KNN

SERGIO ADRIAN ORTIZ ORTEGA

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```
#K-vecinos proximos

##cargar el paquete y los datos

library(MASS)

Z<-as.data.frame(iris)
```

Definir la matriz de datos y la variable respuesta Con las clasificaciones

```
x<-Z[,1:4]
y<-Z[,5]
```

Se definen las variables y observaciones

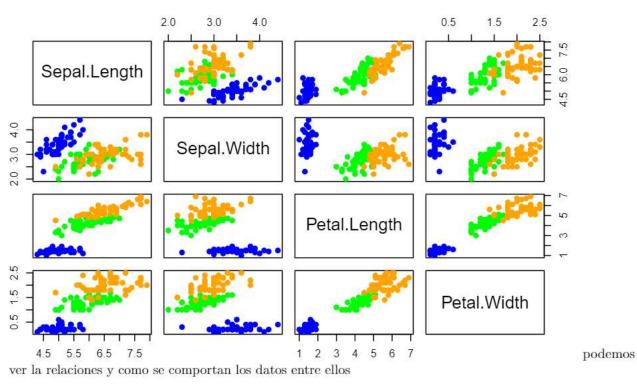
```
n<-nrow(x)
p<-ncol(x)
```

Grafico scatter plot Creacion de un vector de colores

```
col.iris<-c("blue", "green", "orange")[y]
col.iris
##
                 "blue"
                          "blue"
                                                    "blue"
     [1] "blue"
                                   "blue"
                                            "blue"
                                                             "blue"
                                                                      "blue"
     [9] "blue"
                 "blue"
                          "blue"
                                   "blue"
                                            "blue"
                                                    "blue"
##
                                                             "blue"
                                                                      "blue"
                "blue"
                         "blue"
                                   "blue"
## [17] "blue"
                                            "blue"
                                                    "blue"
                                                             "blue"
                                                                      "blue"
## [25] "blue"
                "blue"
                          "blue"
                                   "blue"
                                            "blue"
                                                    "blue"
                                                             "blue"
                                                                      "blue"
                "blue"
## [33] "blue"
                          "blue"
                                   "blue"
                                           "blue"
                                                    "blue"
                                                             "blue"
                                                                      "blue"
                 "blue"
## [41] "blue"
                          "blue"
                                   "blue"
                                            "blue"
                                                    "blue"
                                                                      "blue"
                                                             "blue"
                "blue"
                          "green" "green"
                                                                     "green"
## [49] "blue"
                                            "green"
                                                    "green" "green"
## [57] "green" "green"
                         "green"
                                   "green"
                                            "green"
                                                    "green"
                                                             "green"
                                                                      "green"
## [65] "green" "green"
                         "green"
                                  "green"
                                            "green"
                                                    "green"
                                                             "green"
                                                                      "green"
## [73] "green" "green" "green"
                                  "green"
                                           "green"
                                                    "green"
                                                             "green"
                                                                      "green"
## [81] "green" "green"
                         "green"
                                   "green"
                                            "green"
                                                    "green"
                                                             "green"
                                                                      "green"
## [89] "green"
                 "green"
                          "green"
                                   "green"
                                            "green"
                                                    "green"
                                                             "green"
                                                                      "green"
## [97] "green"
                         "green"
                                   "green"
                                            "orange" "orange" "orange" "orange"
                 "green"
## [105] "orange" "orange" "orange" "orange" "orange" "orange" "orange" "orange"
## [113] "orange" "orange" "orange" "orange" "orange" "orange" "orange" "orange"
## [121] "orange" "orange" "orange" "orange" "orange" "orange" "orange" "orange"
## [129] "orange" "orange" "orange" "orange" "orange" "orange" "orange" "orange"
## [137] "orange" "orange" "orange" "orange" "orange" "orange" "orange" "orange"
## [145] "orange" "orange" "orange" "orange" "orange" "orange"
```



Data set Iris



#kNN ##cargar libreria

library(class)

Se fija una "semilla" para tener valores iguales

```
set.seed(1000)
```

##creacion de los ciclos para k=1 hasta k=20 Selecciona el valor de k
 que tenga el error mas bajo. Inicializaci \tilde{A}^3 n de una lista vacia de tamaño 20

```
knn.class<-vector(mode="list",length=20)
knn.tables<-vector(mode="list", length=20)</pre>
```

Clasificaciones erroneas

