

Package ‘advclust’

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Type Package

Title Object Oriented Advanced Clustering

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Description

S4 Object Oriented for Advanced Fuzzy Clustering and Fuzzy COnsensus Clustering. Techniques that provided by this package are Fuzzy C-Means, Gustafson Kessel (Babuska Version), Gath-Geva, Sum Voting Consensus, Product Voting Consensus, and Borda Voting Consensus. This package also provide visualization via Biplot and Radar Plot.

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Depends R (>= 3.2.5)

Imports knitr, methods, MASS, clue, ggplot2, reshape2

LazyData TRUE

RoxygenNote 5.0.1

Collate 'as_Membership.R' 'biplot.R' 'c_fuzzycluster.R'
'class_membership.R' 'class_co_fuzzycluster.R'
'class_fuzzycluster.R' 'class_fuzzycluster_list.R'
'class_validation.R' 'co.vote.R' 'cpair_fuzzy.R' 'fuzzy.CM.R'
'fuzzy.GG.R' 'fuzzy.GK.R' 'is_Membership.R' 'membership.R'
'method_co_fuzzycluster.R' 'method_fuzzycluster.R'
'method_fuzzycluster_list.R' 'method_membership.R'
'method_validation.R' 'minWeightBipartiteMatching.R'
'print_Membership.R' 'print_co_fuzzycluster.R'
'print_fuzzycluster.R' 'print_validation.R' 'radarplot.R'
'validation.R' 'zzz.R'

Suggests rmarkdown

VignetteBuilder knitr

NeedsCompilation no

Repository CRAN

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as.membership	<i>As Membership/Membership Matrix</i>
---------------	--

Description

Convert matrix to membership matrix

Usage

```
as.membership(member)
```

Arguments

member	membership matrix
--------	-------------------

Value

Membership Membership object

Slots

member membership matrix

hard.label hard label

biploting

Biploting Fuzzy Cluster Result

Description

Biploting Fuzzy Cluster Result

Usage

biploting(object, data.X, scale)

Arguments

object a cluster object

data.X a data matrix that used for clustering

scale scaling option (T/F)

Details

Make Visualization Biplot from fuzzy cluster / consensus fuzzy cluster analysis result

Examples

```
fuzzy.CM(iris[,1:4],K=3,m=2,max.iteration=100,threshold=1e-5,RandomNumber=1234)->c11  
biploting(c11,iris[,1:4])
```

 co.vote

Consensus / Ensemble Fuzzy Clustering: Voting

Description

Provide consensus / ensemble fuzzy clustering with voting method. Several option for voting step provided

Usage

```
co.vote(object, method)
```

Arguments

object	a fuzzycluster_list object
method	voting step that used to combine the partition ("sum","borda","product")

Details

Consensus clustering is method for combine several result of clustering into one robust result. This method used to overcome unstability of cluster result.

This function perform consensus clustering with voting approach. Voting approach look the domination of membership with several algorithm like sum rule, product rule and borda rule.

The differences of that method are how to combine several membership. Sum rule use Sum operation. Product rule use Product operation, and Borda use Borda count algorithm.

Value

Fuzzy Consensus Object

Slots

member	membership matrix
hard.label	hard.label
method.consensus	method of consensus

References

Sevillano, X., Alias, F., & Socoro, J. C. (2013). Posisional and Confidence voting-based Consensus Function For Fuzzy Cluster Ensemble.

Examples

```
fuzzy.CM(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)->c11
fuzzy.GK(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)->c12
fuzzy.CM(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)->c13
c_fuzzycluster(c11,c12,c13)->CL
co.vote(CL,"borda")
```

co_fuzzycluster-class *Consensus Fuzzy Cluster Result*

Description

Consensus Fuzzy Cluster Result

Slots

member membership matrix
 hard.label vector of hard partition
 method.consensus method of fuzzy clustering used

c_fuzzycluster *Combine fuzzy cluster result*

Description

combining fuzzy cluster result before ensembling

Usage

```
c_fuzzycluster(x, ...)
```

Arguments

x a fuzzy cluster object
 ... a fuzzy cluster object

Value

Fuzzy Clustering List

Slots

pair pair list

Examples

```
fuzzy.CM(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)->c11
fuzzy.GK(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)->c12
c_fuzzycluster(c11,c12)
```

fuzzy.CM

*Fuzzy C-Means***Description**

Fuzzy C-Means clustering Algorithm (Bezdek, 1984)

Usage

```
fuzzy.CM(X, K, m, max.iteration, threshold, member.init, RandomNumber = 0,
         print.result = 0)
```

Arguments

X	dataset (matrix/data frame)
K	number of cluster
m	fuzzyfier
max.iteration	maximum iteration for convergence
threshold	convergence criteria
member.init	membership object or matrix that will be used for initialized
RandomNumber	random number for start initializing
print.result	print result (9/1)

Details

This function perform Fuzzy C-Means algorithm by Bezdek (1984). Fuzzy C-Means is one of fuzzy clustering methods to clustering dataset become K cluster. Number of cluster (K) must be greater than 1. To control the overlapping or fuzziness of clustering, parameter m must be specified. Maximum iteration and threshold is specific number for convergencing the cluster. Random Number is number that will be used for seeding to firstly generate fuzzy membership matrix.

