportion of paths present across individuals after fitting 'GIMMEgVAR'. These proportions are used to determine the final group model. They are named proportionKappa.RData and proportionBeta.RData.
- (3) Group path data frames for beta and kappa: These are dataframes with 1 indicating the presence of a group path and 0 indicating the absence of a group path. These data frames are derived from #2 above for both beta and kappa. They are the dataframes used to graph the final group models and are prefaced GIMMEgVAR\_RESULTS\_GRP\_BETA\_THRESHOLD\_ and GIMMEgVAR\_RESULTS\_GRP\_KAPPA\_THRESHOLD\_. The number following threshold indicates the gimmeThreshold used for the analysis.
- (4) Final network graphs are added to the gimmegvarFiles folder in .png format. These contain overlay graphs of the group and individual paths for the beta and kappa network respectively.

fitGraphicalVAR 5

fitGraphicalVAR fitgraphicalVAR

# **Description**

Fits 'graphicalVAR' with defaults used in 'graphicalVAR' package developed by Sacha Epskamp. See 'graphicalVAR' documentation by Sacha Epskamp for details.

## Usage

```
fitGraphicalVAR(
  data,
  nLambda = 50,
 verbose = TRUE,
  gamma,
  scale = TRUE,
  lambda_beta,
  lambda_kappa,
  regularize_mat_beta,
  regularize_mat_kappa,
 maxit.in = 100,
 maxit.out = 100,
  deleteMissings = TRUE,
  penalize.diagonal = TRUE,
  lambda_min_kappa = 0.05,
  lambda_min_beta = lambda_min_kappa,
 mimic = c("current"),
  variableNames,
 beepvar,
  dayvar,
  idvar,
  lags = 1,
  centerWithin = TRUE,
  likelihood = c("unpenalized", "penalized"),
  outputPath
)
```

# **Arguments**

data	A matrix or data frame containing repeated measures (rows) on a set of variables (columns). Must not contain missing data.
nLambda	The number of both lambda parameters to test. Defaults to 50, which results in 2500 models to evaluate.
verbose	Logical, should a progress bar be printed to the console?
gamma	The EBIC hyper-parameter. Set to 0 to use regular BIC.
scale	Logical, should responses be standardized before estimation?

6 fitGraphicalVAR

lambda\_beta An optional vector of lambda\_beta values to test. Set lambda\_beta = 0 argument

and lambda\_kappa = 0 for unregularized estimation.

lambda\_kappa An optional vector of lambda\_kappa values to test. Set lambda\_beta = 0 argu-

ment and lambda\_kappa = 0 for unregularized estimation.

regularize\_mat\_beta

A logical matrix indicating which elements of the beta matrix should be regu-

larized (experimental).

regularize\_mat\_kappa

A logical matrix indicating which elements of the kappa matrix should be regu-

larized (experimental).

maxit.in Maximum number of iterations in the inner loop (computing beta)

maxit.out Maximum number of iterations in the outer loop

deleteMissings Logical, should missing responses be deleted?

penalize.diagonal

Logical, should the diagonal of beta be penalized (i.e., penalize auto-regressions)?

lambda\_min\_kappa

Multiplier of maximal tuning parameter for kappa

lambda\_min\_beta

Multiplier of maximal tuning parameter for beta

mimic Allows one to mimic earlier versions of 'graphicalVAR' variableNames The vector containing name of variables to be analyzed

beepvar String indicating assessment beep per day (if missing, is added). Adding this

argument will cause non-consecutive beeps to be treated as missing!

dayvar String indicating assessment day. Adding this argument makes sure that the first

measurement of a day is not regressed on the last measurement of the previous day. IMPORTANT: only add this if the data has multiple observations per day.

idvar String indicating the subject ID

lags Vector of lags to include

centerWithin logical, should subject data be within-person centered before estimating fixed

effects?

likelihood Should likelihood be computed based on penalized contemporaneous matrix or

outputPath The user specified path to the directory where results files should be stored.

## Details

The following results are returned in the gvarFiles directory: (1) Separate data frames containing the usual individual 'graphicalVAR' results. These dataframes contain the person-specific results for each individual obtained by fitting 'graphicalVAR'. They are prefixed RESULTS\_GVAR\_SUBJECT The number of data frames returned equals the number of individuals whose models were successfully fitted from the input data file.