```
knn.mis<-matrix(NA, nrow=20, ncol=1)
for(k in 1:20){
   knn.class[[k]]<-knn.cv(x,y,k=k)
   knn.tables[[k]]<-table(y,knn.class[[k]])
   # la suma de las clasificaciones menos las correctas
   knn.mis[k]<- n-sum(y==knn.class[[k]])
}
knn.mis</pre>
```

```
## [,1]
## [1,] 6
```

```
[2,]
            7
##
    [3,]
##
            6
   [4,]
            6
##
   [5,]
            5
##
   [6,]
            4
## [7,]
            5
## [8,]
            5
## [9,]
            4
## [10,]
            5
## [11,]
            4
## [12,]
            6
## [13,]
            5
## [14,]
            3
## [15,]
## [16,]
            5
## [17,]
            4
## [18,]
            3
            3
## [19,]
## [20,]
            4
```

Numero optimo de k-vecinos

```
which(knn.mis==min(knn.mis))
## [1] 14 18 19
knn.tables[[10]]
##
                 setosa versicolor virginica
## y
                     50
##
     setosa
                                  0
                                             0
##
                      0
                                 47
                                             3
     versicolor
                      0
                                  2
##
     virginica
                                            48
knn.tables[[18]]
##
## y
                 setosa versicolor virginica
##
                     50
                                  0
                                             0
     setosa
##
                      0
                                 48
                                             2
     versicolor
##
                      0
                                  1
                                            49
     virginica
```

el mas eficiente es k=10 se señala el k mas eficiente

```
k.opt<-10
knn.cv.opt<-knn.class[[k.opt]]
knn.cv.opt
##
     [1] setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
                                                                   setosa
##
     [7] setosa
                                                                   setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
##
    [13] setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
                                                                   setosa
##
    [19] setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
                                                                   setosa
##
    [25] setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
                                                                   setosa
##
    [31] setosa
                                                                   setosa
                     setosa
                                setosa
                                            setosa
                                                        setosa
##
   [37] setosa
                     setosa
                                                                   setosa
                                setosa
                                            setosa
                                                        setosa
    [43] setosa
                                            setosa
                                                                   setosa
                     setosa
                                setosa
                                                        setosa
```

```
versicolor versicolor versicolor versicolor
   [49] setosa
                  setosa
## [55] versicolor versicolor versicolor versicolor versicolor
## [61] versicolor versicolor versicolor versicolor versicolor
## [67] versicolor versicolor versicolor virginica versicolor
## [73] versicolor versicolor versicolor versicolor versicolor virginica
## [79] versicolor versicolor versicolor versicolor versicolor virginica
## [85] versicolor versicolor versicolor versicolor versicolor
## [91] versicolor versicolor versicolor versicolor versicolor
## [97] versicolor versicolor versicolor versicolor virginica virginica
## [103] virginica virginica virginica versicolor virginica
## [109] virginica virginica virginica virginica virginica virginica
## [115] virginica virginica virginica virginica virginica virginica
## [121] virginica virginica virginica virginica virginica virginica
## [127] virginica virginica virginica virginica virginica virginica
## [133] virginica virginica virginica virginica virginica virginica
## [139] versicolor virginica virginica virginica virginica virginica
## [145] virginica virginica virginica virginica virginica virginica
## Levels: setosa versicolor virginica
```

##tabla de contingencia con las clasificaciones buenas y malas

```
knn.tables[[k.opt]]
```

```
##
                 setosa versicolor virginica
## y
                     50
##
     setosa
                                 0
##
     versicolor
                      0
                                47
                                            3
                      0
                                  2
                                           48
##
     virginica
```

cantidad de observaciones mal clasificadas

```
knn.mis[k.opt]
```

[1] 5

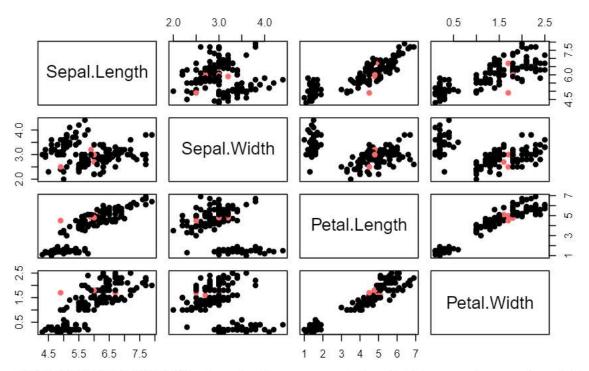
Error de clasificación (MR)

