Housepriceprediction

Ramana

```
#Loading the dataset
data=read.csv("data.csv")
```

#Summary of dataset summary(data)

```
##
        date
                            price
                                               bedrooms
                                                               bathrooms
                                                                     :0.000
##
    Length:4600
                                        0
                                                    :0.000
                        Min.
                                            Min.
                                                             Min.
    Class : character
                        1st Qu.:
                                  322875
                                            1st Qu.:3.000
                                                             1st Qu.:1.750
##
    Mode :character
                        Median:
                                  460943
                                            Median :3.000
                                                             Median :2.250
##
                        Mean
                                  551963
                                            Mean
                                                    :3.401
                                                             Mean
                                                                     :2.161
##
                        3rd Qu.:
                                  654962
                                            3rd Qu.:4.000
                                                             3rd Qu.:2.500
##
                        Max.
                                :26590000
                                            Max.
                                                    :9.000
                                                             Max.
##
     sqft_living
                        sqft_lot
                                            floors
                                                           waterfront
##
    Min.
         : 370
                                 638
                                               :1.000
                                                                 :0.000000
                     Min.
                                        Min.
                                                         Min.
##
    1st Qu.: 1460
                                5001
                                        1st Qu.:1.000
                                                         1st Qu.:0.000000
                     1st Qu.:
    Median: 1980
                     Median:
                                 7683
                                        Median :1.500
                                                         Median :0.000000
##
    Mean
          : 2139
                     Mean
                               14852
                                        Mean
                                               :1.512
                                                         Mean
                                                                 :0.007174
    3rd Qu.: 2620
                     3rd Qu.:
                               11001
                                        3rd Qu.:2.000
                                                         3rd Qu.:0.000000
##
    Max.
           :13540
                            :1074218
                                        Max.
                                                :3.500
                                                         Max.
                                                                 :1.000000
                     Max.
##
         view
                        condition
                                         sqft_above
                                                       sqft_basement
##
           :0.0000
                                              : 370
    Min.
                      Min.
                             :1.000
                                       Min.
                                                       Min.
                                                             :
##
    1st Qu.:0.0000
                      1st Qu.:3.000
                                       1st Qu.:1190
                                                       1st Qu.:
                                                                   0.0
##
    Median :0.0000
                      Median :3.000
                                       Median:1590
                                                       Median :
                                                                   0.0
##
    Mean
           :0.2407
                      Mean
                             :3.452
                                       Mean
                                             :1827
                                                       Mean
                                                              : 312.1
                      3rd Qu.:4.000
                                       3rd Qu.:2300
##
    3rd Qu.:0.0000
                                                       3rd Qu.: 610.0
##
    Max.
           :4.0000
                      Max.
                             :5.000
                                       Max.
                                              :9410
                                                              :4820.0
                                                       Max.
##
       yr built
                     yr renovated
                                         street
                                                              city
           :1900
##
                          :
    Min.
                    Min.
                               0.0
                                      Length:4600
                                                          Length: 4600
##
    1st Qu.:1951
                    1st Qu.:
                               0.0
                                      Class : character
                                                          Class : character
##
    Median:1976
                    Median :
                               0.0
                                      Mode :character
                                                          Mode :character
    Mean
           :1971
                    Mean
                           : 808.6
    3rd Qu.:1997
                    3rd Qu.:1999.0
##
##
    Max.
           :2014
                           :2014.0
##
      statezip
                          country
    Length:4600
                        Length: 4600
##
    Class :character
                        Class :character
    Mode :character
##
                        Mode : character
##
##
##
```