Clustering will produce fuzzy membership matrix (U) and fuzzy cluster centroid (V). The greatest value of membership on data point will determine cluster label. Centroid or cluster center can be use to interpret the cluster. Both membership and centroid produced by calculating mathematical distance. Fuzzy C-Means calculate distance with Euclidean norm.

Value

Fuzzy Clustering object

Slots

centroid centroid matrix
 distance distance matrix
 func.obj function objective

call.func called function
fuzzyfier fuzzyness parameter
method.fuzzy method of fuzzy clustering used
member membership matrix
hard.label hard.label

References

Balasko, B., Abonyi, J., & Feil, B. (2002). Fuzzy Clustering and Data Analysis Toolbox: For Use with Matlab. Veszprem, Hungary.

Bezdek, J. C., Ehrlich, R., & Full, W. (1984). FCM: The Fuzzy C-Means Clustering Algorithm. Computers and Geosciences Vol 10, 191-203

Examples

```
fuzzy.CM(iris[,1:4],K=3,m=2,max.iteration=100,threshold=1e-5,RandomNumber=1234)
```

fuzzy.cPair	<i>Pairing fuzzy cluster</i>
-------------	------------------------------

Description

Pairing fuzzy cluster

Usage

```
fuzzy.cPair(x, y)
```

Arguments

x	an fuzzycluster object
y	an fuzzycluster object

fuzzy.GG

*Gath Geva Clustering***Description**

Gath Geva for Fuzzy Clustering

Usage

```
fuzzy.GG(X, K, m, max.iteration, threshold, member.init, RandomNumber = 0,
         print.result = 0)
```

Arguments

X	dataset (matrix/data frame)
K	number of cluster
m	fuzzyfier
max.iteration	maximum iteration for convergence
threshold	convergence criteria
member.init	membership object or matrix that will be used for initialized
RandomNumber	random number for start initializing
print.result	print result (0/1)

Details

This function perform Gath Geva algorithm by Gath-Geva (1989). Gath Geva is one of fuzzy clustering methods to clustering dataset become K cluster. Number of cluster (K) must be greater than 1. To control the overlapping or fuzziness of clustering, parameter m must be specified. Maximum iteration and threshold is specific number for convergencing the cluster. Random Number is number that will be used for seeding to firstly generate fuzzy membership matrix.

Clustering will produce fuzzy membership matrix (U) and fuzzy cluster centroid (V). The greatest value of membership on data point will determine cluster label. Centroid or cluster center can be use to interpret the cluster. Both membership and centroid produced by calculating mathematical distance. Gath Geva distance with Covariance Cluster and norm distribution assumption

Value

Fuzzy Clustering object

Slots

centroid centroid matrix
 distance distance matrix
 func.obj function objective

call.func called function
 fuzzyfier fuzzyness parameter
 method.fuzzy method of fuzzy clustering used
 member membership matrix
 hard.label hard.label

References

Gath and A.B. Geva,(1989) Unsupervised Optimal Fuzzy Clustering Balasko, B., Abonyi, J., & Feil, B. (2002). Fuzzy Clustering and Data Analysis Toolbox: For Use with Matlab. Veszprem, Hungary.

Examples

```
fuzzy.GG(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)
```

 fuzzy.GK

Gustafson Kessel Clustering with Babuska Improvisation

Description

Gustafson Kessel clustering Algorithm that improved by Babuska for estimating covariance cluster (Babuska, 2002)

Usage

```
fuzzy.GK(X, K, m, gamma, rho, max.iteration, threshold, member.init,
  RandomNumber = 0, print.result = 0)
```

Arguments

X	dataset (matrix/data frame)
K	number of cluster
m	fuzzyfier
gamma	tuning parameter
rho	volume cluster parameter
max.iteration	maximum iteration for convergence
threshold	convergence criteria
member.init	membership object or matrix that will be used for initialized
RandomNumber	random number for start initializing
print.result	print result (0/1)

Details

This function perform Gustafson Kessel algorithm by Gustafson Kessel (1968) that improved by Babuska et al (2002). Gustafson Kessel (GK) is one of fuzzy clustering methods to clustering dataset become K cluster. Number of cluster (K) must be greater than 1. To control the overlapping or fuzziness of clustering, parameter m must be specified. Maximum iteration and threshold is specific number for convergencing the cluster. Random Number is number that will be used for seeding to firstly generate fuzzy membership matrix.

