# Package 'RMoE'

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     The main reference is the following one:
     Huynh, B. T. (2019) <arXiv:1907.06994>.
URL https://github.com/fchamroukhi/HDME
BugReports https://github.com/fchamroukhi/HDME/issues
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Imports methods,
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     CoorLQk.R
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RMoE-package

RMoE: LASSO Regularized Mixture of Experts Models

#### **Description**

RMoE is a package containing regularized Mixture of Experts models using the Lasso penalty. RMoE contains the following Regularized Mixture-of-Experts models:

- GaussianRMoE: Gaussian Regularized Mixture of Experts;
- LogisticRMoE: Logistic Regularized Mixture of Experts;
- PoissonRMoE: Poisson Regularized Mixture of Experts.

To learn more about RMoE, start with the vignettes: browseVignettes(package = "RMoE")

#### Author(s)

Maintainer: Bao-Tuyen Huynh <baotuyen.dlu@gmail.com>

Authors:

• Faicel Chamroukhi <faicel.chamroukhi@unicaen.fr> (0000-0002-5894-3103)

#### References

Huynh B. T., Chamroukhi F. 2019. *Estimation and Feature Selection in Mixtures of Generalized Linear Experts Models.* https://arxiv.org/abs/1907.06994.

## See Also

Useful links:

- https://github.com/fchamroukhi/HDME
- Report bugs at https://github.com/fchamroukhi/HDME/issues

cleveland

The Cleveland data set

## **Description**

The Cleveland data set

#### Usage

cleveland

#### **Format**

A data frame with 297 rows and 15 columns.

4 **GaussRMoE** 

gaussian

A simulated gaussian data set

## Description

A simulated gaussian data set

## Usage

gaussian

#### **Format**

A data frame with 300 rows and 8 columns.

GaussRMoE

Penalized MLE for the regularized Mixture of Experts.

## **Description**

This function provides a penalized MLE for the regularized Mixture of Experts (MoE) model corresponding with the penalty parameters Lambda, Gamma.

## Usage

```
GaussRMoE(Xm, Ym, K, Lambda, Gamma, option = FALSE, verbose = FALSE)
```

## Arguments

Xm	Matrix of explanatory variables. Each feature should be standardized to have mean 0 and variance 1. One must add the column vector (1,1,,1) for the intercept variable.
Ym	Vector of the response variable. For the Gaussian case Y should be standardized. For multi-logistic model Y is numbered from 1 to R (R is the number of labels of Y).
K	Number of experts $(K > 1)$ .
Lambda	Penalty value for the experts.

Gamma Penalty value for the gating network.

option Optional. option = TRUE: using proximal Newton-type method; option = FALSE:

using proximal Newton method.

Optional. A logical value indicating whether or not values of the log-likelihood verbose

should be printed during EM iterations.

## Value

GaussRMoE returns an object of class GRMoE.

## See Also

**GRMoE** 

GRMoE-class 5

GRMoE-class

A Reference Class which contains parameters of a GRMoE model.

#### **Description**

GRMoE contains all the parameters of a Gaussian Regularized Mixture-of-Experts.

#### **Fields**

- X The matrix data for the input.
- Y Vector of the response variable.
- d Numeric. Number of explanatory variables (including the intercept variable).
- n Numeric. Length of the response/output vector Y.
- K Number of expert classes.

Lambda Penalty value for the expert part.

Gamma Penalty value for the gating network.

wk Parameters of the gating network. Matrix of dimension (K-1,d), with d the number of explanatory variables (including the intercept).

betak Regressions coefficients for each expert. Matrix of dimension (d, K).

sigma Numeric. The standard deviation.

loglik Numeric. Observed-data log-likelihood of the GRMoE model.

storedloglik Numeric vector. Stored values of the log-likelihood at each EM iteration.

BIC Numeric. Value of BIC (Bayesian Information Criterion).

#### Methods

plot() Plot method.

housing

The Housing data set

## **Description**

The Housing data set

#### Usage

housing

#### **Format**

A data frame with 506 rows and 15 columns.

6 LogisticRMoE

ionosphere

The Ionosphere data set

## Description

The Ionosphere data set

## Usage

ionosphere

#### **Format**

A data frame with 351 rows and 35 columns.

logistic

A simulated logistic data set

## Description

A simulated logistic data set

# Usage

logistic

## **Format**

A data frame with 300 rows and 8 columns.

LogisticRMoE

Penalized MLE for the logistic regularized Mixture of Experts.

## Description

This function provides a penalized MLE for the logistic regularized Mixture of Experts (MoE) model corresponding with the penalty parameters Lambda, Gamma.

