# Package 'fbi'

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| Title Factor-Based Imputation and FRED-MD Data Set   |
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| Description Factor-Based imputation of missing values in panel data and and manipulation of the FRED-MD Data Set. It estimates the factor model in the panel data based on the methods in Bai and Ng (2002) <doi:10.1111 1468-0262.00273=""> and Bai and Ng (2019)  <doi:10.1016 j.jeconom.2019.04.021="">. It then computes the missing values using the Tall-Wide method (Bai and Ng (2019)  <arxiv:1910.06677>) or the Tall-Project method (Bai, Cahan, and Ng (2019), unpublished manuscript). It also facilitates loading, preparing, and interpreting the FRED-MD data set <a href="https://research.stlouisfed.org/econ/mccracken/fred-databases">https://research.stlouisfed.org/econ/mccracken/fred-databases&gt;</a>.</arxiv:1910.06677></doi:10.1016></doi:10.1111> |
| <pre>URL https://github.com/cykbennie/fbi</pre>  |
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| fbi-package  |

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fbi-package

Factor-Based Imputation and FRED-MD/QD Data Set

# **Description**

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The fbi package contains functions to estimate factor models and impute missing data based on factor models. It also includes functions to load and prepare the FRED-MD/QD data set.

## **Details**

See vignette("factor\_fred",package = "fbi") for an example using the FRED-MD dataset (https://research.stlouisfed.org/econ/mccracken/fred-databases/).

## Author(s)

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Jushan Bai <jushan.bai@columbia.edu>

#### References

Jushan Bai and Serena Ng (2002), Determining the number of factors in approximate factor models. https://onlinelibrary.wiley.com/doi/pdf/10.1111/1468-0262.00273

Jushan Bai and Serena Ng (2017), Rank regularized estimation of approximate factor models. https://www.sciencedirect.com/science/article/pii/S0304407619300764

apc 3

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Factor Model of Balanced Panel Data

# Description

apc estiamtes the factor model of a given balanced panel data.

## Usage

```
apc(X, kmax)
```

# Arguments

X a matrix of size T by N.

kmax integer, indicating the maximum number of factors.

#### Value

a list of elements:

Fhat

Lamhat

Chat

d

d0

ehat

Chat euqals Fhat x Lamhat'

## Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

Serena Ng <serena.ng@columbia.edu>

Jushan Bai <jushan.bai@columbia.edu>

#### References

Jushan Bai and Serena Ng (2002), Determining the number of factors in approximate factor models. https://doi.org/10.1111/1468-0262.00273 4 describe\_md

| demeanXY | Demean Panel Data |
|----------|-------------------|
|          |                   |

## **Description**

demeanXY demeans the panel data.

## Usage

```
demeanXY(X, N, T, N0, T0)
```

#### **Arguments**

| X  | detaframe or matrix of the original panel data.                               |
|----|---|
| N  | integer, total number of columns of the panel data.                           |
| Т  | integer, total number of rows of the panel data.                              |
| NØ | integer, the number of columns in the panel data with full data availability. |
| Τ0 | integer, the number of rows in the panel data with full data availability.    |

#### Value

a list of elements:

X1 demeaned data

FE estimated fixed effects matrix

## Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu> Serena Ng <serena.ng@columbia.edu> Jushan Bai <jushan.bai@columbia.edu>

describe\_md

Describe selected variables in the FRED-MD Data Set

# **Description**

describe\_md provides a description of the selected variables in the FRED-MD data set.

# Usage

```
describe_md(varname, name.only = TRUE, verbose = FALSE)
```

#### **Arguments**

varname string or a vector strings of the FRED variable name, such as GDPC1.

name.only logical. If TRUE, return a dataframe with variable names and types of transfor-

mation only; if FALSE, return a dataframe with more details.

verbose logical, indicating whether or not descriptions should be printed.

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#### Value

a vector of variable names, or a data frame with detailed descriptions.

# Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

#### References

 $\label{lem:michael W. McCracken and Serena Ng (2015), $\it FRED-MD Updated Appendix. $https://s3.amazonaws.com/files.fred.stlouisfed.org/fred-md/Appendix_Tables_Update.pdf} $\it Appendix_Tables_Update.pdf. $\it Comparison of the com$ 

## **Examples**

```
library(fbi)
varnames <- describe_md(c("RPI", "RETAILx"), name.only = TRUE, verbose = FALSE)</pre>
```

describe\_qd

Describe selected variables in the FRED-QD Data Set

#### **Description**

describe\_qd provides a description of the selected variables in the FRED-QD data set.