Clustering will produce fuzzy membership matrix (U) and fuzzy cluster centroid (V). The greatest value of membership on data point will determine cluster label. Centroid or cluster center can be use to interpret the cluster. Both membership and centroid produced by calculating mathematical distance. Gustafson Kessel calculate distance with Covariance Cluster norm distance. So it can be said that cluster will have both spherichal and elipsodial shape of geometry.

Babuska improve the covariance estimation via tuning covariance cluster with covariance of data. Tuning parameter determine proportion of covariance data and covariance cluster that will be used to estimate new covariance cluster. Beside improving via tuning, Basbuka improve the algorithm with decomposition of covariance so it will become non singular matrix.

Value

Fuzzy Clustering object

Slots

centroid centroid matrix
 distance distance matrix
 func.obj function objective
 call.func called function
 fuzzyfier fuzzyness parameter
 method.fuzzy method of fuzzy clustering used
 member membership matrix
 hard.label hard.label

References

- Babuska, R., Veen, P. v., & Kaymak, U. (2002). Improved Covarians Estimation for Gustafson Kessel Clustering. IEEE, 1081-1084.
- Balasko, B., Abonyi, J., & Feil, B. (2002). Fuzzy Clustering and Data Analysis Toolbox: For Use with Matlab. Veszprem, Hungary.
- Gustafson, D. E., & Kessel, W. C. (1978). Fuzzy Clustering With A Fuzzy Covariance Matrix. 761-766.

Examples

```
fuzzy.GK(iris[,1:4],K=2,m=2,max.iteration=20,threshold=1e-3,RandomNumber=1234)
```

fuzzycluster-class *Fuzzy Result*

Description

Fuzzy Result

Slots

centroid centroid matrix
distance distance matrix
func.obj function objective
call.func called function
fuzzyfier fuzzyness parameter
method.fuzzy method of fuzzy clustering used
member membership matrix
hard.label hard.label

fuzzycluster_list-class
 Fuzzy Result List

Description

Fuzzy Result List

Slots

pair list of fuzzy cluster object

is.membership	<i>Check membership Matrix/Object</i>
---------------	---------------------------------------

Description

checking object is membership object or not

Usage

```
is.membership(object)
```

Arguments

object	an object that used for membership checking
--------	---

Value

T/F

is.na,co_fuzzycluster-method	<i>Method for co_fuzzycluster classes</i>
------------------------------	---

Description

Method for co_fuzzycluster classes

Usage

```
## S4 method for signature 'co_fuzzycluster'
is.na(x)
```

```
## S4 method for signature 'co_fuzzycluster'
show(object)
```

```
method.consensus(x)
```

```
## S4 method for signature 'co_fuzzycluster'
method.consensus(x)
```

Arguments

x	an co_fuzzycluster object
object	an co_fuzzycluster object

is.na, fuzzycluster-method
Method for fuzzycluster classes

Description

Method for fuzzycluster classes

Usage

```
## S4 method for signature 'fuzzycluster'  
is.na(x)  
  
## S4 method for signature 'fuzzycluster'  
show(object)  
  
centroid(x)  
  
## S4 method for signature 'fuzzycluster'  
centroid(x)  
  
distance(x)  
  
## S4 method for signature 'fuzzycluster'  
distance(x)  
  
func.obj(x)  
  
## S4 method for signature 'fuzzycluster'  
func.obj(x)  
  
call.func(x)  
  
## S4 method for signature 'fuzzycluster'  
call.func(x)  
  
fuzzyfier(x)  
  
## S4 method for signature 'fuzzycluster'  
fuzzyfier(x)  
  
method.fuzzy(x)  
  
## S4 method for signature 'fuzzycluster'  
method.fuzzy(x)  
  
.cPair(x, y)
```

```
## S4 method for signature 'fuzzycluster, fuzzycluster'  
.cPair(x, y)  
  
## S4 method for signature 'fuzzycluster, ANY'  
.cPair(x, y)  
  
## S4 method for signature 'ANY, fuzzycluster'  
.cPair(x, y)  
  
## S4 method for signature 'ANY, ANY'  
.cPair(x, y)
```

Arguments

x	an fuzzycluster object
object	an fuzzycluster object
y	an fuzzycluster object

is.na, membership-method

Method for membership classes

Description

Method for membership classes

Usage

```
## S4 method for signature 'membership'  
is.na(x)  
  
## S4 method for signature 'membership'  
show(object)  
  
member(x)  
  
## S4 method for signature 'membership'  
member(x)  
  
hard.label(x)  
  
## S4 method for signature 'membership'  
hard.label(x)
```

Arguments

x	an object
object	an object

membership	<i>Make an Partition Matrix</i>
------------	---------------------------------

