ModelosDeRegresionLineal

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```
library(haven)
library(rpart)
library(stats)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
##
       intersect, setdiff, setequal, union
library(cluster)
library(rpart.plot)
library(fpc)
library(ggplot2)
library(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.2
## --
## v tibble 3.1.8 v purrr 1.0.1
## v tidyr 1.3.0 v stringr 1.5.0
## v readr 2.1.3
                     v forcats 1.0.0
## -- Conflicts -----
                                        ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
#train <- read.csv("train.csv")</pre>
#test <- read.csv("test.csv")</pre>
```

1. Descargue los conjuntos de datos de la plataforma kaggle.

librerías

```
datos = read.csv("./train.csv")
test<- read.csv("./test.csv", stringsAsFactors = FALSE)

#Columnas
house <-select(datos, LotFrontage, LotArea, YearBuilt, YearRemodAdd, MasVnrArea, BsmtFinSF1,BsmtFinSF2,
#Data
house <- na.omit(house)

# Resumen
summary(house)</pre>
```

```
LotFrontage
                      LotArea
                                     YearBuilt
                                                  YearRemodAdd
   Min. : 21.00
##
                   Min. : 1300
                                   Min. :1880
                                                  Min. :1950
   1st Qu.: 60.00
                   1st Qu.: 7590
                                   1st Qu.:1953
                                                  1st Qu.:1966
   Median : 70.00
                   Median: 9416
                                   Median:1974
                                                  Median:1995
   Mean : 70.67
                   Mean : 10123
                                   Mean :1972
                                                 Mean :1986
   3rd Qu.: 80.00
                   3rd Qu.: 11361
                                   3rd Qu.:2003
                                                  3rd Qu.:2005
##
   Max.
         :313.00
                         :215245
                                   Max.
                                         :2010
                                                  Max. :2010
                   Max.
##
     MasVnrArea
                     BsmtFinSF1
                                     BsmtFinSF2
                                                      BsmtUnfSF
##
   Min. :
                   Min. : 0.0
                                              0.00
                                                    Min. : 0.0
             0.0
                                   Min. :
   1st Qu.:
                   1st Qu.: 0.0
                                   1st Qu.:
                                              0.00
                                                    1st Qu.: 250.0
             0.0
##
   Median :
             0.0
                   Median: 374.0
                                   Median:
                                              0.00
                                                    Median : 506.0
   Mean : 108.5
                   Mean : 438.4
                                   Mean : 44.59
                                                    Mean : 594.1
##
                   3rd Qu.: 702.0
   3rd Qu.: 170.0
                                              0.00
                                                     3rd Qu.: 840.0
                                   3rd Qu.:
##
   Max. :1600.0
                   Max.
                        :5644.0
                                   Max.
                                         :1474.00
                                                    Max.
                                                         :2336.0
    TotalBsmtSF
                                 X2ndFlrSF
##
                   X1stFlrSF
                                                LowQualFinSF
   Min. : 0
                 Min. : 438
                                Min. :
                                          0.0
                                                Min.
                                                      : 0.000
##
   1st Qu.: 803
                  1st Qu.: 894
                                1st Qu.:
                                          0.0
                                                1st Qu.: 0.000
##
   Median:1008
                 Median:1097
                                Median:
                                          0.0
                                                Median : 0.000
##
   Mean :1077
                 Mean :1174
                                Mean : 353.3
                                                Mean
                                                     : 4.568
   3rd Qu.:1324
                 3rd Qu.:1411
                                3rd Qu.: 728.0
                                                3rd Qu.: 0.000
##
   Max.
         :6110
                 Max. :4692
                                Max. :2065.0
                                                Max. :572.000
##
     GrLivArea
                  TotRmsAbvGrd
                                   Fireplaces
                                                  GarageYrBlt
                 Min. : 3.000
##
   Min. : 438
                                 Min. :0.0000
                                                  Min. :1900
   1st Qu.:1155
                  1st Qu.: 5.000
                                  1st Qu.:0.0000
                                                 1st Qu.:1959
##
   Median:1479
                 Median : 6.000
                                 Median :1.0000
                                                  Median:1981
##
   Mean :1531
                 Mean : 6.576
                                 Mean :0.6039
                                                  Mean :1978
   3rd Qu.:1776
                  3rd Qu.: 7.000
                                  3rd Qu.:1.0000
                                                  3rd Qu.:2003
                 Max. :12.000
                                       :3.0000
                                                  Max. :2010
##
  Max.
          :5642
                                 Max.
##
     GarageCars
                    GarageArea
                                  WoodDeckSF
                                                  OpenPorchSF
##
         :1.000
                  Min. : 160
                                Min. : 0.00
                                                 Min. : 0.00
   1st Qu.:1.000
                  1st Qu.: 360
                                1st Qu.: 0.00
                                                 1st Qu.: 0.00
                                Median: 0.00
                                                 Median : 27.00
##
   Median :2.000
                  Median: 484
   Mean :1.879
##
                  Mean : 503
                                Mean : 92.61
                                                 Mean : 46.13
##
   3rd Qu.:2.000
                  3rd Qu.: 600
                                 3rd Qu.:168.00
                                                 3rd Qu.: 68.00
## Max.
          :4.000
                  Max.
                        :1418
                                Max.
                                       :857.00
                                                 Max. :547.00
##
  EnclosedPorch
                    ScreenPorch
                                     PoolArea
                                                       MoSold
## Min. : 0.00
                   Min. : 0.0
                                  Min. : 0.000
                                                   Min. : 1.00
  1st Qu.: 0.00
                   1st Qu.: 0.0
                                   1st Qu.: 0.000
                                                   1st Qu.: 5.00
## Median: 0.00
                                  Median : 0.000
                                                   Median: 6.00
                   Median: 0.0
                                   Mean : 2.935
## Mean : 21.84
                   Mean : 16.1
                                                   Mean : 6.34
                                                   3rd Qu.: 8.00
## 3rd Qu.: 0.00
                   3rd Qu.: 0.0
                                   3rd Qu.: 0.000
```

