

# Cluster Analysis

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**\*\*The objective of this script is to perform a cluster analysis to obtain homogenous groups as a function of biophysical and socioeconomical variables. The script provides the code to graph the results as well as to calculate and graph Gowers residuals/El objetivo de este ejercicio es clasificar las AGEBS en función de variables biofísicas y socio-económicas. Obtener gráficas de agrupamientos, calcular los residuales de Gower y graficarlos.**

## Cluster Analysis/Análisis de grupos

Load libraries

```
library(cluster)
library(ggplot2)
library(scales)
library(reshape2)
library(ggrepel)
```

Load Data/cargar datos

```
Agebs<-
read.csv("C:\\\\Users\\\\Usuario\\\\Documents\\\\ClustersAGEB\\\\matriz.agebs.csv",
header=TRUE, sep=",")

#es necesario pasar datos de factor a numerico
Agebs$POBTOT <- as.numeric(Agebs$POBTOT)
Agebs$OCUP_VIV <- as.numeric(Agebs$OCUP_VIV)
Agebs$precip <- as.numeric(Agebs$precip)
#es necesario reescalar las variables para comparación
Agebs.stand <- scale(Agebs[-1])
Agebs.stand <- na.omit(Agebs.stand)
```

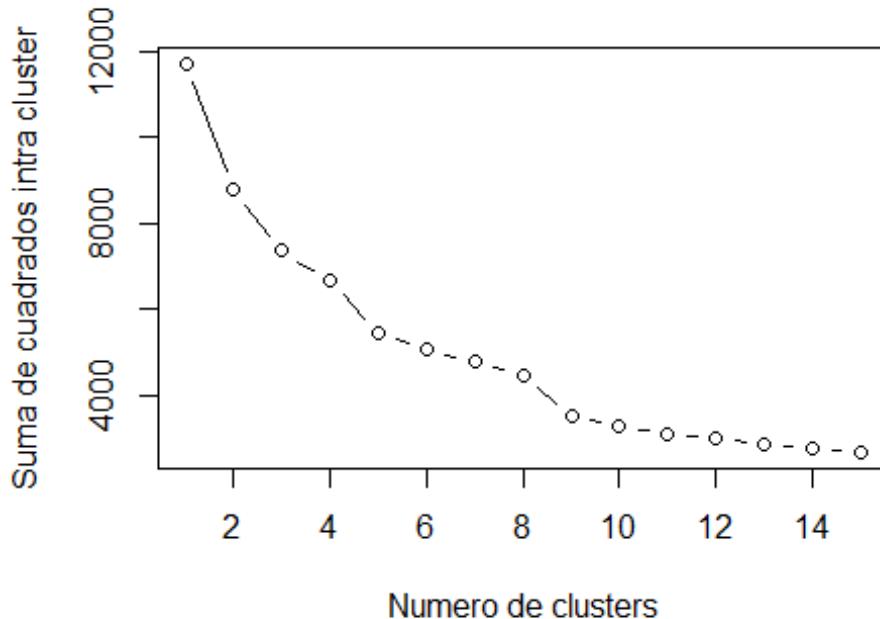
Utilizar el método K-means para generar grupos homogéneos. Se requiere especificar el número de grupos a crear utilizando la suma de cuadrados intra cluster.

```
wssplot <- function(data, nc=15, seed=1234){
  wss <- (nrow(data)-1)*sum(apply(data,2,var))
  for (i in 2:nc){
    set.seed(seed)
    wss[i] <- sum(kmeans(data, centers=i)$withinss)}
```

```
plot(1:nc, wss, type="b", xlab="Numero de clusters",
     ylab="Suma de cuadrados intra cluster")}
```

Graficar numero de clusters en funcion de la suma de cuadrados intracluster

```
wssplot(Agebs.stand, nc=15)
```