```
knn.mis[k.opt]/n
```

[1] 0.03333333

Grafico de clasificaciones correctas y erroneas

Clasificacion kNN de Iris



#EJEMPLO DE PINGUINOS se hara lo mismo pero con la base de datos penguins y con la variable "especie"

```
library(MASS)
library(readxl)
penguins <- read_excel("penguins.xlsx")
Z<-data.frame(penguins)</pre>
```

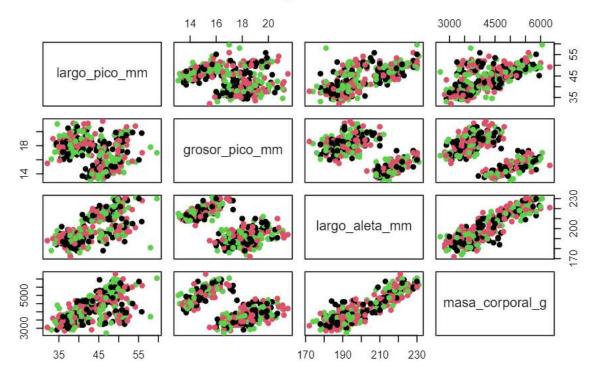
Definir la matriz de datos y la variable respuesta Con las clasificaciones

```
x<-Z[,2:5]
y<-Z[,1]
```

Se definen las variables y observaciones

```
n<-nrow(x)
p<-ncol(x)
pairs(x, main="Pinguinos", pch=19,col=1:3)</pre>
```

Pinguinos



kNN

cargamos la libreria

```
library(class)
```

##Se fija una "semilla" para tener valores iguales

```
set.seed(1001)
```

##creacion de los ciclos para k=1 hasta k=20 Selecciona el valor de k
 que tenga el error mas bajo. Inicializaci \tilde{A}^3 n de una lista vacia de tamaño 20

```
knn.class<-vector(mode="list",length=20)
knn.tables<-vector(mode="list", length=20)</pre>
```

##Clasificaciones erroneas

```
knn.mis<-matrix(NA, nrow=20, ncol=1)
for(k in 1:20){
  knn.class[[k]]<-knn.cv(x,y,k=k)
  knn.tables[[k]]<-table(y,knn.class[[k]])
  # la suma de las clasificaciones menos las correctas
  knn.mis[k]<- n-sum(y==knn.class[[k]])
}
knn.mis</pre>
```

```
## [,1]
## [1,] 44
## [2,] 67
## [3,] 70
## [4,] 71
```

```
[6,]
##
           77
    [7,]
           78
##
   [8,]
           77
##
   [9,]
           75
## [10,]
           74
## [11,]
           71
## [12,]
           72
## [13,]
           74
## [14,]
           74
## [15,]
           80
## [16,]
           85
## [17,]
           88
## [18,]
           88
## [19,]
           83
## [20,]
Numero optimo de k-vecinos
which(knn.mis==min(knn.mis))
## [1] 1
knn.tables[[10]]
##
## y
               Adelie Chinstrap Gentoo
##
     Adelie
                   136
                               5
                                      11
##
     Chinstrap
                    46
                              18
                                       4
##
     Gentoo
                     7
                               1
                                     116
knn.tables[[18]]
##
## y
               Adelie Chinstrap Gentoo
##
     Adelie
                   136
                               3
                                      13
##
     Chinstrap
                    59
                                       4
                               5
     Gentoo
                     9
                               0
##el mas eficiente es k=10 se señala el k mas eficiente
k.opt < -10
knn.cv.opt <- knn.class [[k.opt]]
knn.cv.opt
##
     [1] Adelie
                    Adelie
                              Chinstrap Adelie
                                                   Adelie
                                                              Chinstrap Adelie
##
     [8] Gentoo
                    Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Adelie
                                                                         Adelie
##
    [15] Gentoo
                    Adelie
                              Adelie
                                         Gentoo
                                                   Adelie
                                                              Adelie
                                                                         Adelie
##
    [22] Adelie
                    Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Adelie
                                                                         Adelie
##
    [29] Adelie
                    Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Adelie
                                                                         Adelie
##
    [36] Adelie
                    Adelie
                              Adelie
                                         Adelie
                                                   Gentoo
                                                              Adelie
                                                                        Adelie
##
   [43] Adelie
                                                              Adelie
                                                                        Adelie
                    Gentoo
                              Adelie
                                         Gentoo
                                                   Adelie
##
    [50] Adelie
                   Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Adelie
                                                                        Adelie
## [57] Adelie
                   Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Gentoo
                                                                        Adelie
##
    [64] Adelie
                   Adelie
                              Adelie
                                         Adelie
                                                   Adelie
                                                              Adelie
                                                                        Adelie
                                                                        Adelie
##
    [71] Adelie
                    Adelie
                              Adelie
                                                   Adelie
                                                              Adelie
                                         Adelie
## [78] Adelie
                    Adelie
                              Adelie
                                         Adelie
                                                   Gentoo
                                                              Adelie
                                                                        Adelie
```

[5,]

71

##

