PROJECT 1: PROBLEM 3

DATA ECONOMY REAL CASE STUDY: REAL DIRECT

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PROBLEM DESCRIPTION

Write a R script to clean data, perform EDA and analyse the RealDirect data set to find some insights.

EDA

Exploratory Data Analysis (EDA) is the first step toward building a model. It is a critical part of the data science process. The basic tools of EDA are plots, graphs and summary statistics. Generally speaking, it's a method of systematically going through the data, plotting distributions of all variables (using box plots), plotting time series of data, transforming variables, looking at all pairwise relationships between variables using scatterplot matrices, and generating summary statistics for all of them. At the very least that would mean computing their mean, minimum, maximum, the upper and lower quartiles, and identifying outliers.

DATA

The data is present in the XLS format. There are 21 variables like borough, neighborhood, block, lot etc. per record. Use perl to import the data to R.

CLEANING AND ADDING FEATURES TO DATA

- 1. Created a new variable, sale_price_n, to remove the \$ from sale.price
- 2. Make land.square.feet, year.built and gross.square.feet numeric
- 3. Make sale.date as date in R
- 4. Replace the '.' in column names by '_' since sqldf package does not accept columns with '.' in them.
- 5. Remove outlier data for eg, data with sale.price as 0, gross.square.feet=0, where neighborhood is not mentioned, no zipcodes, year.built is 0 etc. to finally get a full dataset.
- 6. For the multiple boroughs data, also add a variable BoroughName according to the data that it corresponds to.

ANALYSIS FOR A SINGLE BOROUGH

Here we take the data for the brooklyn borough.

