# Package 'RRMLRfMC' 

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#### Abstract

Type Package Title Reduced-Rank Multinomial Logistic Regression for Markov Chains Version 0.4.0 Description Fit the reduced-rank multinomial logistic regression model for Markov chains developed by Wang, Abner, Fardo, Schmitt, Jicha, Eldik and Kryscio (2021)[doi:10.1002/sim.8923](doi:10.1002/sim.8923) in R. It combines the ideas of multinomial logistic regression in Markov chains and reduced-rank. It is very useful in a study where multi-states model is assumed and each transition among the states is controlled by a series of covariates. The key advantage is to reduce the number of parameters to be estimated. The final coefficients for all the covariates and the p -values for the interested covariates will be reported. The p-values for the whole coefficient matrix can be calculated by two bootstrap methods.


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## Description

This function is used to update A matrix

## Usage

Aupdate(Dfix, Gamma, Adata, R, p, q, I, iniA, eps, refA)

## Arguments

| Dfix | the coefficient matrix for study covariates |
| :--- | :--- |
| Gamma | the $G$ matrix value |
| Adata | the dataset |
| R | the rank of reduced rank model |
| p | the number of covariates in the dimension reduction |
| q | the numbne of study covariates |
| I | a U by U incidence matrix with elements; $I(i, j)=1$ if state $j$ can be accessed from <br> state in one step and 0 otherwise |
| iniA | initial value for the iteration <br> eps |
| the tolerance for convergence, default is $10^{\wedge}-5$ |  |

## Value

a list of outputs:

- NewA: the updated A matrix
- $\log l$ ikeA: the loglikelihood when updating A
cogdat Cognitive Dataset


## Description

A dataset containing the states and covariates of 649 participants enrolled in the BRAiNS cohort at the University of Kentucky's Alzheimer's Disease Research Center.

## Usage

cogdat

## Format

A data frame with 6240 rows and 14 columns:
ID used to denote the participants; from 1 to 649
visitno used to denote the visit number for each participant
prstate denote the previous state
custate denote the current state
bagec baseline age (centered at age 72)
famhx family history of dementia
HBP self reported high blood pressure
apoe4 at least one Apolipoprotein-E (APOE) gene $\epsilon 4$ allele
smk1 cigarette smoking level (none versus < 10)
smk2 cigarette smoking level (11-19)
smk2 cigarette smoking level (>=20 pack years))
lowed low education
headinj self reported head injury

```
derivativeB derivativeB
```


## Description

This function is used to calculate the loglikelihood with a given matrix $\mathrm{B}=\mathrm{AG}$

## Usage

```
derivativeB(B, I, zy, refd)
```


## Arguments

B
I
zy
refd
a numeric coefficient matrix
$U$ by $U$ incidence matrix with elements; $I(i, j)=1$ if state $j$ can be accessed from state $i$ in one step and 0 otherwise
the variable values for a given observation
a vector of reference categories

## Value

loglikelihood
derivatives derivatives

## Description

This function is used calculate the derivative values (first and second derivatives for NewtonRaphson method) and loglikelihood when updating A

## Usage

derivatives(A, Gamma, Dmat, I, zy, refA)

## Arguments

A
matrix with value from previous iteration
Gamma
$G$ matrix values
Dmat the coefficient matrix for the fixed variables,
I
a $U$ by $U$ incidence matrix with elements; $I(i, j)=1$ if state $j$ can be accessed from state $i$ in one step and 0 otherwise
zy
the variable values for a given observation
refA
a vector of reference categories

## Value

a list of outputs:

- fird: the first derivative value
- secd: the second derivative value
- loglike: the loglikelihood

| expand expand |
| :--- | :--- |

## Description

This function is used to expand the Y (category) to a indicator vector

## Usage

expand(pri, curr, I, refE)

## Arguments

pri the prior state
curr the current state
I a U by U incidence matrix with elements; $I(i, j)=1$ if state $j$ can be accessed from state $i$ in one step and 0 otherwise
refE a vector with the reference categories

## Value

ry: a indicator vector
Gupdate Gupdate

## Description

This function is used to update G matrix

## Usage

Gupdate(A, Gdata, p, q, I, refG)

## Arguments

A
Gdata the dataset used to update G
$p \quad$ the number of covariates in the dimension reduction
q the numbne of study covariates
I a U by U incidence matrix with elements; $I(i, j)=1$ if state $j$ can be accessed from state $i$ in one step and 0 otherwise
refG a vector of reference categories

## Value

a list of outputs:

- NewG: the updated G matrix
- loglikeK: the loglikelihood when updating G
- sderr: standard errors for the coefficient matrix
norm norm $\quad$ n


## Description

This function is used to normalize a vector to have unit length

## Usage

norm(x)

## Arguments

x
a numeric vector

## Value

a normalized vector with length 1

```
rrmultinom rrmultinom
```


## Description

This function is used to fit the reduced rank multinomial logistic regression for markov chain