```
[85] Adelie
                                                     Adelie
##
                    Adelie
                               Adelie
                                          Adelie
                                                               Adelie
                                                                          Adelie
##
    [92] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Adelie
                                                                          Adelie
    [99] Adelie
                    Adelie
                               Adelie
                                          Gentoo
                                                     Adelie
                                                               Adelie
                                                                          Adelie
## [106] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Gentoo
                                                               Adelie
                                                                          Gentoo
##
   [113] Adelie
                    Adelie
                               Adelie
                                          Chinstrap Adelie
                                                               Adelie
                                                                          Adelie
##
   [120] Adelie
                    Adelie
                                                               Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                                          Adelie
  [127] Adelie
                    Adelie
                               Adelie
                                          Chinstrap Adelie
                                                               Adelie
                                                                          Adelie
  [134] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Adelie
                                                                          Adelie
   [141] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Chinstrap Adelie
##
   [148] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Adelie
                                                                          Gentoo
## [155] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                               Gentoo
                                                                          Gentoo
                                                     Gentoo
   [162] Gentoo
                                                               Adelie
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                                          Gentoo
   [169] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
   [176] Gentoo
                    Gentoo
                               Gentoo
                                          Chinstrap Gentoo
                                                               Gentoo
                                                                          Gentoo
   [183] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
##
   [190] Gentoo
                    Gentoo
                               Gentoo
                                          Adelie
                                                     Gentoo
                                                               Adelie
                                                                          Gentoo
   [197] Gentoo
                                                               Gentoo
                    Gentoo
                               Adelie
                                          Gentoo
                                                     Gentoo
                                                                          Gentoo
  [204] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Adelie
                                                                          Gentoo
## [211] Gentoo
                    Gentoo
                               Adelie
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
## [218] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
## [225] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
## [232] Gentoo
                                                               Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                                          Gentoo
## [239] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
##
   [246] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
  [253] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
  [260] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
  [267] Gentoo
                    Gentoo
                               Gentoo
                                          Gentoo
                                                     Gentoo
                                                               Gentoo
                                                                          Gentoo
## [274] Gentoo
                               Gentoo
                    Gentoo
                                          Adelie
                                                     Adelie
                                                               Chinstrap Adelie
  [281] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Adelie
                                                                          Adelie
   [288] Chinstrap Adelie
                               Chinstrap Adelie
                                                     Chinstrap Adelie
                                                                          Adelie
##
   [295] Adelie
                    Gentoo
                               Adelie
                                          Adelie
                                                     Adelie
                                                               Adelie
                                                                          Adelie
##
   [302] Adelie
                    Adelie
                               Adelie
                                          Adelie
                                                     Gentoo
                                                               Adelie
                                                                          Adelie
## [309] Adelie
                    Chinstrap Adelie
                                          Adelie
                                                     Chinstrap Gentoo
                                                                          Adelie
## [316] Gentoo
                    Adelie
                               Chinstrap Adelie
                                                     Adelie
                                                               Chinstrap Adelie
  [323] Adelie
                    Adelie
                               Chinstrap Chinstrap Adelie
                                                               Adelie
                                                                          Adelie
## [330] Chinstrap Adelie
                               Adelie
                                          Adelie
                                                     Chinstrap Adelie
                                                                          Adelie
## [337] Adelie
                    Chinstrap Chinstrap Adelie
                                                               Chinstrap Chinstrap
## [344] Chinstrap
## Levels: Adelie Chinstrap Gentoo
##tabla de contingencia con las clasificaciones buenas y malas
knn.tables[[k.opt]]
##
## y
                Adelie Chinstrap Gentoo
                   136
##
     Adelie
                                5
                                       11
##
                    46
                               18
     Chinstrap
                                        4
     Gentoo
                                1
                                      116
```

knn.mis[k.opt]

[1] 74

##Error de clasificación (MR)

##cantidad de observaciones mal clasificadas

knn.mis[k.opt]/n

[1] 0.2151163

 $\#\# {\rm Grafico}$ de clasificaciones correctas y erroneas

Clasificacion KNN de pinguinos

