

Package ‘kcirt’

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Type Package

Title k-Cube Thurstonian IRT Models

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Description Create, Simulate, Fit, Solve k-Cube Thurstonian IRT Models

Depends R (>= 3.0.0), mvtnorm, snowfall, corpcor

License GPL (>= 2)

NeedsCompilation no

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Description

Create, Simulate, Fit, Solve k-Cube Thurstonian IRT Models.

Details

Package:	kcirt
Type:	Package
Version:	0.6.0
Date:	2014-04-22
License:	GPL (>= 2)

Use `kcirt.model` to define a k-Cube Thurstonian IRT model. The function `kcirt.sim` generates a random realization. The function `kcirt.fitEE` uses an expectation-expectation volley to approximately locate mu and Lambda and predict the states, Eta. The function `kcirt.fitMSS` makes use of metaheuristic stochastic search to further refine the predictions/estimates.

The system of interest is defined as

$$y_i^* = \Delta \mu + \Delta \Lambda S \eta_i + \Delta \epsilon_i$$

$$y = 1, \text{ if } y^* > 0$$

$$y = 0, \text{ otherwise}$$

$$Y = (y_1, y_2, \dots, y_N)$$

where

y_i is the (column) response vector for observation i .

Δ is the Delta matrix.

μ is the column vector of item means (aka, 'utilities').

Λ is the hyperparameter matrix (aka, 'loadings').

S is the Slot matrix.

η_i is the row vector of latent states (aka, 'constructs', or 'scales') for observation i .

$\epsilon_i \sim N[0, \Sigma_s]$ is a column vector of system shocks for observation i .

Author(s)

Dave Zes, Jimmy Lewis, Dana Landis @ Korn/Ferry International

<zesdae@gmail.com>

References

Brown, A., & Maydeu-Olivares, A. (2012, November 12). How IRT Can Solve Problems of Ipsative Data in Forced-Choice Questionnaires. *Psychological Methods*. Advance online publication. doi: 10.1037/a0030641

`ikcirt.data2Y`

Convert Rank Data to Y

Description

Converts raw rank data to the dichotomous response matrix, Y . Probably no need for user to call; called by `kcirt.model` and `kcirt.sim`.

Usage

```
ikcirt.data2Y(mxData, mxDelta)
```

Arguments

- | | |
|----------------------|--|
| <code>mxData</code> | Ranked Data. A matrix of positive integers (rankings). |
| <code>mxDelta</code> | System Delta matrix, elements in $\{-1, 0, 1\}$. |

Value

Response matrix with elements in $\{NA, 0, 1\}$.

Author(s)

Dave Zes, Korn/Ferry International

See Also

For the inverse of this function, see `ikcirt.Y2data`.

Examples

```
##### here's an itty-bitty example

constructMap.ls <- list(
  c(1,1,2,2),
  c(2,2,3,3),
  c(1,1,3,3)
)

qTypes <- rep("M", length(constructMap.ls))

model <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)
```

```
#### fake data, two cases (cases run column-wise)
mxData <- t(
  rbind(
    c( c(1, NA, NA, 4), c(4, NA, NA, 1), c(NA, 4, NA, 1) ),
    c( c(1, 4, NA, NA), c(NA, NA, 1, 4), c(NA, 4, 1, NA) )
  )
)

ikcirt.data2Y(mxData, mxDelta=model$mxDelta)
```

ikcirt.df1*Conservative Degrees of Freedom***Description**

A simple, conservative calculation of a model's degrees of freedom. Each question-respondent counts as 1 *df*.

Usage

```
ikcirt.df1(model, lambdaConstraint = "self")
```

Arguments

- | | |
|------------------|--|
| model | A kcirt model. A named list of class 'kcube.irt.model'. Must possess an object from which number of respondents can be gleaned, e.g., Y. |
| lambdaConstraint | A scalar string. Please see kcirt.fitMSS . |

Value

Scalar integer.

Author(s)

Dave Zes, Korn/Ferry International

Examples

```
## Please see example in kcirt.fitMSS.
```

ikcirt.fun.mss.eta *MSS Locate Eta*

Description

Used by [kcirt.fitMSS](#); not to be called by user.