#### Usage

```
describe_qd(varname, name.only = TRUE, verbose = FALSE)
```

# **Arguments**

varname string or a vector strings of the FRED variable name, such as GDPC1.

name.only logical. If TRUE, return a dataframe with variable names and types of transfor-

mation only; if FALSE, return a dataframe with more details.

verbose logical, indicating whether or not descriptions should be printed.

#### Value

a vector of variable names, or a data frame with detailed descriptions.

#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

## References

```
Michael W. McCracken and Serena Ng (2020), FRED-QD Updated Appendix. https://s3.amazonaws.com/files.fred.stlouisfed.org/fred-md/FRED-QD_appendix.pdf
```

#### **Examples**

```
library(fbi)
varnames <- describe_qd(c("GDPC1", "Y033RC1Q027SBEAx"), name.only = TRUE, verbose = FALSE)</pre>
```

fredmd\_description

| fredmd | Loading FRED-MD Data Set |  |
|--------|--------------------------|--|
|        |                          |  |

# Description

fredmd loads the official FRED-MD data set and provides a few tools to manipulate the data set.

# Usage

```
fredmd(file = "", date_start = NULL, date_end = NULL, transform = TRUE)
```

# **Arguments**

| file       | Either a path to a file, a connection, or literal data (either a single string or a raw vector).                    |
|------------|---|
| date_start | Date or NULL, the start date (included) of the data selection. If NULL, select till the latest data available.      |
| date_end   | Date or NULL, the end date (included) of the data selection. If NULL, select up to the earliest data available.     |
| transform  | logical, indicating Whether or not the FRED-MD data set should be transformed according to the transformation code. |

## Value

a subset of the (transformed) FRED-MD data of class fredmd.

## Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

#### References

Michael W. McCracken and Serena Ng (2015), FRED-MD and FRED-QD: Monthly and Quarterly Databases for Macroeconomic Research. https://research.stlouisfed.org/econ/mccracken/fred-databases/

# Description

A description of the FRED-MD data set.

```
data(fredmd_description)
```

fredqd 7

#### **Format**

A data frame with 135 rows and 9 variables. The variables are as follows:

```
id series ID number
```

**tcode** code of transformation **ttype** type of transformation

fred variable name used in the FRED-MD data set

description description of the series

gsi variable name used in the Global Insights Basic Economics Database (GSI)

gsi:description description of the series in GSI

group group of the series

edited logical, indicating if the data has been editted

varname "X" + id

#### Source

The fredmd\_description data were obtained from Michael W. McCracken and Serena Ng (2015), FRED-MD Updated Appendix. https://s3.amazonaws.com/files.fred.stlouisfed.org/fred-md/Appendix\_Tables\_Update.pdf

fredgd

Loading FRED-QD Data Set

## **Description**

fredqd loads the official FRED-QD data set and provides a few tools to manipulate the data set.

### Usage

```
fredqd(file = "", date_start = NULL, date_end = NULL, transform = TRUE)
```

#### **Arguments**

| file I | Either a path to a file, a | connection, or literal | data (either a sin | ngle string or a raw |
|--------|----------------------------|------------------------|--------------------|----------------------|
|        |                            |                        |                    |                      |

vector).

date\_start Date or NULL, the start date (included) of the data selection. If NULL, select till

the latest data available.

date\_end Date or NULL, the end date (included) of the data selection. If NULL, select up to

the earliest data available.

transform logical, indicating Whether or not the FRED-QD data set should be transformed

according to the transformation code.

#### Value

a subset of the (transformed) FRED-QD data of class fredqd.

#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

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#### References

Michael W. McCracken and Serena Ng (2015), FRED-MD and FRED-QD: Monthly and Quarterly Databases for Macroeconomic Research. https://research.stlouisfed.org/econ/mccracken/fred-databases/

fredqd\_description

FRED-QD Data Set Description

# Description

A description of the FRED-QD data set.