```
##
    Max.
           :552.00
                      Max.
                              :480.0
                                       Max.
                                               :648.000
                                                          Max.
                                                                  :12.00
##
        YrSold
                      SalePrice
##
   \mathtt{Min}.
           :2006
                    Min.
                            : 35311
    1st Qu.:2007
                    1st Qu.:131000
##
##
    Median:2008
                    Median :164900
   Mean
            :2008
                    Mean
                            :185506
##
    3rd Qu.:2009
                    3rd Qu.:219500
##
            :2010
## Max.
                    Max.
                            :755000
```

2. Haga un análisis exploratorio extenso de los datos. Explique bien todos los hallazgos. No ponga solo gráficas y código. Debe llegar a conclusiones interesantes para poder predecir. Explique el preprocesamiento que necesitó hacer.

Analisis exploratorio

—Exploración rápida de datos— train

#summary(train)

test

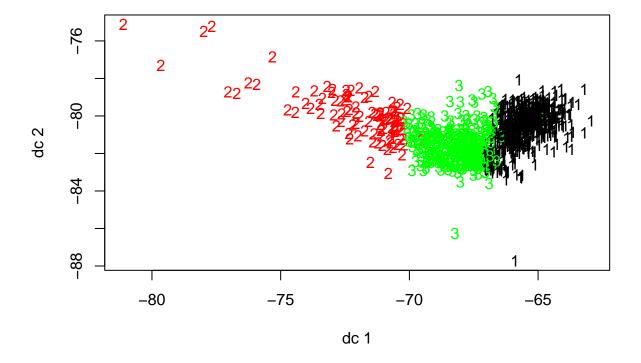
#summary(test)