head(data)

```
##
                            price bedrooms bathrooms sqft_living sqft_lot floors
                    date
## 1 2014-05-02 00:00:00
                           313000
                                         3
                                                 1.50
                                                             1340
                                                                       7912
                                                                               1.5
## 2 2014-05-02 00:00:00 2384000
                                         5
                                                 2.50
                                                             3650
                                                                       9050
                                                                               2.0
                                         3
## 3 2014-05-02 00:00:00 342000
                                                 2.00
                                                             1930
                                                                      11947
                                                                               1.0
## 4 2014-05-02 00:00:00 420000
                                                 2.25
                                         3
                                                             2000
                                                                       8030
                                                                               1.0
## 5 2014-05-02 00:00:00
                          550000
                                          4
                                                 2.50
                                                              1940
                                                                      10500
                                                                               1.0
## 6 2014-05-02 00:00:00 490000
                                         2
                                                 1.00
                                                               880
                                                                       6380
                                                                               1.0
     waterfront view condition sqft_above sqft_basement yr_built yr_renovated
## 1
              0
                    0
                              3
                                      1340
                                                        0
                                                                            2005
                                                               1955
## 2
              0
                    4
                              5
                                      3370
                                                      280
                                                               1921
                                                                               0
                                                                               0
## 3
              0
                   0
                              4
                                      1930
                                                               1966
                                                        0
## 4
              0
                   0
                              4
                                      1000
                                                     1000
                                                               1963
                                                                               0
                                                      800
                                                               1976
## 5
              0
                   0
                              4
                                      1140
                                                                            1992
## 6
              0
                              3
                                       880
                                                        0
                                                               1938
                                                                            1994
##
                        street
                                    city statezip country
## 1
         18810 Densmore Ave N Shoreline WA 98133
                                                       USA
                                 Seattle WA 98119
              709 W Blaine St
## 2
                                                       USA
## 3 26206-26214 143rd Ave SE
                                    Kent WA 98042
                                                       USA
## 4
              857 170th Pl NE Bellevue WA 98008
                                                       USA
## 5
            9105 170th Ave NE
                                Redmond WA 98052
                                                       USA
               522 NE 88th St
## 6
                                 Seattle WA 98115
                                                       USA
```

Data Cleaning

```
sum(is.na(data))
```

[1] 0

#There are no missing values in the dataset taken

colSums(data==0)

```
##
             date
                           price
                                       bedrooms
                                                      bathrooms
                                                                   sqft_living
                                               2
##
                0
                               49
                                                               2
                                                                              0
##
        sqft lot
                          floors
                                     waterfront
                                                           view
                                                                     condition
##
                0
                               0
                                            4567
                                                           4140
                                                                              0
                                       yr_built
##
      sqft_above sqft_basement
                                                  yr_renovated
                                                                         street
##
                0
                            2745
                                                           2735
                                               0
                                                                              0
##
             city
                        statezip
                                         country
##
                0
                                0
                                               0
```

#There are 49 rows with price values as 0 . We need to remove these rows

```
sum(is.na(data))
```

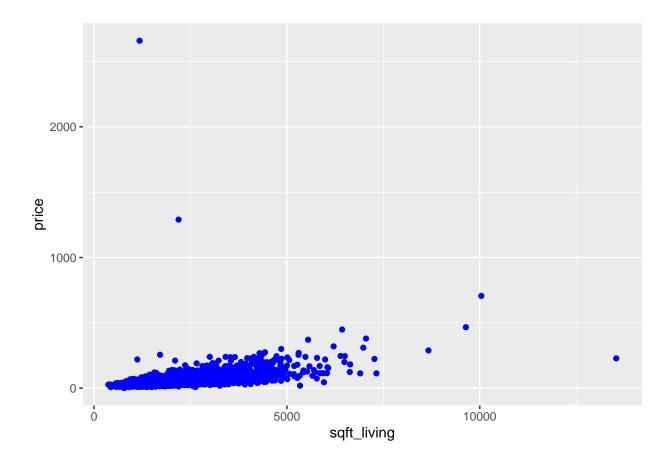
[1] 49

```
#normalizing price values
data$price<-data$price/10000</pre>
```

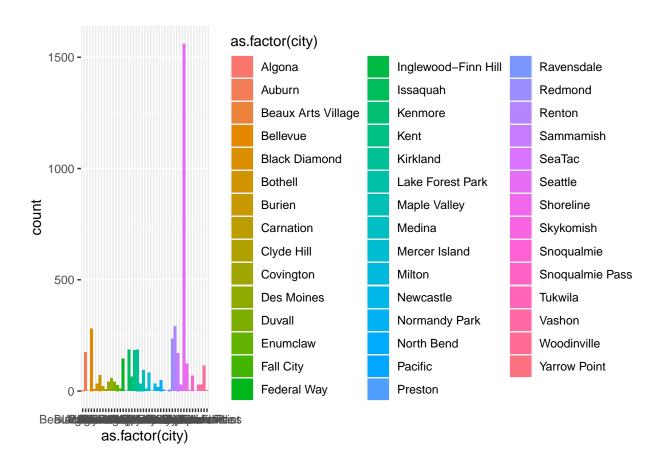
Visualization

library(ggplot2)

