# Package 'FAVAR'

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ar2ma ar2ma

## **Description**

Convert auto regression (AR) coefficients to moving average (MA) coefficients

# Usage

```
ar2ma(ar, p, n = 11, CharValue = TRUE)
```

### **Arguments**

ar AR coefficients matrix which is k x kp dimension, k is numbers of variables,

and no constant.

p lags orders of AR.

n lags orders of MA generated.

CharValue logical value, whether compute character value.

## **Details**

the formula is,

$$A_s = F_1 * A_{s-1} + F_2 * A_{s-2} + \dots + F_p * A_{s-p}$$

where A is MA coefficients, F is AR coefficients.

## Value

a matrix which is MA coefficients.

```
require(vars)
data(Canada)
ar <- Bcoef(VAR(Canada, p = 2, type = "none"))
ar
ar2ma(ar, p = 2)</pre>
```

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 $BGM \qquad \qquad Separate \ R \ From \ X$ 

#### **Description**

X may include some information related with R. The function extract factors from X which is not related with R by iteration based on Boivin et al. (2009).

### Usage

```
BGM(X, R, K = 2, tolerance = 0.001, nmax = 100)
```

#### **Arguments**

X a large matrix from which principle components are extracted.

R a numeric vector which we are interesting in, for example interest rates.

K the number of extracted principle components.
tolerance the difference between factors when iterating.

nmax the max iterations, see details.

#### **Details**

The algorithm is as follows:

- 1. Extract the first K principal components noted  $F_t^{(0)}$  from X.
- 2. Regress X on  $F_t^{(0)}$  and  $R_t$ , and get regression coefficients  $\beta_R^{(0)}$  of  $R_t$ .
- 3. compute  $X_0^{(0)} = X_t R_t \beta_R$ .
- 4. Extract the first K principal components noted  $F_t^{(1)}$  from X\_t^{(0)}.
- 5. repeat step 2 step 4 until precision you want.

#### Value

the first K principle components, i.e.  $F_t^{(n)}$ , not containing the information R.

#### References

Boivin, J., M.P. Giannoni and I. Mihov, Sticky Prices and Monetary Policy: Evidence from Disaggregated US Data. American Economic Review, 2009. 99(1): p. 350-384.

```
data('regdata')
BGM(X = regdata[,1:115],R = regdata[,ncol(regdata)], K = 2)
```

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**BVAR** 

Bayesian Estimation of VAR

## **Description**

Estimate a VAR base on Bayesian method

## Usage

```
BVAR(
    data,
    plag = 2,
    iter = 10000,
    burnin = 5000,
    prior = list(b0 = 0, vb0 = 0, nu0 = 0, s0 = 0, mn = list(kappa0 = NULL, kappa1 = NULL)),
    ncores = 1
)
```

#### **Arguments**

data a ts object which include all endogenous variables in VAR plag a lag order in VAR iter iterations of the MCMC burnin the first random draws discarded in MCMC a list whose elements is named. b0 is the prior of mean of  $\beta$ , and vb0 is the prior of the variance of  $\beta$ . nu0 is the degree of freedom of Wishart distribution for  $\Sigma^{-1}$ , i.e., a shape parameter, and s0^{-1} is scale parameters for the Wishart distribution. mn sets the Minnesota prior. If prior\$mn\$kappa0 is not NULL, b0, vb0 is neglected.

## Value

a list:

ncores

- A, the samples drawn for the coefficients of VAR
- sigma, the samples drawn for the variance-covariance of the coefficients of VAR

the number of CPU cores in parallel computations.

 $\bullet$  sumrlt, a list include varcoef, varse, q25, q975 which are means, standard errors, 0.25 quantiles and 0.975 quantiles of A.

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coef.favar

Extract Coefficients of a FAVAR Model

# Description

Extract Coefficients of a FAVAR Model

## Usage

```
## S3 method for class 'favar'
coef(object, ...)
```

# Arguments

object a class 'favar'.
... additional arguments affecting the coefficients produced.

## Value

A list

fct\_loading Factor loading matrix in a factor equation.

varcoef regression coefficients in VAR equations.

**FAVAR** 

**FAVAR** 

## **Description**

Estimate a FAVAR model by Bernanke et al. (2005).

## Usage

```
FAVAR(
    Y,
    X,
    fctmethod = "BBE",
    slowcode,
    K = 2,
    plag = 2,
    factorprior = list(b0 = 0, vb0 = NULL, c0 = 0.01, d0 = 0.01),
    varprior = list(b0 = 0, vb0 = 0, nu0 = 0, s0 = 0, mn = list(kappa0 = NULL, kappa1 = NULL)),
    nburn = 5000,
    nrep = 15000,
    standardize = TRUE,
    ncores = 1
)
```

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# **Arguments**

Υ a matrix. Observable economic variables assumed to drive the dynamics of the

economy.

Χ a matrix. A large macro data set. The meanings of X and Y is same as ones of

Bernanke et al. (2005).

fctmethod 'BBE' or 'BGM'. 'BBE' (default) means the factors extracted method by Bernanke

et al. (2005), and 'BGM' means the factors extracted method by Boivin et al.