```
##
      NombreDeLaVariables Cualitativa Cuantitativa
## 1
                 SalePrice
                                                    Х
               MSSubClass
## 2
                                                    x
## 3
                  MSZoning
## 4
              LotFrontage
                                                    х
## 5
                   LotArea
                                                    x
## 6
                    Street
                                      х
## 7
                     Alley
                                      х
## 8
                 LotShape
                                      х
## 9
              LandContour
                                      х
## 10
                 Utilities
                                      Х
                 LotConfig
## 11
                                      х
## 12
                 LandSlope
                                      Х
             Neighborhood
## 13
                                      x
               Condition1
## 14
                                      х
## 15
               Condition2
                                      х
## 16
                  BldgType
                                      х
## 17
               HouseStyle
                                      х
## 18
               OverallQual
                                                    X
## 19
               OverallCond
                                                    x
## 20
                 YearBuilt
                                                    х
## 21
                 YearBuilt
                                                    X
## 22
                 RoofStyle
                                      Х
```

## 23 ## 24 ## 25	RoofMatl Exterior1st	x	
	Exterier1at		
## 25	EXCELIOLISC	X	
## ZO	Exterior2nd	x	
## 26	MasVnrType	x	
## 27	MasVnrArea		х
## 28	ExterQual	x	
## 29	ExterCond	x	
## 30	Foundation	x	
## 31	${\tt BsmtQual}$	x	
## 32	BsmtCond	x	
## 33	BsmtExposure	x	
## 34	BsmtFinType1	x	
## 35	BsmtFinSF1		х
## 36	BsmtFinType2	x	
## 37	BsmtFinSF2		x
## 38	BsmtUnfSF		x
## 39	TotalBsmtSF		x
## 40	Heating	x	
## 41	HeatingQC	x	
## 42	CentralAir	x	
## 43	Electrical	X	
## 44	1stFlrSF	A	x
## 45	2ndFlrSF		x
## 46	LowQualFinSF		x
	GrLivArea		X
## 17			
## 47 ## 40			
## 48	BsmtFullBath		х
## 48 ## 49	BsmtFullBath BsmtHalfBath	£	x x
## 48 ## 49 ## 50	BsmtFullBath BsmtHalfBath FullBath	f	x x xf
## 48 ## 49 ## 50 ## 51	BsmtFullBath BsmtHalfBath FullBath HalfBath	f	x x xf x
## 48 ## 49 ## 50 ## 51 ## 52	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom	f	x x xf x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen		x x xf x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen Kitchen	f	x xf x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd	x	x x xf x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional		x xf x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces	x x	x xf x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu	x x x	x xf x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType	x x	x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt	x x x	x xf x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageFinish	x x x	x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars	x x x	x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageArea	x x x	x x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63 ## 64	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceS FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual	x x x	x x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageCond	x x x x	x x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 65	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageQual GarageCond PavedDrive	x x x x	x x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 66 ## 67	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageCond PavedDrive WoodDeckSF	x x x x x	x x xf x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 65 ## 67 ## 68	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageCond PavedDrive WoodDeckSF	x x x x x	x x xf x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 56 ## 57 ## 58 ## 59 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 65 ## 66 ## 67 ## 68	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch	x x x x x	x x xf x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch 3SsnPorch	x x x x x	x x xf x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70 ## 71	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch ScreenPorch	x x x x x	x x xf x x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70 ## 71 ## 72	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch ScreenPorch PoolArea	x x x x x	x x xf x x x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70 ## 71	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch ScreenPorch	x x x x x	x x xf x x x x x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 54 ## 55 ## 56 ## 57 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70 ## 71 ## 72	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch ScreenPorch PoolArea	x x x x x	x x xf x x x x x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 69 ## 70 ## 71 ## 72 ## 73	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch 3SsnPorch ScreenPorch PoolArea PoolQC	x x x x x x	x x xf x x x x x x x x x x x x
## 48 ## 49 ## 50 ## 51 ## 52 ## 53 ## 55 ## 56 ## 57 ## 58 ## 60 ## 61 ## 62 ## 63 ## 64 ## 65 ## 66 ## 67 ## 68 ## 70 ## 71 ## 72 ## 73 ## 74	BsmtFullBath BsmtHalfBath FullBath HalfBath Bedroom Kitchen KitchenQual TotRmsAbvGrd Functional Fireplaces FireplaceQu GarageType GarageYrBlt GarageFinish GarageCars GarageArea GarageQual GarageCond PavedDrive WoodDeckSF OpenPorchSF EnclosedPorch 3SsnPorch ScreenPorch PoolArea PoolQC Fence	x x x x x x x	x x xf x x x x x x x x x x x x

 ${\bf 3.}$ Incluya un análisis de grupos en el análisis exploratorio. Explique las características de los grupos.