Description

Make an Partition Matrix

Usage

```
membership(member, K, n, RandomNumber = 0)
```

Arguments

member	membership matrix
K	number of cluster
n	number of observation
RandomNumber	random number/seed used

Value

membership object

Slots

member	membership object
hard.label	hard label

Examples

```
#make an matrix membership
membership(K=3,n=20,RandomNumber=1234)
```

membership-class	<i>Membership</i>
------------------	-------------------

Description

Membership

Slots

member	membership matrix
hard.label	vector of hard hard.labeling

minWeightBipartiteMatching
Matching label

Description

Matching label of 2 cluster via Hungary Algorithm

Usage

```
minWeightBipartiteMatching(x, y)
```

Arguments

x	an fuzzycluster object
y	an fuzzy cluster object

pair *Method for fuzzycluster_list classes*

Description

Method for fuzzycluster_list classes

Usage

```
pair(object)  
  
## S4 method for signature 'fuzzycluster_list'  
pair(object)
```

Arguments

object	an fuzzycluster_list object
--------	-----------------------------

print.co_fuzzycluster *Print Consensus Fuzzy Clustering Result*

Description

Print Consensus Fuzzy Clustering

Usage

```
## S3 method for class 'co_fuzzycluster'  
print(x, ...)
```

Arguments

x	consensus fuzzy clustering object
...	another paramater

print.fuzzycluster *Print Fuzzy Clustering Result*

Description

Print Fuzzy Clustering

Usage

```
## S3 method for class 'fuzzycluster'  
print(x, ...)
```

Arguments

x	fuzzy clustering object
...	another paramater

print.membership *Print membership*

Description

Print membership object

Usage

```
## S3 method for class 'membership'  
print(x, ...)
```

Arguments

x membership object
... another parameter

print.validation *Print Validation Index*

Description

Print Validation Index for fuzzy clustering

Usage

```
## S3 method for class 'validation'  
print(x, ...)
```

Arguments

x validation object
... another parameter

radar.plotting	<i>Radar Ploting Fuzzy Cluster Result</i>
----------------	---

Description

Radar Ploting Fuzzy Cluster Result

Usage

```
radar.plotting(object, data.X)
```

Arguments

object	a fuzzycluster object
data.X	a matrix data

Details

Make Visualization Radar Ploting

Examples

```
fuzzy.CM(iris[,1:4],K=3,m=2,max.iteration=100,threshold=1e-5,RandomNumber=1234)->cl
radar.plotting(cl,iris[,1:4])
```

```
show,validation-method
```

Method for validation classes

Description

Method for validation classes

Usage

```
## S4 method for signature 'validation'
show(object)
```

```
PC(x)
```

```
## S4 method for signature 'validation'
PC(x)
```

```
MPC(x)
```

```
## S4 method for signature 'validation'
```

```

MPC(x)

CE(x)

## S4 method for signature 'validation'
CE(x)

XB(x)

## S4 method for signature 'validation'
XB(x)

S(x)

## S4 method for signature 'validation'
S(x)

Tang(x)

## S4 method for signature 'validation'
Tang(x)

Kwon(x)

## S4 method for signature 'validation'
Kwon(x)

```

Arguments

object	an object
x	an object

validation-class	<i>Validation Class</i>
------------------	-------------------------

Description

Validation Class

Slots

PC Partition Coefficient index
MPC Modified Partition Coefficient index
CE Classification Entropy index
S Separation index
XB Xie Beni index

Kwon Kwon index

Tang Tang index

validation.index *Validation Index*

Description

Validation index for validating fuzzy clustering result

Usage

```
validation.index(object)
```

Arguments

object fuzzy clustering object

Details

This function provide several validation indexes that calculated from fuzzy clustering result. Validation index can be used for choose best optimum parameter.

There are PC, MPC, CE, S, Xie Beni, Kwon, and Tang index. PC (Partition Coefficient), MPC (Modified Partition Coefficient), and CE (Classification Entropy) are calculated from membership matrix. S (Separation Index), Xie Beni, Kwon, and Tang use both distance and membership matrix.

The best cluster result can be decided with minimum value of index, except MPC and PC use maximum value.

Value

validation index object.

Slots

XB Xie Beni Index

PC Partition Coef.

MPC Modified Partition Coef.

Kwon Kwon Index

Tang Tang Index

S Separation Index

CE Classification Entropy

Author(s)

Achmad Fauzi Bagus F

References

Wang, W., & Zhang, Y. (2007). On Fuzzy Cluster Validity Indices. *Fuzzy Sets and System*, 2095-2117.

Examples

```
fuzzy.CM(iris[,1:4],K=3,m=2,max.iteration=100,threshold=1e-5,RandomNumber=1234)->c1
validation.index(c1)->valid
#example for Xie Beni index
XB(valid)
```

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