GIMMEgVAR 7

GIMMEgVAR

GIMMEgVAR' This function calls all the functions needed to fit 'GIM-MEgVAR'.

## **Description**

GIMMEgVAR'. This function calls all the functions needed to fit 'GIMMEgVAR'.

## Usage

```
GIMMEgVAR(
  outputPath,
  data,
  nLambda = 50,
  verbose = TRUE,
  gamma,
  scale = TRUE,
  lambda_beta,
  lambda_kappa,
  regularize_mat_beta,
  regularize_mat_kappa,
 maxit.in = 100,
 maxit.out = 100,
  deleteMissings = TRUE,
  penalize.diagonal = TRUE,
  lambda_min_kappa = 0.05,
  lambda_min_beta = lambda_min_kappa,
 mimic = c("current"),
  variableNames,
  beepvar,
  dayvar,
  idvar,
  lags = 1,
  centerWithin = TRUE,
  likelihood = c("unpenalized", "penalized"),
  gimmeGVARThreshold = 0.5,
  labelNames = variableNames
)
```

## **Arguments**

outputPath The user specified path to the directory where results files should be stored.

data A matrix or data frame containing repeated measures (rows) on a set of variables

(columns). Must not contain missing data.

nLambda The number of both lambda parameters to test. Defaults to 50, which results in

2500 models to evaluate.

8 GIMMEgVAR

verbose Logical, should a progress bar be printed to the console?

gamma The EBIC hyper-parameter. Set to 0 to use regular BIC.

scale Logical, should responses be standardized before estimation?

lambda\_beta An optional vector of lambda beta values to test. Set lambda beta = 0 argument

and lambda\_kappa = 0 for unregularized estimation.

lambda\_kappa An optional vector of lambda\_kappa values to test. Set lambda\_beta = 0 argu-

ment and lambda\_kappa = 0 for unregularized estimation.

regularize\_mat\_beta

A logical matrix indicating which elements of the beta matrix should be regularized (experimental). Note: In 'GIMMEgVAR' this matrix is determined and set for the user based on their gimmeThreshold and the results of fitting individual 'graphicalVAR' across all individuals. The logical matrix used to fit determine which elements of the beta matrix are regularized is returned in the gimmegvarFiles folder and is named logicalKappa.

regularize\_mat\_kappa

A logical matrix indicating which elements of the kappa matrix should be regularized (experimental). Note: In 'GIMMEgVAR' this matrix is determined and set for the user based on their gimmeThreshold and the results of fitting individual 'graphicalVAR' across all individuals. The logical matrix used to fit determine which elements of the beta matrix are regularized is returned in the

gvarFiles folder and is named logicalKappa.

maxit.in Maximum number of iterations in the inner loop (computing beta)

maxit.out Maximum number of iterations in the outer loop deleteMissings Logical, should missing responses be deleted? penalize.diagonal

Logical, should the diagonal of beta be penalized (i.e., penalize auto-regressions)?

lambda\_min\_kappa

Multiplier of maximal tuning parameter for kappa

lambda\_min\_beta

Multiplier of maximal tuning parameter for beta

mimic Allows one to mimic earlier versions of graphicalVAR

variableNames The vector containing name of variables to be analyzed in the network model beepvar String indicating assessment beep per day (if missing, is added). Adding this

argument will cause non-consecutive beeps to be treated as missing!

dayvar String indicating assessment day. Adding this argument makes sure that the first

measurement of a day is not regressed on the last measurement of the previous day. IMPORTANT: only add this if the data has multiple observations per day.

idvar String indicating the subject ID

lags Vector of lags to include

centerWithin logical, should subject data be within-person centered before estimating fixed

effects?

likelihood Should likelihood be computed based on penalized contemporaneous matrix or

unpenalized contemporaneous matrix. Set to "penalized" to mimic version 2.5

and later of sparseTSCGM.

graphKappa 9

gimmeGVARThreshold

The cutoff value for group-level paths. Defaults to .50, indicating that a path

must be non-zero across >= .50 included as a group-level path.

labelNames Vector of names used to label nodes in Network graph. Defaults to variable

names if no vector is supplied.