```
# con k-medias
cluster <- house
km<-kmeans(house,3)
house$grupo<-km$cluster
plotcluster(cluster,km$cluster) # los cluster</pre>
```



```
#método de la silueta
silkm<-silhouette(km$cluster,dist(house))
mean(silkm[,3]) #Silueta</pre>
```

```
## [1] 0.561677
```

```
g1<- house[house$grupo==1,]
prop.table(table(g1$Species))*100</pre>
```

```
## numeric(0)
```

```
g2<- house[house$grupo==2,]
prop.table(table(g2$Species))*100

## numeric(0)

g3<- house[house$grupo==3,]</pre>
```

numeric(0)

prop.table(table(g3\$Species))*100

summary(g1)

```
LotFrontage
                       LotArea
                                      YearBuilt
                                                    YearRemodAdd
##
##
   Min. : 21.00
                    Min. : 1300
                                          :1880
                                                   Min.
                                                          :1950
                                    Min.
   1st Qu.: 55.00
                    1st Qu.: 7000
                                    1st Qu.:1940
                                                   1st Qu.:1956
                                                   Median:1972
##
   Median : 64.00
                    Median : 8593
                                    Median:1959
                                    Mean :1957
##
   Mean : 65.45
                    Mean : 8680
                                                   Mean
                                                         :1976
##
   3rd Qu.: 75.00
                                    3rd Qu.:1973
                                                   3rd Qu.:1998
                    3rd Qu.:10172
##
   Max.
          :313.00
                    Max.
                          :63887
                                    Max.
                                           :2009
                                                   Max.
                                                         :2009
##
     MasVnrArea
                       BsmtFinSF1
                                        BsmtFinSF2
                                                          BsmtUnfSF
##
   Min.
         :
              0.00
                     Min. :
                                0.0
                                      Min.
                                             :
                                                 0.00
                                                        Min. :
                                                                   0.0
##
   1st Qu.:
              0.00
                     1st Qu.:
                                                 0.00
                                0.0
                                      1st Qu.:
                                                        1st Qu.: 192.0
##
   Median :
              0.00
                     Median : 319.0
                                      Median :
                                                 0.00
                                                        Median: 450.0
##
   Mean : 60.21
                     Mean : 351.2
                                      Mean
                                                51.82
                                                        Mean : 491.1
                                                 0.00
##
                     3rd Qu.: 600.0
                                                        3rd Qu.: 719.0
   3rd Qu.: 66.50
                                      3rd Qu.:
##
   Max.
          :1129.00
                     Max.
                            :5644.0
                                      Max.
                                             :1085.00
                                                        Max.
##
    TotalBsmtSF
                      X1stFlrSF
                                     X2ndFlrSF
                                                     LowQualFinSF
   Min. :
                          : 438
                                              0.0
                                                         : 0.000
##
              0.0
                    Min.
                                   Min.
                                        :
                                                    Min.
##
   1st Qu.: 728.0
                    1st Qu.: 834
                                   1st Qu.:
                                              0.0
                                                    1st Qu.: 0.000
   Median: 894.0
                    Median: 981
                                   Median :
                                              0.0
                                                    Median : 0.000
##
   Mean : 894.1
                          :1020
                                   Mean : 256.5
                                                           : 4.513
                    Mean
                                                    Mean
##
   3rd Qu.:1060.5
                    3rd Qu.:1150
                                   3rd Qu.: 588.0
                                                    3rd Qu.: 0.000
##
   Max.
          :6110.0
                                   Max. :1230.0
                                                    Max.
                                                          :481.000
                    Max.
                           :4692
     GrLivArea
                   TotRmsAbvGrd
                                  Fireplaces
                                                  GarageYrBlt
                                                                  GarageCars
                  Min. : 3
                                      :0.0000
##
   Min. : 438
                                Min.
                                                 Min. :1900
                                                               Min.
                                                                      :1.000
##
   1st Qu.:1032
                  1st Qu.: 5
                                1st Qu.:0.0000
                                                 1st Qu.:1953
                                                               1st Qu.:1.000
##
   Median:1224
                  Median: 6
                                Median :0.0000
                                                 Median:1966
                                                               Median :2.000
   Mean
         :1281
                  Mean
                        : 6
                                Mean
                                       :0.4137
                                                 Mean :1967
                                                               Mean
                                                                       :1.568
   3rd Qu.:1484
                  3rd Qu.: 7
##
                                3rd Qu.:1.0000
                                                 3rd Qu.:1983
                                                                3rd Qu.:2.000
                                Max.
                                       :3.0000
                                                        :2009
##
   Max.
          :5642
                        :12
                                                                       :4.000
                  Max.
                                                 Max.
                                                                Max.
##
     GarageArea
                      WoodDeckSF
                                      OpenPorchSF
                                                      EnclosedPorch
   Min. : 160.0
##
                    Min. : 0.00
                                     Min.
                                           : 0.00
                                                      Min. : 0.00
##
   1st Qu.: 288.0
                    1st Qu.:
                              0.00
                                     1st Qu.: 0.00
                                                      1st Qu.:
                                                               0.00
##
   Median : 416.0
                    Median: 0.00
                                     Median: 0.00
                                                      Median: 0.00
   Mean
         : 417.4
                    Mean : 63.95
                                     Mean : 26.44
                                                            : 30.07
                                                      Mean
##
   3rd Qu.: 506.0
                    3rd Qu.:106.00
                                     3rd Qu.: 35.00
                                                      3rd Qu.: 0.00
##
   Max.
          :1418.0
                    Max.
                           :736.00
                                     Max.
                                            :418.00
                                                      Max.
                                                             :330.00
##
    ScreenPorch
                       PoolArea
                                          MoSold
                                                           YrSold
                    Min. : 0.000
                                      Min. : 1.000
                                                              :2006
  Min. : 0.00
                                                       Min.
   1st Qu.: 0.00
                    1st Qu.: 0.000
                                      1st Qu.: 4.000
                                                       1st Qu.:2007
```