Usage

```
ikcirt.fun.mss.eta(jj, iimss, jjmss, rndTrys, mxHatEta, penalty, usetruesigma)
```

Arguments

jj	Index for snowfall cluster call.
iimss	Row index of <code>mxHatEta</code> to presently search.
jjmss	Column index of <code>mxHatEta</code> to presently search.
rndTrys	Values to try.
mxHatEta	Predicted State matrix.
penalty	Scalar string. How to measure quality of fit? Currently either 'logit', 'L2', 'L2c', 'miscat'.
usetruesigma	Scalar boolean. Use actual (assumed) system variance?

Value

Fit cost. A scalar real-valued number.

Note

I cannot imagine a situation where the user could profit by calling this function. It is not namespaced for its possible didactic value.

Author(s)

Dave Zes, Korn/Ferry International

See Also

See Also [kcirt.fitMSS](#), [ikcirt.fun.mss.mu](#), [ikcirt.fun.mss.lambda](#).

ikcirt.fun.mss.lambda *MSS Locate Lambda*

Description

Used by [kcirt.fitMSS](#); not to be called by user.

Usage

```
ikcirt.fun.mss.lambda(jj, iimss, jjmss, rndTrys, mxHatLambda, penalty, usetruesigma)
```

Arguments

jj	Index for snowfall cluster call.
iimss	Row index of mxHatLambda to presently search.
jjmss	Column index of mxHatLambda to presently search.
rndTrys	Values to try.
mxHatLambda	Estimated Hyperparameter matrix.
penalty	Scalar string. How to measure quality of fit? Currently either 'logit', 'L2', 'L2c', 'miscat'.
usetruesigma	Scalar boolean. Use actual (assumed) system variance?

Value

Fit cost. A scalar real-valued number.

Note

I cannot imagine a situation where the user could profit by calling this function. It is not namespaced for its possible didactic value.

Author(s)

Dave Zes, Korn/Ferry International

See Also

See Also [kcirt.fitMSS](#), [ikcirt.fun.mss.mu](#), [ikcirt.fun.mss.eta](#).

ikcirt.fun.mss.mu *MSS Locate mu*

Description

Used by [kcirt.fitMSS](#); not to be called by user.

Usage

```
ikcirt.fun.mss.mu(jj, iimss, rndTrys, hatMu, useSysCov, penalty)
```

Arguments

<code>jj</code>	Index for snowfall cluster call.
<code>iimss</code>	Index of <code>hatMu</code> to presently search.
<code>rndTrys</code>	Values to try.
<code>hatMu</code>	Estimated item means.
<code>useSysCov</code>	Either the true or estimated System Variance matrix.
<code>penalty</code>	Scalar string. How to measure quality of fit? Currently either 'logit', 'L2', 'L2c', 'miscat'.

Value

Fit cost. A scalar real-valued number.

Note

I cannot imagine a situation where the user could profit by calling this function. It is not namespaced for its possible didactic value.

Author(s)

Dave Zes, Korn/Ferry International

See Also

See Also [kcirt.fitMSS](#), [ikcirt.fun.mss.lambda](#), [ikcirt.fun.mss.eta](#).

 ikcirt.rndData1 *Random Data*

Description

Generate a random realization of a minimally defined k-Cube Thurstonian IRT Model. Probably no need for user to call; called by [kcirt.sim](#).

Usage

```
ikcirt.rndData1(N, qTypes, mxDelta, ns)
```

Arguments

N	Number of observational units.
qTypes	Is a question to be fully ranked or most/least format. A character vector whose length is the number of blocks. Each element in 'R', 'M'.
mxDelta	Delta matrix.
ns	Response dimensions. A vector of length equal to the number of questions, each element giving the number of items in the question.

Value

Ranked Data matrix.

Author(s)

Dave Zes, Korn/Ferry International

Examples

```
constructMap.ls <- list(
  c(1,2),
  c(2,3),
  c(1,3)
)

qTypes <- rep("R", length(constructMap.ls))

mod <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)

N <- 50
set.seed(99999)
mod <- kcirt.sim(model=mod, N=N)

ikcirt.rndData1(N=N, qTypes=qTypes, mxDelta=mod$mxDelta, ns=mod$ns)
```

<code>ikcirt.Ustar2data</code>	<i>Convert U* to Data</i>
--------------------------------	---------------------------

Description

Convert the non-differenced latent responses to Data. Probably no need for user to call; called by [kcirt.sim](#).