SUMMARY

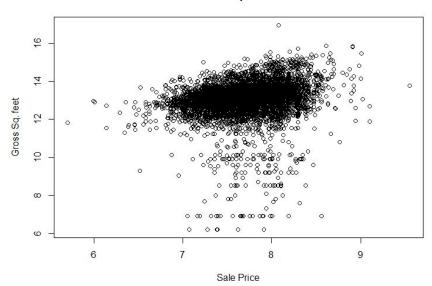
```
BOROLIGH
                             NEIGHBORHOOD
                                                                         BUILDING.CLASS.CATEGORY TAX.CLASS.AT.PRESENT
           BEDFORD STUYVESANT
                                           02 TWO FAMILY HOMES
                                                                                                       :10976
                                  : 1699
                                                                                     :5776
1st Qu.:3
                                   : 1394
                                                                                     :2890
                                                                                                       : 6070
           EAST NEW YORK
                                           01 ONE FAMILY HOMES
           BOROUGH PARK
                                  : 1020
                                          13 CONDOS - ELEVATOR APARTMENTS
                                                                                     :2739
                                                                                                4
                                                                                                       : 2445
Median :3
           BUSHWICK
                                                                                     :2255
                                                                                                2A
                                                                                                       : 1512
                                  : 898
                                          03 THREE FAMILY HOMES
Mean :3
                                   : 886
                                           10 COOPS - ELEVATOR APARTMENTS
                                                                                     :2129
                                                                                                2C
                                                                                                       : 1024
3rd Qu.:3
          CROWN HEIGHTS
                                                                                                       : 422
           PARK SLOPE
                                   : 848
                                          07 RENTALS - WALKUP APARTMENTS
                                                                                     :1755
                                                                                                18
                                   :16628
                                                                                                (Other): 924
                                           (Other)
                                                                                     :5829
           (Other)
                                            BUILDING. CLASS. AT. PRESENT
                                                                                                        ADDRESS
   BLOCK
                  LOT
                              EASE.MENT
     : 20
                                                  : 2703
             Min. : 1.0
                              Mode:logical
                                            R4
                                                                    163 WASHINGTON AVENUE
                                                                                                              106
Min.
              1st Qu.: 22.0
                                            CO
                                                   : 2258
                              NA's:23373
                                                                     205 WATER STREET
                                                                                                               76
1st Qu.:1638
             Median: 48.0
                                            D4
                                                   : 2125
                                                                     380 COZINE AVENUE
                                                                                                               65
Median :3839
                                            B1
      :3984
              Mean : 305.4
                                                   : 2080
                                                                     34 NORTH 7TH STREET
                                                                                                               63
                                            B3
                                                   : 1229
                                                                                                               62
3rd Qu.:6259
              3rd Qu.: 142.0
                                                                     12399 FLATLANDS AVENUE
                                                   : 1115
      :8955
                    :9039.0
                                            B2
                                                                     306 GOLD STREET
                                                                                                               62
                                            (Other):11863
                                                                     (Other)
                                  RESIDENTIAL.UNITS COMMERCIAL.UNITS
  APART.MENT.NUMBER
                      ZIP.CODE
                                                                      TOTAL. UNITS
                                                                                      LAND. SQUARE. FEET GROSS. SQUARE. FEET
                   Min. : 0
           :17632
                                  Min. : 0.000 Min. : 0.0000
                                                                     Min. : 0.00
                                                                                            : 8027
           : 204
                   1st Qu.:11209
                                  1st Qu.: 1.000
                                                   1st Qu.: 0.0000
                                                                     1st Qu.: 1.00
                                                                                     2,000
                                                                                            : 2201
                                                                                                      3,000 : 230
6
           : 183
                   Median :11218
                                  Median: 1.000 Median: 0.0000
                                                                     Median: 1.00
                                                                                     2,500
                                                                                            : 1149
                                                                                                      3,600 :
                                                                                                               189
3
           : 155
                   Mean :11211
                                  Mean : 2.156
                                                   Mean : 0.1973
                                                                     Mean : 2.37
                                                                                     1.800
                                                                                            : 597
                                                                                                      2,400 : 185
2
                                                                                                      2,700 : 146
           : 144
                   3rd Qu.:11230
                                                    3rd Qu.: 0.0000
                                                                      3rd Qu.: 2.00
                                                                                     4,000
                                                                                            : 474
                                  3rd Qu.: 2.000
           : 125
                                        :509.000
                                                   Max. :222.0000
                                                                     Max. :509.00
                                                                                    3,000 : 307
                                                                                                      3,300 : 139
                   Max.
                         :11416 Max.
1
(Other)
                                                                                      (Other):10618
                                                                                                      (Other):13550
           : 4930
 YEAR. BUILT
              TAX.CLASS.AT.TIME.OF.SALE BUILDING.CLASS.AT.TIME.OF.SALE
                                                                      SALE. PRICE
                                                                                         SALE. DATE
                                                                                    2012-09-27: 675
Min. : 0
             Min.
                    :1.000
                                      R4
                                             : 2739
                                                                    $0
                                                                           : 8791
                                      CO
                                                                           : 241
1st Qu.:1901
              1st Qu.:1.000
                                             : 2255
                                                                    $10
                                                                                    2012-12-27:
                                                                                                245
                                                                    $700,000: 138
Median :1925
             Median :1.000
                                      D4
                                             : 2125
                                                                                    2012-12-20:
      :1681
             Mean :1.705
                                      B1
                                             : 2070
                                                                    $650,000: 129
                                                                                    2013-03-22:
Mean
                                      В3
                                                                    $300,000: 120
                                                                                    2012-12-31:
                                                                                                179
3rd Qu.:1950
              3rd Qu.:2.000
                                             : 1230
Max.
      :2013
             Max. :4.000
                                      B2
                                             : 1115
                                                                    $600,000: 120
                                                                                    2012-12-19: 178
                                      (Other):11839
                                                                    (Other) :13834
                                                                                    (Other)
                                                                                             :21670
```

We can view the summary for the data for the brooklyn borough using the summary function. We can see the sales that occurred across different neighborhoods, different categories of buildings like one family homes or condos, basically across all the fields. We can also observe some outliers in the sale. price summary, i.e., the sale price which were for 0\$ or 10\$ etc.

We can observe outliers in the land.square.feet and gross.square.feet where values is 0 as well as year.built where minimum year is 0. Similarly, exclude places having no zipcodes.

PLOTS 1)

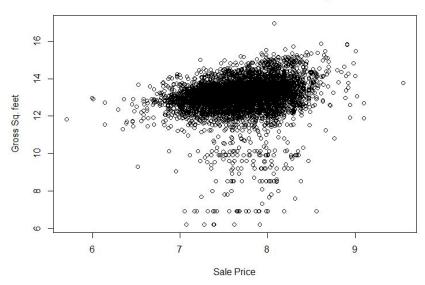
Sale Price vs Gross Sq. Feet without outliers



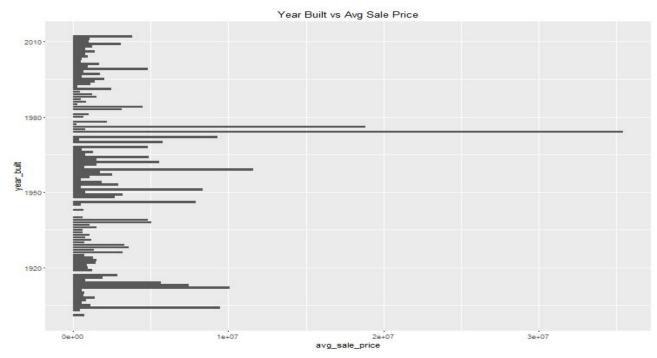
This is the graph of log(sale.price) vs log(gross.sq.feet). In general, we can say that as gross square feet increases the sale price increases.