#### Value

Returns a list containing 7 elements. The first 6 elements are the group level results indicating the count, proportion and presence (coded 1 for present, 0 for absent) of the edges estimated by the algorithm in the kappa and beta matrices. These results are stored in matrix objects named pathCountBeta, pathProportionBeta, groupBeta and pathCountKappa, pathProportionKappa, and groupKappa respectively and are used to construct the final group level network. The remaining element is a list which contains the person-specific network results for every subject in the data. This is estimated using information from the group-level network model. Along with the the data used to estimate the networks, it contains the following for each subject:

PCC The partial contemporaneous correlation network

PDC The partial directed correlation network

beta The estimated beta matrix kappa The estimated kappa matrix

EBIC The optimal EBIC

path Results of all tested tuning parameters
labels A vector containing the node labels

data A "tsData" object detailing the features of the data used for estimating the net-

work

graphKappa GIMMEgVAR: GraphGIMMEgVAR

## **Description**

Produces network graphs for beta and kappa matrices as .png files.

## Usage

```
graphKappa(
  outputPathGIMMEgVAR,
  gimmeGVARThreshold,
  pathProportionKappa,
  lableNames,
  groupKappa
)
```

10 prepareData

### **Arguments**

outputPathGIMMEgVAR

Directory where network graphs will be saved.

gimmeGVARThreshold

The cutoff value for group-level paths. Defaults to .50, indicating that a path must be non-zero across >= .50 included as a group-level path.

pathProportionKappa

The proportion of individuals identified as having a path in the Kappa matrix. Used to determine group-level paths in the final group Kappa network.

lableNames Vector of names used to label nodes in Network graph. Defaults to variable

names if no vector is supplied.

groupKappa Matrix that identifies the presence of a group path in the Kappa matrix. 0 indi-

cates no group path present, 1 indicates group path present.

#### **Details**

Group and individual network paths are overlayed to form a single network graph for each matrix, respectively.

Kappa matrix is depicted using solid lines, beta network is depicted using dashed lines. In both networks, group paths appear as black lines. Individual paths appear as light grey lines.

For individual paths, line thickness is weighted by the proportion of individuals with paths present.

prepareData

PREPARE DATA FOR FITTING 'GIMMEgVAR'

#### **Description**

Reads in results data from fitting 'graphicalVAR' and creates the logical matrices for kappa and beta needed to fit 'GIMMEgVAR'. The logical matrices determine which paths will not be regularized in the fitting of 'GIMMEgVAR' to determine the group level network model.

# Usage

prepareData(gimmeGVARThreshold = 0.5, RES\_matrixData, outputPath)

### **Arguments**

gimmeGVARThreshold

The cutoff value for group-level paths. Defaults to .50, indicating that a path must be non-zero across >= .50 included as a group-level path.

RES\_matrixData List containing results of fitting individual 'graphicalVAR' to each individual.

outputPath The user specified path to the directory where results files should be stored.

sampleData 11

## **Details**

The following results are returned in the gvarFiles directory: (1) Returns two data frames that hold the logical matrices for beta and kappa. These are named logicalBeta and logicalKappa

(2) Returns two data frames that indicate the proportion of paths across individuals. These are data frames containing the proportion of paths present across individuals after fitting 'graphicalVAR'. These proportions are used to determine potential group paths which will not be regularized for individuals when fitting the final 'GIMMEgVAR'. The output files are named proportionKappa.RData and proportionBeta.RData

sampleData

sampleData

## **Description**

List containing 10 elements. Each element consists of a data frame with time series data that was generated via simulation.

## **Format**

## 'sampleData' Each element in the list contains a data frame for an individual subject. Each data frame has 150 observations of 10 variables (V1-V10) that can be used for fitting GIMMEgVAR. The variable Idnum is the unique subject ID.

V1-V10 Ten variables available for us in fitting GIMMEgVAR

IDnum Unique subject ID

# Author(s)

Sandra AW Lee <wsandra@live.unc.edu>

# **Index**

```
environmentSetup, 2
fitGIMMEgVAR, 2
fitGraphicalVAR, 5
GIMMEgVAR, 7
graphKappa, 9
prepareData, 10
sampleData, 11
```