(2009).

slowcode a logical vector that identifies which columns of X are slow moving. Only when

fctmethod is set as 'BBE', slowcode is valid.

Κ the number of factors extracted from X.

plag the lag order in the VAR equation.

factorprior A list whose elements is named sets the prior for the factor equation. b0 is the

> prior of mean of regression coefficients  $\beta$ , and vb0 is the prior of the variance of  $\beta$ , and c0/2 and d0/2 are prior parameters of the variance of the error  $\sigma^{-2}$ , and they are the shape and scale parameters of Gamma distribution, respectively.

A list whose elements is named sets the prior of VAR equations. b0 is the prior varprior

of mean of VAR coefficients  $\beta$ , and vb0 is the prior of the variance of  $\beta$ , it's a scalar that means priors of variance is same, or a vector whose length equals the length of  $\beta$ . nu0 is the degree of freedom of Wishart distribution for  $\Sigma^{-1}$ , i.e., a shape parameter, and so is a inverse scale parameter for the Wishart distribution, and it's a matrix with ncol(s0)=nrow(s0)=the number of endogenous variables in VAR. If it's a scalar, it means the entry of the matrix is same. mn sets the Minnesota prior. If varprior\$mn\$kappa0 is not NULL, b0, vb0 is neglected. mn's element kappa0 controls the tightness of the prior variance for self-variables lag coefficients, the prior variance is  $\kappa_0/lag^2$ , another element kappa1 controls the cross-variables lag coefficients spread, the prior variance is  $\frac{\kappa_0 \kappa_1}{lag^2} \frac{\sigma_m^2}{\sigma_n^2}$ ,  $m \neq n$ .

See details.

nburn the number of the first random draws discarded in MCMC.

nrep the number of the saved draws in MCMC.

standardize Whether standardize? We suggest it does, because in the function VAR equation

and factor equation both don't include intercept.

the number of CPU cores in parallel computations. ncores

#### **Details**

Here we simply state the prior distribution setting of VAR. VAR could be written by (Koop and Korobilis, 2010),

$$y_t = Z_t \beta + \varepsilon_t, \varepsilon_t \sim N(0, \Sigma)$$

You can write down it according to data matrix,

$$Y = Z\beta + \varepsilon, \varepsilon \sim N(0, I \otimes \Sigma)$$

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where  $Y=(y_1,y_2,\cdots,y_T)',Z=(Z,Z_2,\cdots,Z_T)',\varepsilon=(\varepsilon_1,\varepsilon_2,\cdots,\varepsilon_T)$ . We assume that prior distribution of  $\beta$  and  $\Sigma^{-1}$  is,

$$\beta \sim N(b0, V_{b0}), \Sigma^{-1} \sim W(S_0^{-1}, \nu_0)$$

Or you can set the Minnesota prior for variance of  $\beta$ , for example, for the mth equation in  $y_t = Z_t \beta + \varepsilon_t$ ,

- $\frac{\kappa_0}{l^2}$ , l is lag order, for won lags of endogenous variables
- $\frac{\kappa_0 \kappa_1}{l^2} \frac{\sigma_m^2}{\sigma_n^2}$ ,  $m \neq n$ , for lags of other endogenous variables in the mth equation, where  $\sigma_m$  is the standard error for residuals of the mth equation.

Based on the priors, you could get corresponding post distribution for the parameters by Markov Chain Monte Carlo (MCMC) algorithm. More details, see Koop and Korobilis (2010).

#### Value

An object of class "favar" containing the following components:

**varrlt** A list. The estimation results of VAR including estimated coefficients A, their variance-covariance matrix sigma, and other statistical summary for A.

**Lamb** A array with 3 dimension. and Lamb[i,,] is factor loading matrix for factor equations in the *i*th sample of MCMC.

factorx Extracted factors from X.

**model\_info** Model information containing nburn,nrep,X,Y and p, the number of endogenous variables in the VAR.

## References

- Bernanke, B.S., J. Boivin and P. Eliasz, Measuring the Effects of Monetary Policy: A Factor-Augmented Vector Autoregressive (FAVAR) Approach. Quarterly Journal of Economics, 2005. 120(1): p. 387-422.
- 2. Boivin, J., M.P. Giannoni and I. Mihov, Sticky Prices and Monetary Policy: Evidence from Disaggregated US Data. American Economic Review, 2009. 99(1): p. 350-384.
- 3. Koop, G. and D. Korobilis, Bayesian Multivariate Time Series Methods for Empirical Macroeconomics. 2010: Now Publishers.

#### See Also

summary.favar, coef.favar and irf. All of them are S3 methods of the "favar" object, and summary.favar that prints the estimation results of a FAVAR model, and coef.favar that extracts the coefficients in a FAVAR model, and irf that computes the impulse response in a FAVAR model.