Usage

```
ikcirt.Ustar2data(Ustar, qTypes, mxDelta, ns)
```

Arguments

<code>Ustar</code>	Non-differenced latent responses matrix.
<code>qTypes</code>	Is a question to be fully ranked or most/least format. A character vector whose length is the number of blocks. Each element in {'R', 'M'}.
<code>mxDelta</code>	System Delta matrix, elements in {-1, 0, 1}.
<code>ns</code>	Response dimensions. A vector of length equal to the number of questions, each element giving the number of items in the question.

Value

Ranked Data matrix.

Author(s)

Dave Zes, Korn/Ferry International

<code>ikcirt.Y2data</code>	<i>Convert Y to Rank Data</i>
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Description

Converts a dichotomous response matrix, Y, to rank data. Probably no need for user to call; called by [kcirt.model](#).

Usage

```
ikcirt.Y2data(Y, mxDelta, ns)
```

Arguments

<code>Y</code>	Response matrix.
<code>mxDelta</code>	System Delta matrix. A $q \times m$ matrix with elements in {-1, 0, 1}.
<code>ns</code>	Response dimensions. A vector of length equal to the number of questions, each element giving the number of items in the question.

Value

Ranked Data matrix.

Author(s)

Dave Zes, Korn/Ferry International

See Also

For the inverse of this function, see [ikcirt.data2Y](#).

Examples

```
##### here's an itty-bitty example

constructMap.ls <- list(
  c(1,1,2,2),
  c(2,2,3,3),
  c(1,1,3,3)
)

qTypes <- rep("M", length(constructMap.ls))

model <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)

##### fake data, two cases (cases run column-wise)
mxData <- t(
  rbind(
    c( c(1, NA, NA, 4), c(4, NA, NA, 1), c(NA, 4, NA, 1) ),
    c( c(1, 4, NA, NA), c(NA, NA, 1, 4), c(NA, 4, 1, NA) )
  )
)

##### convert data to Y
Y <- ikcirt.data2Y(mxData=mxData, mxDelta=model$mxDelta)

##### convert Y back to data
ikcirt.Y2data(Y=Y, mxDelta=model$mxDelta, ns=model$ns)
```

Description

k-Cube Thurstonian IRT Fitting using a least-squares expectation-expectation algorithm.

Usage

```
kcirt.fitEE(model, mxHatLambda, maxIter = 40, lambda.ridge = 0.3, Seta.ridge=0.01)
```

Arguments

<code>model</code>	A kcirt model. A named list of class 'kcube.irt.model'.
<code>mxHatLambda</code>	An initial guess for the Hyperparameters.
<code>maxIter</code>	Maximum number of iterations.
<code>lambda.ridge</code>	Non-negative real-valued scalar. Amount of Ridge shrinkage on hatLambda crossproduct for LS stages.
<code>Seta.ridge</code>	Non-negative real-valued scalar. Amount of Ridge shrinkage on SEta crossproduct for LS stages.

Details

This function can be thought of as an expectation-expectation procedure. The starting Hyperparameters, `mxHatLambda`, are used to predict `mxEta` (this prediction is commonly called `mxHatEta` in this package), and so on, back and forth. The procedure stops when either the L2 cost first bottoms out, or `maxIter` is met.

In many cases, this function alone produces excellent-performing estimates/predictions. The user may pass the returned model to [kcirt.fitMSS](#) for further refinement.

Value

A kcirt model. A named list of class 'kcube.irt.model'.

Author(s)

Dave Zes, Korn/Ferry International

See Also

See Also [kcirt.fitMSS](#).

Examples

```
constructMap.ls <- list(
  c(1,1,2,2),
  c(1,1,3,3),
  c(2,2,3,3),
  c(1,1,2,2),
  c(1,1,3,3),
  c(2,2,3,3)
)

qTypes <- rep("R", length(constructMap.ls))

mod <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)
```

```

N <- 300
set.seed(99999)
mod <- kcirt.sim(model=mod, N=N)

ikcirt.df1(mod, "self")

mxHatLambda <- mod$mxLambda - matrix( rnorm( sum(mod$ns)^2, 0, 0.3 ), sum(mod$ns), sum(mod$ns) )

mod2 <- kcirt.fitEE(model=mod, mxHatLambda=mxHatLambda, maxIter=40)

```

kcirt.fitMSS*Metaheuristic k-Cube Thurstonian IRT Fitting***Description**

Use metaheuristic stochastic search to locate k-Cube Thurstonian IRT hyperparameters and states.