```
Median: 0.00
                   Median : 0.000
                                    Median : 6.000
                                                     Median:2008
##
   Mean : 13.26
                                    Mean : 6.157
                   Mean : 1.612
                                                     Mean :2008
   3rd Qu.: 0.00
                   3rd Qu.: 0.000
                                    3rd Qu.: 7.000
                                                     3rd Qu.:2009
  Max. :385.00
                                    Max. :12.000
##
                   Max. :576.000
                                                    Max. :2010
##
     SalePrice
                       grupo
##
  Min. : 35311
                   Min. :1
   1st Qu.:118450
                   1st Qu.:1
                   Median:1
   Median :135000
##
   Mean :134136
                   Mean :1
##
   3rd Qu.:154400
                   3rd Qu.:1
   Max. :178000
                   Max. :1
```

summary(g2)

```
LotFrontage
                       LotArea
                                      YearBuilt
                                                   YearRemodAdd
   Min. : 32.00
                    Min. : 5119
                                    Min. :1892
                                                  Min. :1965
##
   1st Qu.: 76.00
                    1st Qu.: 11003
                                    1st Qu.:1998
                                                  1st Qu.:2000
                    Median : 12444
##
   Median: 86.00
                                    Median:2005
                                                  Median:2006
   Mean : 87.82
                    Mean : 16048
                                    Mean :1999
                                                  Mean :2003
   3rd Qu.: 99.00
                    3rd Qu.: 14601
##
                                    3rd Qu.:2007
                                                  3rd Qu.:2007
   Max. :174.00
                    Max. :215245
                                    Max. :2010
                                                  Max. :2010
##
                                                      {\tt BsmtUnfSF}
##
     MasVnrArea
                     BsmtFinSF1
                                      BsmtFinSF2
   Min. : 0.0
                    Min. : 0.0
                                    Min. :
                                              0.0
                                                    Min. :
   1st Qu.: 160.0
                    1st Qu.: 240.0
                                                    1st Qu.: 294.0
##
                                    1st Qu.:
                                               0.0
   Median : 302.0
                    Median :1163.0
                                                    Median: 528.0
                                    Median :
                                               0.0
##
   Mean : 345.6
                    Mean : 939.3
                                    Mean :
                                             28.7
                                                    Mean : 705.9
   3rd Qu.: 466.0
                    3rd Qu.:1406.0
                                    3rd Qu.:
                                               0.0
                                                    3rd Qu.:1117.0
##
   Max. :1378.0
                    Max. :2188.0
                                    Max. :1474.0
                                                    Max.
                                                          :2336.0
##
    TotalBsmtSF
                    X1stFlrSF
                                  X2ndFlrSF
                                                 LowQualFinSF
   Min. : 853
                  Min. :1026
                                Min. : 0.0
                                                 Min. : 0.000
                                1st Qu.: 0.0
##
   1st Qu.:1410
                  1st Qu.:1470
                                                 1st Qu.: 0.000
   Median:1702
                  Median:1718
                                Median : 568.0
                                                Median: 0.000
   Mean :1674
                                                Mean : 5.448
##
                  Mean :1699
                                Mean : 593.6
   3rd Qu.:1926
                  3rd Qu.:1940
                                3rd Qu.:1177.0
                                                3rd Qu.: 0.000
                                                Max. :572.000
##
   Max.
          :3094
                  Max. :2444
                                Max. :2065.0
##
     GrLivArea
                  TotRmsAbvGrd
                                    Fireplaces
                                                GarageYrBlt
                                                                GarageCars
##
                  Min. : 5.000
                                  Min. :0.0
                                               Min. :1932
   Min.
         :1419
                                                              Min.
                                                                   :2.000
                                  1st Qu.:1.0
                                               1st Qu.:1998
   1st Qu.:1869
                  1st Qu.: 7.000
                                                              1st Qu.:3.000
##
   Median:2224
                  Median : 8.000
                                  Median :1.0
                                               Median :2005
                                                              Median :3.000
                  Mean : 8.457
##
   Mean :2298
                                  Mean :1.2
                                               Mean :2001
                                                              Mean :2.781
                  3rd Qu.:10.000
                                  3rd Qu.:1.0
##
   3rd Qu.:2610
                                               3rd Qu.:2007
                                                              3rd Qu.:3.000
   Max. :4476
                  Max. :12.000
                                  Max. :3.0
                                               Max. :2010
                                                              Max. :3.000
##
     {\tt GarageArea}
                      WoodDeckSF
                                  OpenPorchSF
                                                 EnclosedPorch
##
   Min. : 380.0
                    Min.
                         : 0
                                 Min. : 0.00
                                                 Min. : 0.000
##
   1st Qu.: 672.0
                    1st Qu.:113
                                 1st Qu.: 45.00
                                                  1st Qu.: 0.000
   Median : 774.0
                    Median:186
                                 Median : 72.00
                                                 Median : 0.000
##
   Mean : 762.2
                    Mean :192
                                 Mean : 88.22
                                                 Mean : 5.876
   3rd Qu.: 842.0
                    3rd Qu.:250
                                 3rd Qu.:111.00
                                                 3rd Qu.: 0.000
##
##
   Max. :1220.0
                    Max. :857
                                 Max. :502.00
                                                 Max. :216.000
    ScreenPorch
##
                     PoolArea
                                        MoSold
                                                        YrSold
##
   Min. : 0.0
                   Min. : 0.000
                                    Min. : 1.000
                                                    Min.
                                                           :2006
##
   1st Qu.: 0.0
                   1st Qu.: 0.000
                                    1st Qu.: 5.000
                                                    1st Qu.:2007
   Median: 0.0
                   Median : 0.000
                                    Median : 7.000
                                                    Median:2008
                   Mean : 5.286
##
  Mean : 22.3
                                    Mean : 6.743
                                                    Mean :2008
```

