```
library(cluster)
```

Cargar la matriz de datos.

```
X<-as.data.frame(state.x77)
colnames(X)</pre>
```

```
## [1] "Population" "Income" "Illiteracy" "Life Exp" "Murder"
## [6] "HS Grad" "Frost" "Area"
```

Transformacion de datos

Transformacion de las variables x1,x3 y x8 con la funcion de logaritmo.

```
X[,1]<-log(X[,1])
colnames(X)[1]<-"Log-Population"</pre>
```

```
X[,3]<-log(X[,3])
colnames(X)[3]<-"Log-Illiteracy"</pre>
```

```
X[,8]<-log(X[,8])
colnames(X)[8]<-"Log-Area"</pre>
```

Metodo PAM

1.- Separacion de filas y columnas.

```
dim(X)
```

```
## [1] 50 8
```

```
n<-dim(X)[1]
p<-dim(X)[2]
```

2.- Estandarizacion univariante.

```
X.s<-scale(X)
```

3.- Aplicacion del algoritmo

```
pam.3<-pam(X.s,3)
```

4.- Clusters

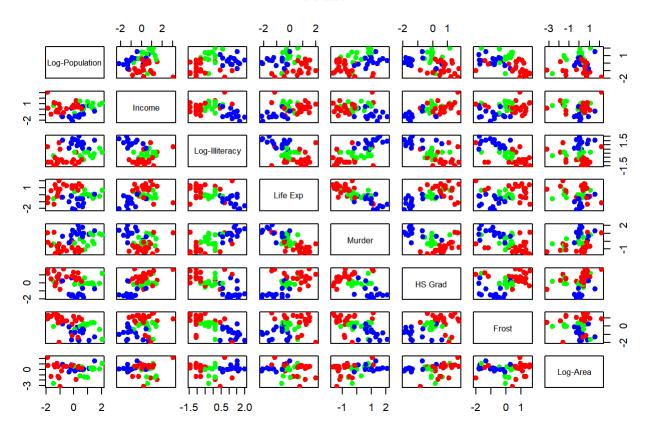
cl.pam<-pam.3\$clustering
cl.pam</pre>

2	Alaska 2 Connecticut	1	1	California 3
2	Connecticut	1 Delaware	_	3
2	_	Delaware		
2	_		Florida	Georgia
11-11-11	2	3	1	1
Hawaii	Idaho	Illinois	Indiana	Iowa
2	2	3	3	2
Kansas	Kentucky	Louisiana	Maine	Maryland
2	1	1	2	3
Massachusetts	Michigan	Minnesota	Mississippi	Missouri
3	3	2	1	3
Montana	Nebraska	Nevada	New Hampshire	New Jersey
2	2	2	2	3
New Mexico	New York	North Carolina	North Dakota	Ohio
1	3	1	2	3
Oklahoma	Oregon	Pennsylvania	Rhode Island	South Carolina
3	2	3	2	1
South Dakota	Tennessee	Texas	Utah	Vermont
2	1	1	2	2
Virginia	Washington	West Virginia	Wisconsin	Wyoming
1	2	1	2	2
	2 Massachusetts 3 Montana 2 New Mexico 1 Oklahoma 3 South Dakota 2	Kansas Kentucky 2 1 Massachusetts Michigan 3 3 Montana Nebraska 2 2 New Mexico New York 1 3 Oklahoma Oregon 3 2 South Dakota Tennessee 2 1 Virginia Washington	Kansas Kentucky Louisiana 2 1 1 Massachusetts Michigan Minnesota 3 3 2 Montana Nebraska Nevada 2 2 2 New Mexico New York North Carolina 1 3 1 Oklahoma Oregon Pennsylvania 3 2 3 South Dakota Tennessee Texas 2 1 1 Virginia Washington West Virginia	Kansas Kentucky Louisiana Maine 2 1 1 1 2 Massachusetts Michigan Minnesota Mississippi 3 3 2 1 Montana Nebraska Nevada New Hampshire 2 2 2 2 2 New Mexico New York North Carolina North Dakota 1 3 1 2 Oklahoma Oregon Pennsylvania Rhode Island 3 2 3 2 South Dakota Tennessee Texas Utah 2 1 1 2 Virginia Washington West Virginia Wisconsin

5.- Scatter plot de la matriz con los grupos

```
col.cluster<-c("blue","red","green")[cl.pam]
pairs(X.s, col=col.cluster, main="PAM", pch=19)</pre>
```

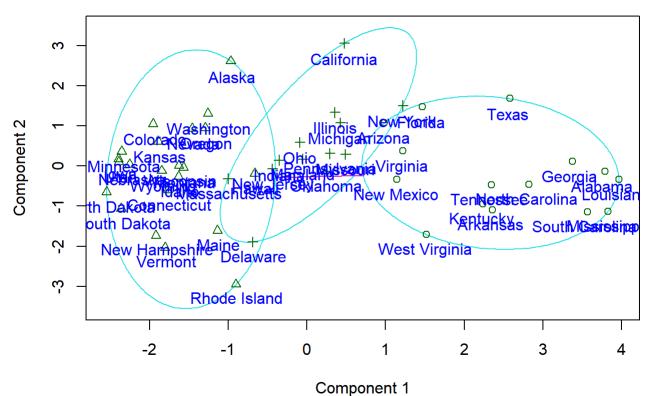
PAM



Visualizacion con Componentes Principales

```
clusplot(X.s,cl.pam)
text(princomp(X.s)$scores[,1:2],
    labels=rownames(X.s),pos=1, col="blue")
```

CLUSPLOT(X.s)



These two components explain 62.5 % of the point variability.

Silhouette

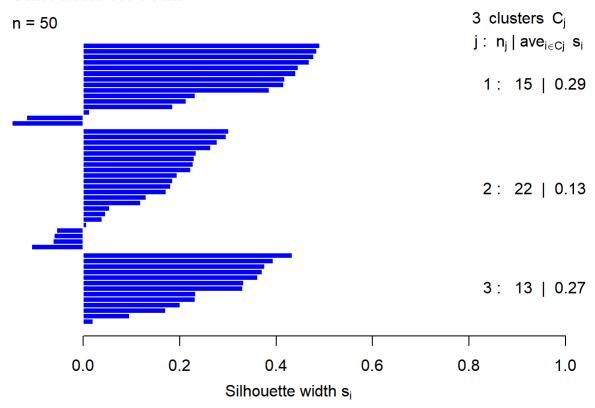
Representacion grafica de la eficacia de clasificacion de una observacion dentro de un grupo.

1.- Generacion de los calculos

```
dist.Euc<-dist(X.s, method = "euclidean")
Sil.pam<-silhouette(cl.pam, dist.Euc)</pre>
```

2.- Generacion del grafico

Silhouette for PAM



Average silhouette width: 0.22