# Usage

```
data(fredqd_description)
```

#### **Format**

A data frame with 248 rows and 10 variables. The variables are as follows:

```
id series ID number
sw_id series ID number in SW (2012)
tcode code of transformation
ttype type of transformation
sw factors logical indicating whether
```

sw\_factors logical, indicating whether a series was used in SW (2012) when constructing factors

fred\_mnemonic in FRED-QD

sw\_mnemonic used in SW (2012)

**description** a brief definition of the series

group group of the series

varname "X" + id

#### **Source**

The fredqd\_description data were obtained from Michael W. McCracken and Serena Ng (2020), FRED-QD Updated Appendix. https://s3.amazonaws.com/files.fred.stlouisfed.org/fred-md/FRED-QD\_appendix.pdf

removeFE 9

| Tellove Line Duli Relieve Line Duli line Lune Duli | removeFE | Remove Fixed Effects from the Panel Data |
|--|----------|--|
|--|----------|--|

# Description

removeFE removes fixed effects from the panel data.

# Usage

```
removeFE(X, N, T, N0, T0)
```

# **Arguments**

| X  | detaframe or matrix of the original panel data.                               |
|----|---|
| N  | integer, total number of columns of the panel data.                           |
| Т  | integer, total number of rows of the panel data.                              |
| NØ | integer, the number of columns in the panel data with full data availability. |
| Т0 | integer, the number of rows in the panel data with full data availability.    |

## Value

a list of elements:

X1 demeaned data

FE estimated fixed effects matrix

# Author(s)

```
Yankang (Bennie) Chen <yankang.chen@yale.edu>
Serena Ng <serena.ng@columbia.edu>
Jushan Bai <jushan.bai@columbia.edu>
```

res\_overlay.twtp Residual Overlay

# Description

res\_overlay. twtp estimates the covariance and correlation matrix of the unbalanced panel data using the method of residual overlay.

```
res_overlay.twtp(object, method = 1, S = 500)
```

10 rm\_outliers.fredmd

#### **Arguments**

object an object of class 'tptw', i.e. the output of tp\_apc or tw\_apc.

method integer 1 to 4, indicating which residual overlay method to use. They correspond

to the four methods described in the paper.

S the number of iterations.

#### Value

a list of elements:

method the method of residual overlay

S the number of iterations

cov estimated covariance matrix

cor estimated correlation matrix

#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

Serena Ng <serena.ng@columbia.edu>

Jushan Bai <jushan.bai@columbia.edu>

#### References

Cahan, E., Bai, J. and Ng, S. 2019, Factor Based Imputation of Missing Data and Covariance Matrix Estimation. unpublished manuscript, Columbia University

rm\_outliers.fredmd

Remove outliers of the FRED-MD Data Set

# Description

rm\_outliers.fredmd removes outliers of the FRED-MD data set produced by the fredmd function.

## Usage

```
rm_outliers.fredmd(object)
```

## **Arguments**

object an object of class fredmd.

#### Value

FRED-MD data of class fredmd with outliers removed.

## Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

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#### References

Michael W. McCracken and Serena Ng (2015), FRED-MD and FRED-QD: Monthly and Quarterly Databases for Macroeconomic Research. https://research.stlouisfed.org/econ/mccracken/fred-databases/

rpca

Estimation of Approximate Factor Models

# **Description**

rpca estimates the approximate factor models of the given matrix.

## Usage

```
rpca(X, kmax, standardize = FALSE, tau = 0)
```

# **Arguments**

X a matrix of size T by N.

kmax integer, indicating the maximum number of factors.

standardize logical, indicating Whether or not X should be centered and scaled.

tau numeric, specifying the parameter in the rank-regularized estimation. If tau =

0, then rank regularization is not used.

## Value

a list of elements:

Χ

kmax

standardize

tau

ic2

pc2k

pc20

Fhat

Lamhat

Chat

Sigma

IC2

PC2k

PC20

fhat

lamhat

d

d0

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#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu> Serena Ng <serena.ng@columbia.edu> Jushan Bai <jushan.bai@columbia.edu>

#### References

Jushan Bai and Serena Ng (2002), *Determining the number of factors in approximate factor models*. https://doi.org/10.1111/1468-0262.00273

Jushan Bai and Serena Ng (2019), Rank regularized estimation of approximate factor models. https://doi.org/10.1016/j.jeconom.2019.04.021

se.rpca

Standard Error of C^hat

# **Description**

se.rpca produces the estimated standard error of C^hat produced by the rpca function.