```
3rd Qu.: 0.0
                   3rd Qu.: 0.000
                                     3rd Qu.: 9.000
                                                      3rd Qu.:2009
##
   Max. :410.0
                   Max. :555.000
                                     Max. :12.000
                                                      Max. :2010
                        grupo
##
     SalePrice
##
          :301000
   Min.
                    Min.
                          :2
##
   1st Qu.:320000
                    1st Qu.:2
   Median :348000
##
                    Median:2
   Mean :377265
                    Mean :2
##
   3rd Qu.:395000
                    3rd Qu.:2
   Max.
         :755000
                    Max.
summary(g3)
```

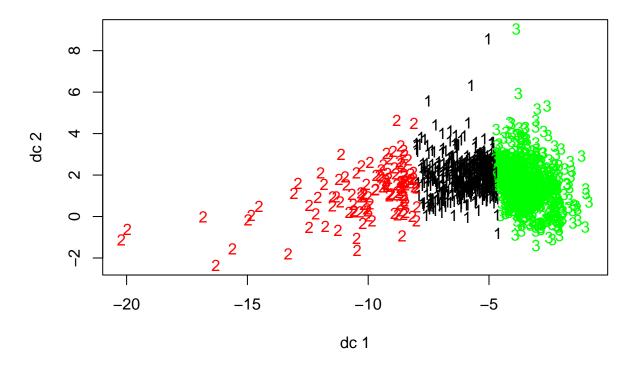
```
LotFrontage
                       LotArea
                                     YearBuilt
                                                   YearRemodAdd
          : 24.00
                          : 2280
##
   Min.
                    Min.
                                   Min.
                                         :1880
                                                  Min.
                                                        :1950
   1st Qu.: 63.00
                    1st Qu.: 8737
                                   1st Qu.:1990
                                                  1st Qu.:1996
   Median : 74.00
                    Median :10206
                                   Median:2002
                                                  Median:2003
   Mean : 75.13
                    Mean :11018
                                   Mean :1991
                                                  Mean :1998
                                                  3rd Qu.:2006
                    3rd Qu.:12011
                                   3rd Qu.:2005
##
   3rd Qu.: 85.00
   Max. :313.00
                    Max. :70761
                                   Max. :2009
                                                  Max. :2010
                      BsmtFinSF1
##
     MasVnrArea
                                    BsmtFinSF2
                                                     BsmtUnfSF
                                  Min. :
                                                   Min. : 0.0
##
   Min. : 0.0
                    Min. :
                              0
                                             0.0
##
   1st Qu.:
              0.0
                    1st Qu.:
                                  1st Qu.:
                                             0.0
                                                   1st Qu.: 314.0
   Median: 40.0
                    Median: 410
                                  Median :
                                             0.0
                                                   Median: 725.0
                                                   Mean : 748.5
   Mean : 127.1
                    Mean : 451
                                  Mean : 36.1
##
                                                   3rd Qu.:1141.0
##
   3rd Qu.: 210.0
                    3rd Qu.: 767
                                  3rd Qu.:
                                             0.0
##
   Max. :1600.0
                          :2260
                                  Max. :1127.0
                    Max.
                                                   Max. :2042.0
##
    TotalBsmtSF
                    X1stFlrSF
                                  X2ndFlrSF
                                                  LowQualFinSF
##
   Min. : 0
                  Min. : 495
                                Min. : 0.0
                                                 Min. : 0.000
##
   1st Qu.: 915
                  1st Qu.:1020
                                           0.0
                                                 1st Qu.: 0.000
                                1st Qu.:
   Median:1240
                  Median:1307
                                Median :
                                           0.0
                                                 Median : 0.000
##
   Mean :1236
                  Mean :1299
                                Mean : 458.9
                                                 Mean : 4.413
   3rd Qu.:1496
                  3rd Qu.:1552
                                3rd Qu.: 872.0
                                                 3rd Qu.: 0.000
##
   Max.