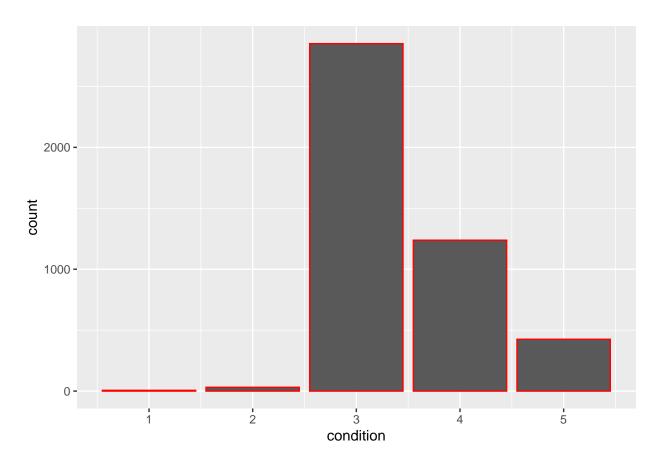
```
ggplot(data,aes(sqft_living,y=price))+
  geom_point(color="blue")
```



ggplot(data,aes(x=as.factor(city),fill=as.factor(city)))+
 geom_bar()



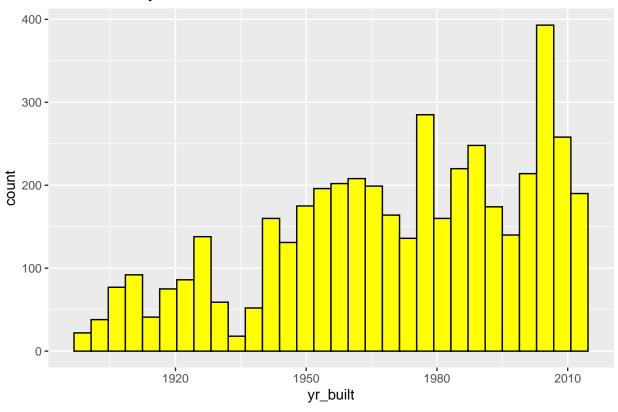
```
ggplot(data,aes(condition))+
geom_bar(color="red")
```



```
ggplot(data, aes(x=yr_built)) +
  geom_histogram(color="black",fill="yellow")+labs(title = "Houses built year wise")
```

'stat_bin()' using 'bins = 30'. Pick better value with 'binwidth'.