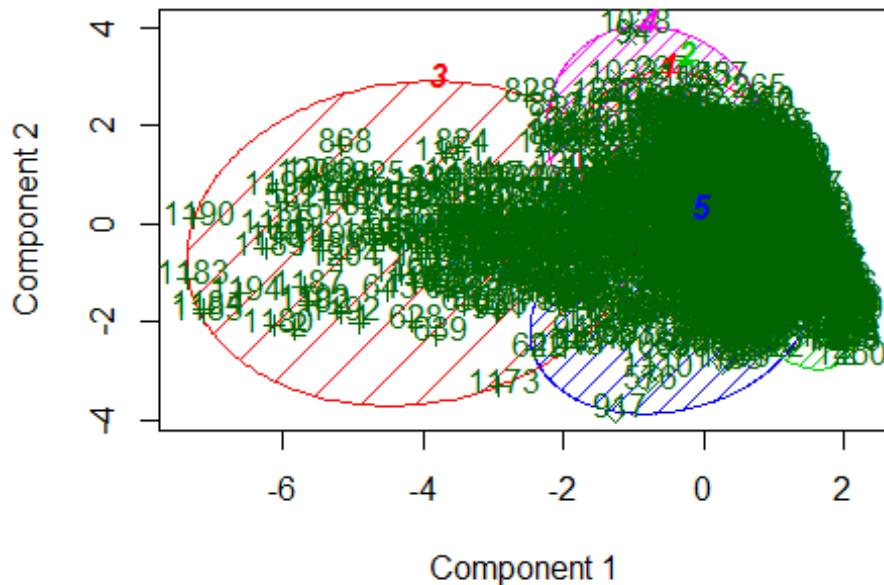
Crear grupos

```
k.means.fit5 <- kmeans(na.omit(Agebs.stand), 5)
```

Graficar grupos

```
clusplot(Agebs.stand, k.means.fit5$cluster, main='Representacion 2D de la
solucion de clusters',
          color=TRUE, shade=TRUE,
          labels=2, lines=0)
```

## Representación 2D de la solución de clusters



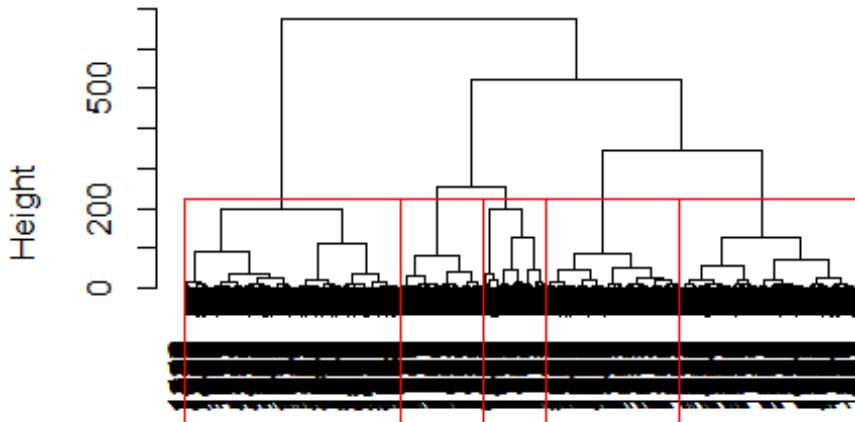
These two components explain 53 % of the point variability

```

d <- dist(Agebs.stand, method = "euclidean") # matriz de distancia
fit <- hclust(d, method="ward.D")
plot(fit) # dendograma
groups <- cutree(fit, k=5) # crear los grupos
# graficar dendograma con bordes rojos para delimitar los grupos
rect.hclust(fit, k=5, border="red")

```

## Cluster Dendrogram



```
d  
hclust (*, "ward.D")
```

Gowers residulas/ Residuales de Gower

```
residuales_ageb5 <- read.csv(header=T, text='  
Atributo,Grupo,Tipo,Valor  
Urbano,1,Promedio,0.9786149163  
Urbano,2,Promedio,0.1145258621  
Urbano,3,Promedio,0.9669020501  
Urbano,4,Promedio,0.8229090909  
Urbano,5,Promedio,0.9943092105  
Precip,1,Promedio,0.2581278539  
Precip,2,Promedio,0.3881465517  
Precip,3,Promedio,0.1746241458  
Precip,4,Promedio,0.2436363636  
Precip,5,Promedio,0.2875657895  
Elev,1,Promedio,0.1246270928  
Elev,2,Promedio,0.3107758621  
Elev,3,Promedio,0.0219134396  
Elev,4,Promedio,0.0638181818  
Elev,5,Promedio,0.0761184211  
Hund,1,Promedio,0.0214003044  
Hund,2,Promedio,0.0289224138  
Hund,3,Promedio,0.9540205011  
Hund,4,Promedio,0.4127272727  
Hund,5,Promedio,0.0195394737  
POBTOT,1,Promedio,0.3008523592  
POBTOT,2,Promedio,0.1743103448  
POBTOT,3,Promedio,0.2138724374
```