Usage

```
kcirt.fitMSS(model, lambdaConstraint = "self", kcpus = 2, penalty = "logit",
  usetruesigma = TRUE, mss.sd = 0.2, nsearch = 19, l2zvarpow = 0,
  xmushrink=0, xlambdashrink=0, xeta.shrink=0.4)
```

Arguments

model	A kcirt model; a named list of class "kcube.irt.model".
lambdaConstraint	Scalar string specifying how to constrain Lambda during fitting. See Details.
kcpus	Scalar positive integer telling snowfall how many threads to initialize. Set to 1 for no parallel processing.
penalty	Scalar string. How to measure quality of fit? Currently either 'logit', 'L2', 'L2c', 'miscat'.
usetruesigma	Scalar boolean. Use actual (assumed) system variance?
mss.sd	Scalar positive number or vector of length 3. Size of search function standard deviation for, in order, mu, Lambda, and Eta searches.
nsearch	Scalar positive integer. How many candidate values to draw from under the MSS function. Typically 14-20.
l2zvarpow	Scalar positive integer. Only used when penalty is 'L2c'. Power by which to raise var(2*Y-1); the amount of 'smoothing' to impose on 2*Y-1. Note that when zero, setting penalty to 'L2c' produces identical results to 'L2' – though slightly slower computationally.
xmu.shrink	Scalar non-negative real-valued. Only used when penalty is 'logit'. How much to shrink utility estimates towards zero.
xlambdashrink	Scalar non-negative real-valued. Only used when penalty is 'logit'. How much to shrink loading estimates towards zero.
xeta.shrink	Scalar non-negative real-valued. Only used when penalty is 'logit'. How much to shrink state predictions towards zero.

Details

Note: As of kcirt version ≥ 0.6 , the argument logitshrinkcoef has been removed. Use `xeta.shrink` instead. **lambdaConstraint** defines the model k-cube, i.e., the item crosstalk space. Currently accepts `self`, only diagonal elements of `Lambda`; `withinx`, additionally includes within block items pointing to exogenous constructs; `withini`, additionally includes items within block pointing to same construct. `betweenx`, diagonal elements and all other items that point to different constructs; `betweeni`, additionally includes items that point to same construct. `priorx` is similar to `betweenx` except that only previous items crosstalk with item, i.e., `Lambda` is lower-block-diagonal; `priori` additionally permits crosstalk between prior items pointing to same construct.

penalty defines the objective function to be minimized. `logit` minimizes the logistic deviance. `L2` minimizes sum of squares between $2*Y-1$ and $2*Yhat-1$. `L2c` is similar to `L2`, except that it pre-projects (up to a constant) $2*Y-1$ and $2*Yhat-1$ using `var(2*Y-1)`. Note that NA values in `Y` are replaced with 0.5. Finally, `miscat`, minimizes the misclassification rate using a confusion table between the observations, `Y`, and the predicted states (scales), `hatEta`, split at zero.

Excepting very adventurous explorations with this model, the defaults for **lambdaConstraint** and **penalty** will likely best serve the user.

Value

A kcirt model. A named list of class 'kcube.irt.model'.

Author(s)

Dave Zes, Korn/Ferry International

See Also

See Also [kcirt.fitEE](#).