                                Max. :1818.0
##
          :3206
                  Max.
                        :3138
                                                 Max.
                                                      :420.000
##
     GrLivArea
                  TotRmsAbvGrd
                                    Fireplaces
                                                    GarageYrBlt
                                                                   GarageCars
##
                  Min.
                         : 4.000
   Min.
          :1146
                                  Min.
                                        :0.0000
                                                   Min. :1908
                                                                 Min. :1.00
##
   1st Qu.:1502
                  1st Qu.: 6.000
                                  1st Qu.:0.0000
                                                   1st Qu.:1991
                                                                 1st Qu.:2.00
##
   Median:1684
                  Median : 7.000
                                  Median :1.0000
                                                   Median:2002
                                                                 Median:2.00
                  Mean : 7.075
   Mean :1763
                                  Mean :0.7756
                                                   Mean :1993
                                                                 Mean :2.18
   3rd Qu.:1947
                  3rd Qu.: 8.000
                                  3rd Qu.:1.0000
                                                   3rd Qu.:2005
                                                                 3rd Qu.:2.00
##
##
   Max. :4676
                  Max. :12.000
                                  Max. :3.0000
                                                   Max.
                                                          :2010
                                                                 Max. :4.00
##
     GarageArea
                      WoodDeckSF
                                    OpenPorchSF
                                                    EnclosedPorch
   Min. : 180.0
                    Min. : 0.0
                                   Min. : 0.00
                                                    Min. : 0.00
   1st Qu.: 484.0
                    1st Qu.: 0.0
##
                                   1st Qu.: 30.00
                                                    1st Qu.: 0.00
##
   Median: 552.0
                    Median :120.0
                                   Median: 54.00
                                                    Median: 0.00
   Mean : 582.9
                    Mean :115.7
                                   Mean : 69.62
                                                    Mean : 11.56
   3rd Qu.: 662.0
                    3rd Qu.:192.0
                                   3rd Qu.: 96.00
                                                    3rd Qu.: 0.00
##
##
   Max. :1390.0
                    Max. :635.0
                                   Max. :547.00
                                                    Max. :552.00
##
    ScreenPorch
                       PoolArea
                                         MoSold
                                                          YrSold
   Min. : 0.00
                         : 0.000
                                     Min. : 1.000
                                                      Min.
                                                            :2006
                    Min.
   1st Qu.: 0.00
                    1st Qu.: 0.000
                                     1st Qu.: 5.000
                                                      1st Qu.:2007
##
   Median: 0.00
##
                    Median : 0.000
                                     Median : 6.000
                                                      Median:2008
##
   Mean : 19.45
                    Mean : 4.651
                                     Mean : 6.554
                                                      Mean :2008
   3rd Qu.: 0.00
                    3rd Qu.: 0.000
                                     3rd Qu.: 8.000
                                                      3rd Qu.:2009
  Max. :480.00
                    Max. :648.000
                                     Max. :12.000
                                                     Max. :2010
##
```