## Usage

```
LogisticRMoE(Xmat, Ymat, K, Lambda, Gamma, option = FALSE,
  verbose = FALSE)
```

LRMoE-class 7

#### **Arguments**

Xmat Matrix of explanatory variables. Each feature should be standardized to have

mean 0 and variance 1. One must add the column vector (1,1,...,1) for the inter-

cept variable.

Ymat Vector of the response variable. For the Gaussian case Y should be standardized.

For multi-logistic model Y is numbered from 1 to R (R is the number of labels

of Y).

K Number of experts (K > 1). Lambda Penalty value for the experts.

Gamma Penalty value for the gating network.

option Optional. option = TRUE: using proximal Newton-type method; option = FALSE:

using proximal Newton method.

verbose Optional. A logical value indicating whether or not values of the log-likelihood

should be printed during EM iterations.

#### Value

LogisticRMoE returns an object of class LRMoE.

#### See Also

#### **LRMoE**

LRMoE-class

A Reference Class which contains parameters of a LRMoE model.

## **Description**

LRMoE contains all the parameters of a Logistic Regularized Mixture-of-Experts.

## **Fields**

- X The matrix data for the input.
- Y Vector of the response variable.
- d Numeric. Number of explanatory variables (including the intercept variable).
- n Numeric. Length of the response/output vector Y.
- R Numeric. Maximum value of Y.
- K Number of expert classes.

Lambda Penalty value for the expert part.

Gamma Penalty value for the gating network.

wk Parameters of the gating network. Matrix of dimension (K-1,d), with d the number of explanatory variables (including the intercept).

eta Values of the regression coefficients for each level r = 1,...,R. Array of dimension (K, R-1, d).

loglik Numeric. Observed-data log-likelihood of the LRMoE model.

storedloglik Numeric vector. Stored values of the log-likelihood at each EM iteration.

BIC Numeric. Value of BIC (Bayesian Information Criterion).

8 PoissonRMoE

#### Methods

plot() Plot method.

musk1

The Musk-1 data set

## **Description**

The Musk-1 data set

## Usage

musk1

## **Format**

A data frame with 476 rows and 168 columns.

poisson

A simulated poisson data set

## Description

A simulated poisson data set

## Usage

poisson

#### **Format**

A data frame with 300 rows and 8 columns.

PoissonRMoE

Penalized MLE for the Poisson regularized Mixture of Experts.

## Description

This function provides a penalized MLE for the Poisson regularized Mixture of Experts (MoE) model corresponding with the penalty parameters Lambda, Gamma.

## Usage

```
PoissonRMoE(Xmat, Ymat, K, Lambda, Gamma, option = FALSE,
  verbose = TRUE)
```

PRMoE-class 9

#### **Arguments**

Xmat Matrix of explanatory variables. Each feature should be standardized to have

mean 0 and variance 1. One must add the column vector (1,1,...,1) for the inter-

cept variable.

Ymat Vector of the response variable. For the Gaussian case Y should be standardized.

For multi-logistic model Y is numbered from 1 to R (R is the number of labels

of Y).

K Number of experts (K > 1). Lambda Penalty value for the experts.

Gamma Penalty value for the gating network.

option Optional. option = TRUE: using proximal Newton-type method; option = FALSE:

using proximal Newton method.

verbose Optional. A logical value indicating whether or not values of the log-likelihood

should be printed during EM iterations.

#### Value

PoissonRMoE returns an object of class PRMoE.

#### See Also

#### **PRMoE**

PRMoE-class A Reference Class which contains parameters of a PRMoE model.

## Description

PRMoE contains all the parameters of a Poisson Regularized Mixture-of-Experts.

#### **Fields**

- X The matrix data for the input.
- Y Vector of the response variable.
- d Numeric. Number of explanatory variables (including the intercept variable).
- n Numeric. Length of the response/output vector Y.
- K Number of expert classes.

Lambda Penalty value for the expert part.

Gamma Penalty value for the gating network.

wk Parameters of the gating network. Matrix of dimension (K-1,d), with d the number of explanatory variables (including the intercept).

betak Regressions coefficients for each expert. Matrix of dimension (d, K).

loglik Numeric. Observed-data log-likelihood of the PRMoE model.

storedloglik Numeric vector. Stored values of the log-likelihood at each EM iteration.

BIC Numeric. Value of BIC (Bayesian Information Criterion).

## Methods

plot() Plot method.

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residential

The Residential Building data set

# Description

The Residential Building data set

# Usage

residential

## **Format**

A data frame with 372 rows and 109 columns.

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