Houses built year wise



```
cols <- sapply(data, is.numeric)
numeric_data <- data[,cols]

corr_matrix <- cor(numeric_data)
corr_matrix</pre>
```

```
##
                                 bedrooms
                       price
                                           bathrooms sqft_living
                                                                       sqft_lot
## price
                  1.00000000
                               0.21022759
                                           0.3411259
                                                       0.44549371
                                                                   0.0513473301
## bedrooms
                  0.21022759
                               1.00000000
                                           0.5476115
                                                       0.59605329
                                                                   0.0711375009
## bathrooms
                  0.34112592
                               0.54761150
                                           1.0000000
                                                       0.75721332
                                                                   0.1093313311
## sqft_living
                  0.44549371
                               0.59605329
                                           0.7572133
                                                       1.00000000
                                                                   0.2132675559
## sqft_lot
                  0.05134733
                               0.07113750
                                           0.1093313
                                                       0.21326756
                                                                   1.0000000000
## floors
                  0.15275831
                               0.17621907
                                           0.4895482
                                                       0.34351326
                                                                   0.0042453119
## waterfront
                  0.15008259 -0.00552121
                                           0.0633104
                                                       0.10775814
                                                                   0.0174078256
## view
                  0.24258747
                               0.11508022
                                           0.2055361
                                                       0.30934312
                                                                   0.0725267888
## condition
                  0.03889172
                               0.02301785 -0.1207655 -0.06252868
                                                                   0.0009289773
## sqft_above
                               0.48567166
                                           0.6872080
                                                       0.87565653
                                                                   0.2191932396
                  0.38066094
## sqft_basement
                  0.21778233
                               0.33510295
                                           0.2958325
                                                       0.44967103
                                                                   0.0358943837
## yr_built
                  0.02175681
                               0.14149772
                                          0.4642395
                                                      0.28473287
                                                                   0.0491634718
  yr_renovated
                 -0.02903374 -0.06221932 -0.2181595 -0.12158915 -0.0210677332
##
                        floors
                                 waterfront
                                                    view
                                                             condition
                                                                         sqft_above
## price
                  0.152758308 0.150082587
                                             0.24258747
                                                          0.0388917213
                                                                         0.38066094
## bedrooms
                  0.176219070 -0.005521210
                                            0.11508022 0.0230178464
                                                                         0.48567166
## bathrooms
                  0.489548206
                               0.063310399  0.20553611  -0.1207654863
                                                                         0.68720805
                  0.343513264 \quad 0.107758137 \quad 0.30934312 \quad -0.0625286789
## sqft_living
                                                                        0.87565653
```

```
## sqft lot
                0.004245312 0.017407826 0.07252679 0.0009289773 0.21919324
                1.000000000 \quad 0.015804402 \quad 0.03198006 \quad -0.2737856691 \quad 0.52221450
## floors
## waterfront
                0.015804402 1.000000000 0.34757197 0.0061115110 0.07250229
                0.031980062 0.347571972 1.00000000 0.0625603230 0.17462889
## view
## condition
               -0.273785669 0.006111511 0.06256032 1.0000000000 -0.17654863
## sqft above
                0.522214500 0.072502289 0.17462889 -0.1765486285 1.00000000
## sqft basement -0.255042074 0.088880236 0.31711737 0.1971442683 -0.03759685
## yr built
                0.466690558 -0.032017059 -0.06634405 -0.3988864426 0.40643626
## yr_renovated -0.235968880 0.015821146 0.02584557 -0.1844831086 -0.16128119
##
               sqft_basement
                               yr_built yr_renovated
## price
                  0.33510295 0.14149772 -0.06221932
## bedrooms
## bathrooms
                  0.29583249 0.46423948 -0.21815955
## sqft_living
                  0.44967103 0.28473287 -0.12158915
## sqft_lot
                  ## floors
                 0.08888024 -0.03201706 0.01582115
## waterfront
## view
                  0.31711737 -0.06634405
                                        0.02584557
                  0.19714427 -0.39888644 -0.18448311
## condition
## sqft above
                 -0.03759685 0.40643626 -0.16128119
## sqft_basement
                  1.00000000 -0.16253754
                                        0.04669836
## yr built
                 -0.16253754 1.00000000 -0.32293836
## yr_renovated
                  0.04669836 -0.32293836
                                         1.00000000
```

There is strong positive co relation between sqft living and price.

Scaling the values

```
data$price=data$price*10000
cols_scale <- c("price", "sqft_living", "sqft_lot", "sqft_above", "sqft_basement")
scaled_data <- as.data.frame(scale(data[cols_scale]))

data$price=scaled_data$price
data$sqft_living=scaled_data$sqft_living
data$sqft_above=scaled_data$sqft_above
data$sqft_basement=scaled_data$sqft_basement
data$sqft_lot=scaled_data$sqft_lot
data$yr_built=2023-data$yr_built
head(data)</pre>
```

```
##
                               price bedrooms bathrooms sqft_living
                                                                        sqft_lot
## 1 2014-05-02 00:00:00 -0.43428432
                                            3
                                                   1.50 -0.8288848 -0.19250544
## 2 2014-05-02 00:00:00 3.23815814
                                            5
                                                   2.50
                                                           1.5875603 -0.16086275
## 3 2014-05-02 00:00:00 -0.38285948
                                            3
                                                   2.00 -0.2116976 -0.08031015
                                            3
## 4 2014-05-02 00:00:00 -0.24454441
                                                   2.25 -0.1384720 -0.18922439
## 5 2014-05-02 00:00:00 -0.01401929
                                            4
                                                   2.50 -0.2012368 -0.12054475
## 6 2014-05-02 00:00:00 -0.12041550
                                            2
                                                   1.00 -1.3100817 -0.23510350
##
     floors waterfront view condition sqft_above sqft_basement yr_built
## 1
        1.5
                     0
                                                   -0.67133944
                          0
                                    3 -0.5643631
                                                                      68
        2.0
## 2
                                    5 1.8114261
                                                                     102
                     0
                          4
                                                   -0.06526261
## 3
        1.0
                     0
                          0
                                    4 0.1261372
                                                                      57
                                                   -0.67133944
## 4
        1.0
                     0
                          0
                                    4 -0.9622786
                                                    1.49322069
                                                                      60
                     0
                          0
                                    4 -0.7984310
                                                                      47
## 5
        1.0
                                                    1.06030866
                     0
                                    3 -1.1027193
## 6
        1.0
                          0
                                                                      85
                                                  -0.67133944
```

```
yr_renovated
##
                                    street
                                                city statezip country
## 1
            2005
                      18810 Densmore Ave N Shoreline WA 98133
                                                                  USA
## 2
                           709 W Blaine St Seattle WA 98119
                                                                  USA
                0 26206-26214 143rd Ave SE
                                              Kent WA 98042
## 3
                                                                  USA
                           857 170th Pl NE Bellevue WA 98008
## 4
                0
                                                                  USA
## 5
                         9105 170th Ave NE Redmond WA 98052
                                                                  USA
            1992
## 6
                            522 NE 88th St Seattle WA 98115
             1994
                                                                  USA
```