#### Usage

```
se.rpca(object, xpoints, qq)
```

#### **Arguments**

object an object of class rpca.

xpoints placeholder. qq placeholder.

## Value

standard error of C^hat

#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu> Serena Ng <serena.ng@columbia.edu> Jushan Bai <jushan.bai@columbia.edu>

#### References

Jushan Bai and Serena Ng (2002), *Determining the number of factors in approximate factor models*. https://doi.org/10.1111/1468-0262.00273

Jushan Bai and Serena Ng (2017), Rank regularized estimation of approximate factor models. https://doi.org/10.1016/j.jeconom.2019.04.021

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tnt

Estimate Treatment Effect

## **Description**

tnt estimates the treatment effect.

# Usage

```
tnt(data, param)
```

# **Arguments**

data list containing x1, x2, y0, y1, N0, N1, T0, and T1. param list containing K, r, do\_FE, do\_IFE, and maxit1.

#### Value

a list of elements:

est

SE

٧

it1

# Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu> Serena Ng <serena.ng@columbia.edu> Jushan Bai <jushan.bai@columbia.edu>

# References

Jushan Bai and Serena Ng (2019), *Matrix Completion, Counterfactuals, and Factor Analysis of Missing Data*. https://arxiv.org/abs/1910.06677

tp\_apc

Tall-Project Imputation of Missing Value in Panel Data

# Description

tp\_apc imputates the missing values in a given panel data using the method of "Tall-Project".

```
tp_apc(X, kmax, center = FALSE, standardize = FALSE, re_estimate = TRUE)
```

 $tw\_apc$ 

#### **Arguments**

X a matrix of size T by N with missing values.

kmax integer, indicating the maximum number of factors.

center logical, indicating whether or not X should be demeaned

standardize logical, indicating whether or not X should be scaled.

re\_estimate logical, indicating whether or not output factors, 'Fhat', 'Lamhat', and 'Chat',

should be re-estimated from the imputed data.

#### Value

a list of elements:

Fhat estimated F

Lamhat estimated Lambda
Chat euqals Fhat x Lamhat'

data X with missing data imputed

X the original data with missing values kmax the maximum number of factors

center logical, indicating whether or not X was demeaned in the algorithm

standardize logical, indicating whether or not X was scaled in the algorithm

re\_estimate logical, indicating whether or not output factors, 'Fhat', 'Lamhat', and 'Chat',

were re-estimated from the imputed data

#### Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

Serena Ng <serena.ng@columbia.edu>

Jushan Bai <jushan.bai@columbia.edu>

#### References

Cahan, E., Bai, J. and Ng, S. 2019, Factor Based Imputation of Missing Data and Covariance Matrix Estimation. unpublished manuscript, Columbia University

tw\_apc Tall-Wide Imputation of Missing Value in Panel Data

## **Description**

tw\_apc imputates the missing values in a given panel data using the method of "Tall-Wide".

```
tw_apc(X, kmax, center = FALSE, standardize = FALSE, re_estimate = TRUE)
```

 $tw\_apc$  15

## **Arguments**

X a matrix of size T by N with missing values.

kmax integer, indicating the maximum number of factors.

center logical, indicating whether or not X should be demeaned standardize logical, indicating whether or not X should be scaled.

re\_estimate logical, indicating whether or not output factors, 'Fhat', 'Lamhat', and 'Chat',

should be re-estimated from the imputed data.

#### Value

a list of elements:

Fhat estimated F

Lamhat estimated Lambda
Chat euqals Fhat x Lamhat'

data X with missing data imputed

X the original data with missing values kmax the maximum number of factors

center logical, indicating whether or not X was demeaned in the algorithm standardize logical, indicating whether or not X was scaled in the algorithm

re\_estimate logical, indicating whether or not output factors, 'Fhat', 'Lamhat', and 'Chat',

were re-estimated from the imputed data

## Author(s)

Yankang (Bennie) Chen <yankang.chen@yale.edu>

Serena Ng <serena.ng@columbia.edu>

Jushan Bai <jushan.bai@columbia.edu>

# References

Jushan Bai and Serena Ng (2019), Matrix Completion, Counterfactuals, and Factor Analysis of Missing Data. https://arxiv.org/abs/1910.06677

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