Examples

```
constructMap.ls <- list(
  c(1,1,2,2),
  c(1,1,3,3),
  c(2,2,3,3),
  c(1,1,2,2),
  c(1,1,3,3),
  c(2,2,3,3),
  c(1,2),
  c(2,3),
  c(1,3)
)

qTypes <- rep("R", length(constructMap.ls))

mod <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)

N <- 200
set.seed(99999)
```

```

mod <- kcirt.sim(model=mod, N=N)

ikcirt.df1(mod, "self")

##### create initial guess for hyperparameters (aka loadings)
mod$mxHatLambda <- mod$mxLambda - matrix( rnorm( sum(mod$ns)^2, 0, 0.3 ), sum(mod$ns), sum(mod$ns) )

##### need to assign hat states and utilities
mod$mxHatEta <- matrix(0, N, sum(mod$nuc))
mod$hatMu <- rep(0, sum(mod$ns))

## Not run:
##### run MSS fit -- performance is R^2 btwn true and pred states (aka scales)
mod <- kcirt.fitMSS(model=mod, lambdaConstraint="self", kcpus=2, penalty="L2",
usetruesigma=TRUE, mss.sd=1)
mod$performance

##### run again ...
mod <- kcirt.fitMSS(model=mod, lambdaConstraint="self", kcpus=2, penalty="L2",
usetruesigma=TRUE, mss.sd=1)
mod$performance

##### run a few more times . . . .

## End(Not run)

```

kcirt.model*Create k-Cube Thurstonian IRT Model***Description**

Create a k-Cube Thurstonian IRT Model skeleton.

Usage

```
kcirt.model(constructMap.ls, qTypes, data = NULL, Y = NULL, mu = 0, mxLambda = NULL,
covEta = 1, covShocks = 1, deltaType=1)
```

Arguments

constructMap.ls

How the constructs map to the items. A list of vectors, each vector representing a block (question in the instrument); each element of a vector giving the construct index.

qTypes

Is a question to be fully ranked or most/least format. A character vector whose length is the number of blocks. Each element in {"R", "M"}. Note that only accepts 'R' when corresponding block has 3 or 2 items.

data	Data matrix. The number of columns is the number of observational units, the number of rows is the total number of items.
Y	Response cohort matrix, each element in {NA, 0, 1}.
mu	True item means. A real-valued vector whose length is the total number of items.
mxLambda	True hyperparameters. A real-valued square matrix, or a vector. If vector, mxLambda is assumed to be diagonal (no item crosstalk) – vector is recycled
covEta	True covariance of states. A square, symmetric real-valued matrix.
covShocks	True covariance of shocks. A square, symmetric real-valued matrix.
deltaType	Tell function in what pattern items are compared. Scalar. Directly affects structure of the Delta matrix. Currently one of two integer values. 1 is default. 2 is that implied by Brown and Maydeau-Oliveras.

Value

A kcirt model. A named list of class “kcube.irt.model”.

Author(s)

Dave Zes, Korn/Ferry International

Examples

```
constructMap.ls <- list(
  c(1,2),
  c(2,3),
  c(1,3)
)

qTypes <- rep("R", length(constructMap.ls))

mod <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)

## view contents
mod
```

Description

Given model parameters, create a random realization of a k-Cube Thurstonian IRT Model skeleton.

Usage

```
kcirt.sim(model, N, type = "Eta")
```

Arguments

- `model` A kcirt model. A named list of class 'kcube.irt.model'.
- `N` Number of observations.
- `type` Currently ignored.

Value

A kcirt model. A named list of class 'kcube.irt.model'.

Author(s)

Dave Zes, Korn/Ferry International

Examples

```
## Please see example in, e.g., kcirt.fitMSS.
```

kcirt.ystarinfo *Calculate State Information*

Description

Calculate System Information imparted to States through Y^* .

Usage

```
kcirt.ystarinfo(model)
```

Arguments

- `model` A kcirt model. A named list of class 'kcube.irt.model'.

Value

A numeric, square, symmetric matrix, whose number of rows equals the number of model states (scales).

Author(s)

Dave Zes, Korn/Ferry International

Examples

```
constructMap.ls <- list(  
  c(1,1,2,2),  
  c(1,1,3,3),  
  c(2,2,3,3),  
  c(1,1,2,2),  
  c(1,1,3,3),  
  c(2,2,3,3),  
  c(1,2),  
  c(2,3),  
  c(1,3)  
)  
  
qTypes <- rep("R", length(constructMap.ls))  
  
mod <- kcirt.model(constructMap.ls=constructMap.ls, qTypes=qTypes, mxLambda=NULL)  
  
mxInfo <- kcirt.ystarinfo(mod)  
  
mxInfo  
  
mxErrorVar <- solve(mxInfo)  
  
mxErrorVar
```

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