MATLAB聚类有效性评价指标（外部）

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更多内容，请看：MATLAB、聚类、MATLAB聚类有效性评价指标（外部 成对度量）、MATLAB: Clustering Algorithms

前提：数据的真实标签已知！

1．归一化互信息(Normalized Mutual information)

定义

$$NMI(C,T)=\frac{\sum_{i=1}^{K}\sum_{j=1}^{K}p_{ij}\log\left(\frac{p_{ij}}{p_{C_i}\cdot p_{T_j}}\right)}{\sqrt{\sum_{i=1}^{K}p_{C_i}\log p_{C_i}\cdot\sum_{j=1}^{K}p_{T_j}\log p_{T_j}}}$$

程序

```
function MIhat = nmi(A, B)
%NMI Normalized mutual information
% A, B: 1*N;
if length(A) ~= length(B)
```

```
    error('length( A ) must == length( B)');
end
N = length(A);
A_id = unique(A);
K_A = length(A_id);
B_id = unique(B);
K_B = length(B_id);
% Mutual information
A_occur = double (repmat( A, K_A, 1) == repmat( A_id', 1, N ));
B_occur = double (repmat( B, K_B, 1) == repmat( B_id', 1, N ));
AB_occur = A_occur * B_occur';
P_A= sum(A_occur') / N;
P_B = sum(B_occur') / N;
P_AB = AB_occur / N;
MImatrix = P_AB .* log(P_AB ./(P_A' * P_B)+eps);
MI = sum(MImatrix(:));
% Entropies
H_A = -sum(P_A .* log(P_A + eps),2);
H_B= -sum(P_B .* log(P_B + eps),2);
%Normalized Mutual information
MIhat = MI / sqrt(H_A*H_B);
```

结果

```
>> A = [1 1 1 1 1 1 2 2 2 2 2 2 3 3 3 3 3];
>> B = [1 2 1 1 1 1 1 2 2 2 2 3 1 1 3 3 3];
>> MIhat = nmi(A, B)

MIhat =

    0.3646
```

2. Rand统计量(Rand index)

定义

$$RI = \frac{TP + TN}{N(\mathrm{N}-1)/2}$$

程序

```
function [AR,RI,MI,HI]=RandIndex(c1,c2)
%RANDINDEX - calculates Rand Indices to compare two partitions
% ARI=RANDINDEX(c1,c2), where c1,c2 are vectors listing the
% class membership, returns the "Hubert & Arabie adjusted Rand index".
% [AR,RI,MI,HI]=RANDINDEX(c1,c2) returns the adjusted Rand index,
% the unadjusted Rand index, "Mirkin's" index and "Hubert's" index.

if nargin < 2 || min(size(c1)) > 1 || min(size(c2)) > 1
   error('RandIndex: Requires two vector arguments')
   return
end

C=Contingency(c1,c2);   %form contingency matrix

n=sum(sum(C));
nis=sum(sum(C,2).^2);           %sum of squares of sums of rows
njs=sum(sum(C,1).^2);           %sum of squares of sums of columns

t1=nchoosek(n,2);               %total number of pairs of entities
t2=sum(sum(C.^2));      %sum over rows & columnns of nij^2
t3=.5*(nis+njs);

%Expected index (for adjustment)
nc=(n*(n^2+1)-(n+1)*nis-(n+1)*njs+2*(nis*njs)/n)/(2*(n-1));

A=t1+t2-t3;             %no. agreements
D=  -t2+t3;             %no. disagreements

if t1==nc
   AR=0;                        %avoid division by zero; if k=1, define Rand = 0
else
   AR=(A-nc)/(t1-nc);           %adjusted Rand - Hubert & Arabie 1985
end
```

```
RI=A/t1;                          %Rand 1971              %Probability of agreement
MI=D/t1;                          %Mirkin 1970    %p(disagreement)
HI=(A-D)/t1;    %Hubert 1977    %p(agree)-p(disagree)

function Cont=Contingency(Mem1,Mem2)

if nargin < 2 || min(size(Mem1)) > 1 || min(size(Mem2)) > 1
   error('Contingency: Requires two vector arguments')
   return
end

Cont=zeros(max(Mem1),max(Mem2));

for i = 1:length(Mem1)
   Cont(Mem1(i),Mem2(i))=Cont(Mem1(i),Mem2(i))+1;
end
```

程序中包含了四种聚类度量方法：Adjusted Rand index、Rand index、Mirkin index、Hubert index。

结果

```
>> A = [1 1 1 1 1 1 2 2 2 2 2 2 3 3 3 3 3];
>> B = [1 2 1 1 1 1 1 2 2 2 2 3 1 1 3 3 3];
>> [AR,RI,MI,HI]=RandIndex(A,B)

AR =

    0.2429


RI =

    0.6765


MI =

    0.3235


HI =

    0.3529
```

3．参考文献

(simple) Tool for estimating the number of clusters

Mutual information and Normalized Mutual information 互信息和标准化互信息

Evaluation of clustering