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```
# varprior = list(b0 = 0,vb0 = 10, nu0 = 0, s0 = 0),
# nrep = 15000, nburn = 5000, K = 2, plag = 2)
##---- print FAVAR estimation results-----
# summary(fit,xvar = c(3,5))
##---- or extract coefficients-----
# coef(fit)
##---- plot impulse response figure------
# library(patchwork)
# dt_irf <- irf(fit,resvar = c(2,9,10))</pre>
```

GΙ

Generalized Impulse Response Function (GIRF)

# Description

Compute GIRF of linear VAR by Koop et al. (1996)

# Usage

```
GI(ma, sig_u, imp_var = 1, unit = "sd")
```

# Arguments

ma	a list, it's MA coefficients from ar2ma
sig_u	a covariance matrix from VAR models. Note the order of variables in $sig_u$ is same with one of $ma[[i]]$ .
imp_var	a numerical scalar which specifies the impulse variable.
unit	'sd' is one standard deviation shock which is default, and 'one' is one unit shock.

# Value

a data frame, its row is variables and its column is horizons.

## References

Koop, G., M.H. Pesaran and S. Potter, Impulse Response Analysis in Nonlinear Multivariate Models. Journal of Econometrics, 1996. 74: p. 119-147.

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irf

Impulse Response Function for FAVAR

#### **Description**

Based on a shock to one standard deviation, compute the IRF.

## Usage

```
irf(
  fit,
  irftype = "orth",
  tcode = "level",
  resvar = 1,
  impvar = NULL,
  nhor = 10,
  ci = 0.8,
  showplot = TRUE
)
```

### **Arguments**

fit	a "favar"	object.
-----	-----------	---------

irftype 'orth' is orthogonal IRF, and 'gen' is generalized IRF.

tcode a scalar 'level' or a vector whose length equal ncol(X)+ncol(Y). X,Y is the

parameters of the FAVAR function. If the variable is taken the logarithm('ln') or the first difference of logarithm('Dln'), the IRF needs to return to its level

value, and you can set the parameters. Default is 'level'.

resvar It's column indexes in cbind(XY) that specify response variables. It's a scalar or

a vector. A change variable cause a change of another variable, and the former

is viewed as impulse variable, the latter is viewed as response variable.

impvar Specify a impulse variable. A numeric scalar which is position of variables in

VAR equation. If it's NULL that is default, its position is the last.

nhor IRF horizon, default is 10.

ci confidence interval, default is 0.8.

showplot whether show figure. TRUE is default. If multiple pictures would be printed, the

package patchwork is needed to be loaded.

#### Value

A list containing 2 elements. The first element is a object from ggplot2::ggplot, the second element is raw data for IRF.

```
# see FAVAR function
```

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Compute Impulse Response for Every Sample of MCMC

### **Description**

Compute Impulse Response for Every Sample of MCMC

## Usage

```
irf_single(i, varrlt, Lamb, Ynum, type = "orth", impvar = 1, nhor)
```

## **Arguments**

i the *i*th sample in MCMC

varrlt estimation results for VAR equations, and it's got by BayesVAR.

Lamb a array with 3 dimension. and Lamb[i,,] is factor loading matrix for factor

equations.

Ynum the ncol(Y).

type 'orth' is orthogonal IRF, and 'gen' is generalized IRF.

impvar a numeric scalar which is position of variables in VAR equation. If it's NULL that

is default, its position is the last.

nhor IRF horizon, default is NULL

#### Value

IRF matrix, the dimension is ncol(Xmatrix) + ncol(Y)xnhor.

# **Description**

A matrix containing a large macro data set regdata.

#### Usage

regdata

## **Format**

A matrix regdata with 190 rows and 118 variables,

- X X is the first column through the 115th column in regdata, a large macro data set
- Y Y is the 116th column through the 118th column in regdata, driving the dynamics of the economy

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#### **Source**

https://sites.google.com/site/garykoop/home/computer-code-2

slowcode

Slow-moving or Not

## **Description**

A logic vector, record the variables that are the 1st column through the 115th column in regdata is slow-moving or not.

## Usage

slowcode

#### **Format**

An object of class logical of length 115.

#### Source

```
https://sites.google.com/site/garykoop/home/computer-code-2
```

summary.favar

Print Results of FAVAR

# Description

S3 method for class "favar".

## Usage

```
## S3 method for class 'favar'
summary(object, xvar = NULL, ...)
```

## Arguments

object a "favar" object from function FAVAR.

xvar a numeric vector, which variables in X was printed. It's a index. If it's NULL,

estimation results for X = F + Y is not printed.

... additional arguments affecting the summary produced.

## Value

No return value, called for side effects

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# **Examples**

# see FAVAR function

tcode

 ${\it Transformation Form for X}$ 

# Description

Record the transformation form for the 1st column through the 115th column in regdata, and 'level' is Level, 'ln' is logarithm, 'Dln' is first difference of logarithm.

# Usage

tcode

## **Format**

An object of class character of length 118.

#### Source

https://sites.google.com/site/garykoop/home/computer-code-2

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