Data splitting into test and train dataset

```
train <- sample(nrow(data), floor(0.7*nrow(data)), replace = FALSE)
test <- setdiff(1:nrow(data), train)
train_data<-data[train, ]
test_data<-data[test, ]

#The dataset is now split into 30% test data and 70% train data
print(dim(train_data))

## [1] 3185 18</pre>
```

[1] 1366 18

dim(test_data)

1. Linear Regression Model

```
\label{lin_reg} $$\lim_{r\to\infty}-\lim(\operatorname{price}^*\operatorname{bedrooms+bathrooms+sqft_living+sqft_lot+floors+}\ \operatorname{waterfront+view+}\ \operatorname{condition}\ +\operatorname{sqft_aboventer}\ \operatorname{summary}(\lim_{r\to\infty})$
```

```
##
## Call:
## lm(formula = price ~ bedrooms + bathrooms + sqft_living + sqft_lot +
      floors + waterfront + view + condition + sqft_above + sqft_basement +
      yr_built + yr_renovated, data = train_data)
##
##
## Residuals:
     Min
             1Q Median
                           3Q
                                 Max
## -2.672 -0.238 -0.039 0.153 46.659
##
## Coefficients: (1 not defined because of singularities)
                  Estimate Std. Error t value Pr(>|t|)
##
## (Intercept)
                -4.792e-01 1.577e-01 -3.039 0.002395 **
## bedrooms
                -9.216e-02 2.369e-02 -3.890 0.000102 ***
## bathrooms
                1.224e-01 3.928e-02 3.116 0.001847 **
                 3.595e-01 4.688e-02
                                      7.668 2.30e-14 ***
## sqft_living
## sqft lot
                -4.983e-02 1.664e-02 -2.995 0.002764 **
## floors
                 4.562e-02 4.206e-02 1.085 0.278153
## waterfront
                 6.570e-01 2.020e-01 3.252 0.001160 **
                 1.113e-01 2.508e-02 4.438 9.39e-06 ***
## view
```

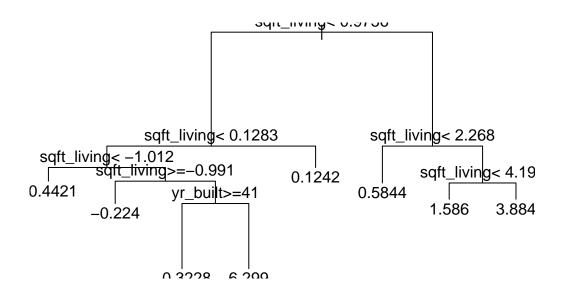
```
## condition 6.046e-02 2.976e-02 2.032 0.042269 *
## sqft_above 6.507e-02 4.097e-02 1.588 0.112376
## sqft_basement NA NA NA NA
## yr_built 3.973e-03 7.730e-04 5.141 2.90e-07 ***
## yr_renovated 1.026e-05 1.943e-05 0.528 0.597443
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.928 on 3173 degrees of freedom
## Multiple R-squared: 0.2091, Adjusted R-squared: 0.2064
## F-statistic: 76.27 on 11 and 3173 DF, p-value: < 2.2e-16

lin_reg_pred<-predict(lin_reg,newdata=test_data)
lm_rmse <- sqrt(mean((lin_reg_pred - test_data$price)^2))
print(paste("Linear Regression RMSE:", lm_rmse))</pre>
```