POBTOT,4,Promedio,0.0138181818  
POBTOT,5,Promedio,0.1332401316  
V\_S\_AGUA,1,Promedio,0.0247488584  
V\_S\_AGUA,2,Promedio,0.1993965517  
V\_S\_AGUA,3,Promedio,0.009453303  
V\_S\_AGUA,4,Promedio,0.0267272727  
V\_S\_AGUA,5,Promedio,0.0168914474  
OCUP\_VIV,1,Promedio,0.6521613394  
OCUP\_VIV,2,Promedio,0.6825862069  
OCUP\_VIV,3,Promedio,0.5757403189  
OCUP\_VIV,4,Promedio,0.0201818182  
OCUP\_VIV,5,Promedio,0.5513322368  
INGRESO,1,Promedio,0.7036225266  
INGRESO,2,Promedio,0.6021551724  
INGRESO,3,Promedio,0.7737129841  
INGRESO,4,Promedio,0  
INGRESO,5,Promedio,0.8720065789  
Urbano,1,Residual,0.1653941556  
Urbano,2,Residual,-0.6282778629  
Urbano,3,Residual,0.0754207983  
Urbano,4,Residual,0.1922304639  
Urbano,5,Residual,0.1952324451  
Precip,1,Residual,-0.0500608217  
Precip,2,Residual,0.1503749118  
Precip,3,Residual,-0.2118250209  
Precip,4,Residual,0.1179898217  
Precip,5,Residual,-0.0064788909  
Elev,1,Residual,-0.0325920413  
Elev,2,Residual,0.2239737636  
Elev,3,Residual,-0.2135661856  
Elev,4,Residual,0.0891411813  
Elev,5,Residual,-0.0669567179  
Hund,1,Residual,-0.3036902234  
Hund,2,Residual,-0.2257510784  
Hund,3,Residual,0.5506694822  
Hund,4,Residual,0.2701788785  
Hund,5,Residual,-0.291407059  
POBTOT,1,Residual,0.0958651336  
POBTOT,2,Residual,0.0397401549  
POBTOT,3,Residual,-0.0693752794  
POBTOT,4,Residual,-0.0086269102  
POBTOT,5,Residual,-0.0576030989  
V\_S\_AGUA,1,Residual,-0.0684631629  
V\_S\_AGUA,2,Residual,0.1766015661  
V\_S\_AGUA,3,Residual,-0.1620192095  
V\_S\_AGUA,4,Residual,0.1160573851  
V\_S\_AGUA,5,Residual,-0.0621765788  
OCUP\_VIV,1,Residual,0.1179924207  
OCUP\_VIV,2,Residual,0.2188343239  
OCUP\_VIV,3,Residual,-0.0366890909

```

OCUP_VIV,4,Residual,-0.3314449669
OCUP_VIV,5,Residual,0.0313073133
INGRESO,1,Residual,0.0755545395
INGRESO,2,Residual,0.044504221
INGRESO,3,Residual,0.0673845058
INGRESO,4,Residual,-0.4455258534
INGRESO,5,Residual,0.2580825871
')

residuales_ageb5$Grupo <- factor(residuales_ageb5$Grupo)