```
grupo
##
      SalePrice
          :178900 Min.
## Min.
                           :3
  1st Qu.:193000
                    1st Qu.:3
## Median :216837
                    Median:3
## Mean
          :222938
                    Mean
                    3rd Qu.:3
## 3rd Qu.:248900
## Max.
          :297000
                    Max.
— prueba 1 —
##Similitud en las variables independientes y los precios de venta:
cor(house$YearBuilt, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.5253936
cor(house$YearRemodAdd, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.5212533
cor(house$TotalBsmtSF, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6156122
cor(house$X1stFlrSF, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6079691
cor(house$GrLivArea, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.7051536
cor(house$TotRmsAbvGrd, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.5470674
cor(house$GarageCars, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6470336
cor(house$GarageArea, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6193296
```

```
#Columnas
house <-select(datos,TotalBsmtSF,X1stFlrSF,GrLivArea,GarageCars,GarageArea,SalePrice)

#limpiamos
house <- na.omit(house)

#k-medias
cluster <- house
km<-kmeans(house,3)
house$grupo<-km$cluster
plotcluster(cluster,km$cluster) #graficamos ubicacion de cluster</pre>
```



```
#Silueta
silkm<-silhouette(km$cluster,dist(house))
mean(silkm[,3])

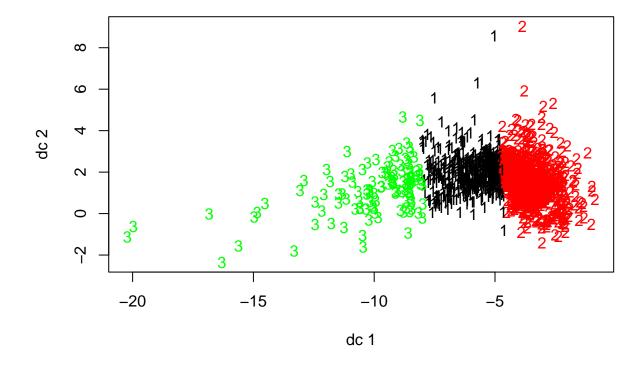
## [1] 0.5612983

— prueba 2 —

cor(house$TotalBsmtSF, house$SalePrice, method = c("pearson", "kendall", "spearman"))</pre>
```

[1] 0.6135806

```
cor(house$X1stFlrSF, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6058522
cor(house$GrLivArea, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.7086245
cor(house$GarageCars, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6404092
cor(house$GarageArea, house$SalePrice, method = c("pearson", "kendall", "spearman"))
## [1] 0.6234314
#Columnas
house <-select(datos, TotalBsmtSF, X1stFlrSF, GrLivArea, GarageCars, GarageArea, SalePrice)
#limpiamos
house <- na.omit(house)</pre>
\#k\text{-medias}
cluster <- house</pre>
km<-kmeans(house,3)
house$grupo<-km$cluster
plotcluster(cluster,km$cluster) #Graficamos clusters
```



```
#silueta
silkm<-silhouette(km$cluster,dist(house))
mean(silkm[,3])</pre>
```

[1] 0.5612983

- 4. Divida el set de datos preprocesados en dos conjuntos: Entrenamiento y prueba. Describa el criterio que usó para crear los conjuntos: número de filas de cada uno, estratificado o no, balanceado o no, etc. Si le proveen un conjunto de datos de prueba y tiene suficientes datos, tómelo como de validación, pero haga sus propios conjuntos de prueba.
- 5. Haga ingeniería de características, ¿qué variables cree que puedan ser mejores predictores para el precio de las casas? Explique en que basó la selección o no de las variables.
- 6. Todos los resultados deben ser reproducible por lo que debe fijar que los conjuntos de entrenamiento y prueba sean los mismos siempre que se ejecute el código.
- 7. Seleccione una de las variables y haga un modelo univariado de regresión lineal para predecir el precio de las casas. Analice el m