[1] "Linear Regression RMSE: 0.737985376364015"

2. Building a Decision Tree Model

```
library(rpart)
tree_model <- rpart(price ~bedrooms+bathrooms+sqft_living+sqft_lot+floors+ waterfront+view+ condition +
printcp(tree_model)
##
## Regression tree:
## rpart(formula = price ~ bedrooms + bathrooms + sqft_living +
       sqft_lot + floors + waterfront + view + condition + sqft_above +
##
       sqft_basement + yr_built + yr_renovated, data = train_data,
       method = "anova")
##
## Variables actually used in tree construction:
## [1] sqft_living yr_built
##
## Root node error: 3454.8/3185 = 1.0847
##
## n= 3185
##
##
          CP nsplit rel error xerror
## 1 0.111926 0 1.00000 1.00079 0.61787
                 1 0.88807 0.89368 0.62178
## 2 0.036240
## 3 0.028059
                 2 0.85183 0.86810 0.62159
                 6 0.73960 0.90512 0.62204
## 4 0.015985
## 5 0.010000
                 7 0.72361 0.90263 0.62539
plot(tree_model)
text(tree_model)
```



head(test_data)

```
##
                      date
                                price bedrooms bathrooms sqft_living
                                                                        sqft_lot
## 2 2014-05-02 00:00:00 3.2381581
                                             5
                                                     2.50
                                                            1.5875603 -0.1608628
## 7 2014-05-02 00:00:00 -0.3952724
                                             2
                                                     2.00
                                                          -0.8184240 -0.3413206
## 15 2014-05-02 00:00:00 1.1386063
                                             5
                                                     2.75
                                                            0.8134610 -0.1489064
## 17 2014-05-02 00:00:00 -0.2463177
                                             3
                                                     1.50
                                                           -0.5882864 -0.2262057
## 18 2014-05-02 00:00:00 -0.3376411
                                             4
                                                     3.00
                                                            1.0226770 -0.2114410
## 22 2014-05-02 00:00:00 -0.2179454
                                             4
                                                     1.00 -0.7138160 -0.1678141
##
      floors waterfront view condition sqft_above sqft_basement yr_built
## 2
         2.0
                            4
                                      5 1.8114261
                                                      -0.06526261
                                                                       102
                      0
## 7
         1.0
                                      3 -0.5526597
                                                      -0.67133944
                                                                        47
                                                                        84
## 15
         1.5
                      0
                            0
                                      3 1.2730699
                                                      -0.67133944
## 17
         1.0
                      0
                                      4 -0.2951850
                                                      -0.67133944
                                                                        67
## 18
         2.0
                      0
                            0
                                      3 1.5071379
                                                                        26
                                                      -0.67133944
                                                      -0.67133944
## 22
         1.0
                                      4 -0.4356258
                                                                         69
##
      yr_renovated
                               street
                                          city statezip country
                     709 W Blaine St
## 2
                 0
                                       Seattle WA 98119
                                                             USA
## 7
                 0 2616 174th Ave NE Redmond WA 98052
                                                             USA
## 15
                                                             USA
              1969
                    3534 46th Ave NE Seattle WA 98105
## 17
                     15424 SE 9th St Bellevue WA 98007
                                                             USA
                 0
## 18
                 0 11224 SE 306th Pl
                                        Auburn WA 98092
                                                             USA
## 22
              1979 3922 154th Ave SE Bellevue WA 98006
                                                             USA
```

```
predicted_price <- predict(tree_model, test_data[,-c(1)],method="anova",type="vector")
rmse <- sqrt(mean((predicted_price - test_data$price) ^ 2))
print(paste("Decision Tree RMSE:", rmse))</pre>
```

[1] "Decision Tree RMSE: 0.83957861487738"