```

Generate point graphs/Generar una gráfica de puntos

Final graph showing Gowers residuals for 5 groups

```

ggplot(data=residuales_ageb5, aes(x=Grupo, y=Valor, group=Atributo,
color=Atributo)) +
  geom_segment(aes(xend=Grupo),yend=0,colour="grey50",linetype="solid") +
  geom_point(size=3,show.legend=FALSE) +
  geom_text_repel(aes(label = paste(Atributo, sprintf("%.2f",
Valor),sep="\n")), size=3, family="Calibri", show.legend=FALSE)+ 
  geom_hline(aes(yintercept=0), linetype="solid") +
  scale_color_brewer(palette="Dark2") +
  scale_x_discrete(labels=c(
    "1"="Grupo 1",
    "2"="Grupo 2",
    "3"="Grupo 3",
    "4"="Grupo 4",
    "5"="Grupo 5"), expand=c(0.13,0.8)) +
  scale_y_continuous() +
  theme_bw() +
  theme(
    text=element_text(family="Calibri"),
    panel.grid.minor=element_blank(),
    panel.grid.major=element_blank(),
    axis.title.x=element_blank(),
    axis.title.y=element_blank(),
    axis.text.x=element_text(size=11,face="bold", hjust=0.5))

```

Separate mean and residualsSepara promedios de residuales

```

graf + facet_grid(Tipo ~ ., scales="free")

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

```

```
## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

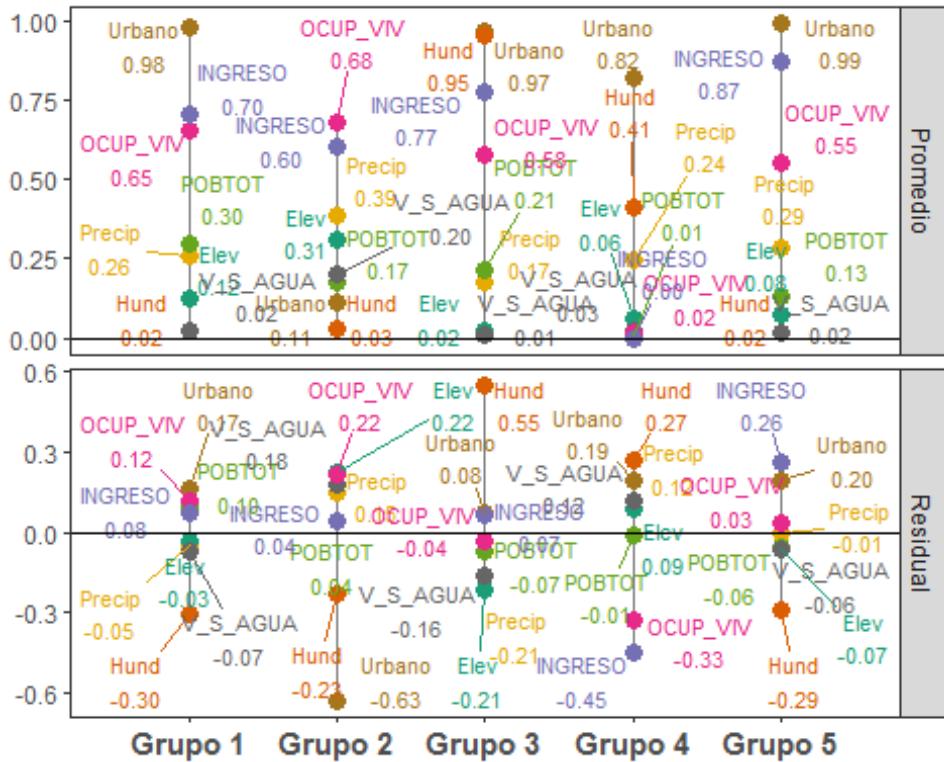
## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x,
x
## $y, : font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x,
x
## $y, : font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database
```



Name each part of the graphs as mean and residual/nombrar cada una de las gráficas

```
tipo_etiquetas <- c("Promedio" = "PROMEDIO",
                     "Residual" = "RESIDUAL")
```

Apply to y axis/Se aplica formato al eje Y

```
graf + facet_grid(Tipo ~ ., scales="free", labeller =
  as_labeller(tipo_etiquetas)) +
  theme(strip.text.y=element_text(size=14, face="bold"))

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
x$y, :
## font family not found in Windows font database
```

```

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call.graphics(L_text, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

## Warning in grid.Call(L_textBounds, as.graphicsAnnot(x$label), x$x,
## y, :
## font family not found in Windows font database

```