## Usage

rrmultinom(I, z1 = NULL, z2 = NULL, T, R, eps = 1e-05, ref = NULL)

## Arguments

I
z1
z2 a $n$ by $q$ matrix with study covariates (not in dimension reduction), $q$ is the number of study covariates
T

R
eps the tolerance for convergence; the default is $10^{\wedge}-5$
ref a vector of reference categories; the default is NULL and if NULL is used, the function will use the first category as the reference category for each row

## Value

a list of outputs:

- Alpha: the final A matrix
- Gamma: the final G matrix
- Beta: the coefficient matrix for variables involved in reduced rank
- Dcoe: the coefficient matrix for the fixed variables
- Dsderr: the standard error matrix for the fixed variables
- Dpval: the p-value matrix for the fixed variables
- coemat: the overall coefficient matrix
- niter: the iteration number to get converged
- df: the degrees of freedom
- loglik: the final loglikelihood
- converge: three possible values with 0 means fail to converge, 1 means converges, and 2 means the maximum iteration is achieved


## Examples

```
# generate the Markov chain
U=7
I1=I2=I3=rep(1,7)
I4=c(0,0,0,1,1,1,1)
I5=I6=I7=rep(0,7)
I=rbind(I1,I2,I3,I4,I5,I6,I7)
# prepare the data
data=cogdat
```

```
n=length(unique(data[,1]))
M=nrow(data)+n
Mc=0
z=matrix(0,n,9)
colnames(z)=colnames(data)[5:13]
T=matrix(0,M,3)
for(i in 1:n){
    subdat=data[which(data[,1]==i),,drop=FALSE]
    z[i,]=subdat[1,5:13]
    mc=nrow(subdat)
    T[(Mc+1):(Mc+mc+1),1]=i
    T[(Mc+1):(Mc+mc+1), 2]=0:mc
    T[(Mc+1):(Mc+mc+1),3]=c(subdat[1,3], subdat[,4])
    Mc=Mc+mc+1
}
#z1=z[,c(1:3),drop=FALSE]
z2=z[,4,drop=FALSE]
# fit the model with rank 1
rrmultinom(I,z1=NULL,z2,T,1,eps=9,ref=c(1,1,1,4))
```

sdfun sdfun

## Description

This function is used get the standard error matrix from bootstrap method It returns the matrices of standard error and p-value for the coefficient matrix

## Usage

$\operatorname{sdfun}(\mathrm{I}, \mathrm{z} 1=\mathrm{NULL}, \mathrm{z} 2=\mathrm{NULL}, \mathrm{T}, \mathrm{R}, \mathrm{eps}=1 \mathrm{e}-05, \mathrm{~B}$, tpoint $=$ NULL, ref)

## Arguments

I
z1
z2

T

R
a $U$ by $U$ incidence matrix with elements; $U$ is the number of states; $I(i, j)=1$ if state j can be accessed from state i in one step and 0 otherwise
a $n$ by $p$ matrix with covariates involved in the dimension reduction( DR ), $n$ is the number of subjects, p is the number of covariates involved in DR number of study covariates
a M by 3 state matrix,

- the first column is a subject number between $1, . ., \mathrm{n}$;
- the second column is time;
- the third column is the state occupied by subject in column 1 at time indicated in column 2
the rank

| eps | the tolerance for convergence; the default is $10^{\wedge}-5$ |
| :--- | :--- |
| B | the bootstrap number |
| tpoint | a matrix has two columns with the participants’ visit information about timeline |
| ref | a vector of reference categories |

## Value

a list of outputs:

- coe: the coefficient matrix of the original data
- sd: the standard error matrix
- pvalue: the p-value matrix


## Examples

```
# generate the Markov chain
U=7
I1=I2=I3=rep(1,7)
I4=c(0,0,0,1,1,1,1)
I5=I6=I7=rep (0,7)
I=rbind(I1,I2,I3,I4,I5,I6,I7)
# prepare the data
data=cogdat
n=length(unique(data[,1]))
M=nrow(data)+n
Mc=0
z=matrix(0,n,9)
colnames(z)=colnames(data)[5:13]
T=matrix(0,M, 3)
for(i in 1:n){
    subdat=data[which(data[,1]==i), ,drop=FALSE]
    z[i,]=subdat[1,5:13]
    mc=nrow(subdat)
    T[(Mc+1):(Mc+mc+1),1]=i
    T[(Mc+1):(Mc+mc+1), 2]=0:mc
    T[(Mc+1):(Mc+mc+1), 3]=c(subdat[1,3], subdat[,4])
    Mc=Mc+mc+1
}
#z1=z[,c(1:3),drop=FALSE]
z2=z[,4,drop=FALSE]
# find the standard deviation matrix for the model with rank 1
sdfun(I,z1=NULL,z2,T,1,eps = 9,2,ref=c(1,1,1,4))
```


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