2)

FAMILY HOMES - Sale Price vs Gross Sq. Feet

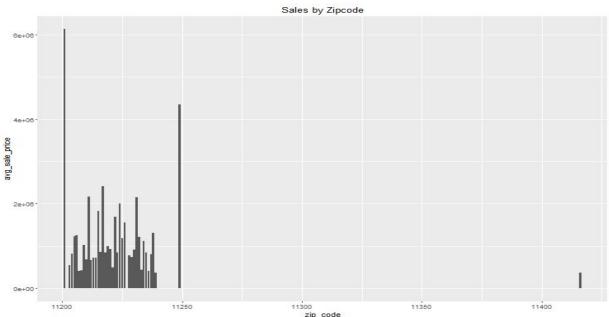


This is the graph of log(sale.price) vs log(gross.sq.feet) for family homes only. It is following the general property mentioned above.

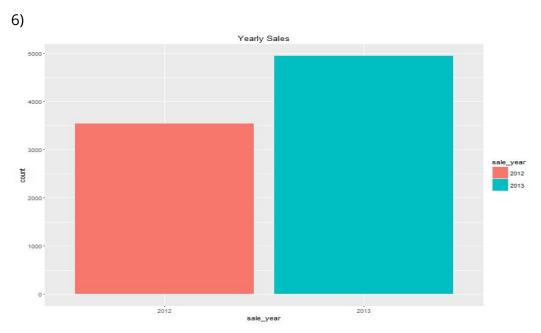


According to the graph above the houses built in 1970-1980 period had the highest sale price.

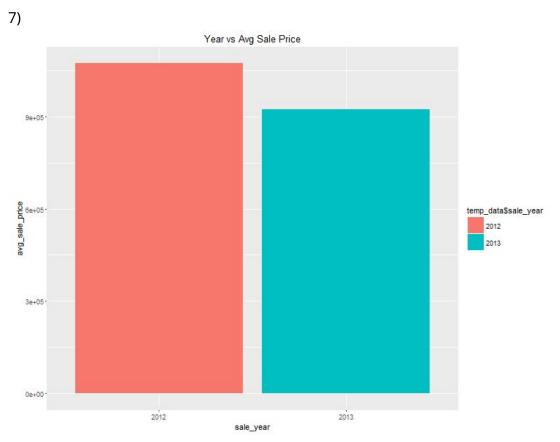
4)



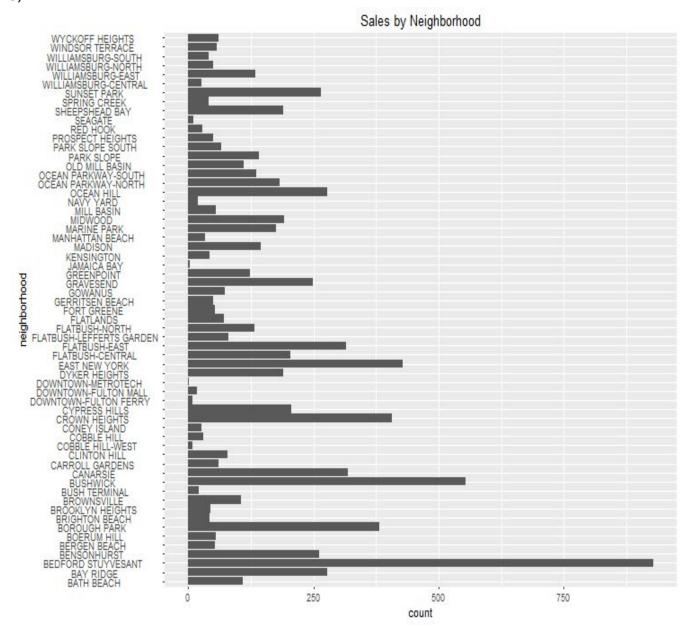
According to the graph above, places at the zipcode 11201 had the highest avg sale prices



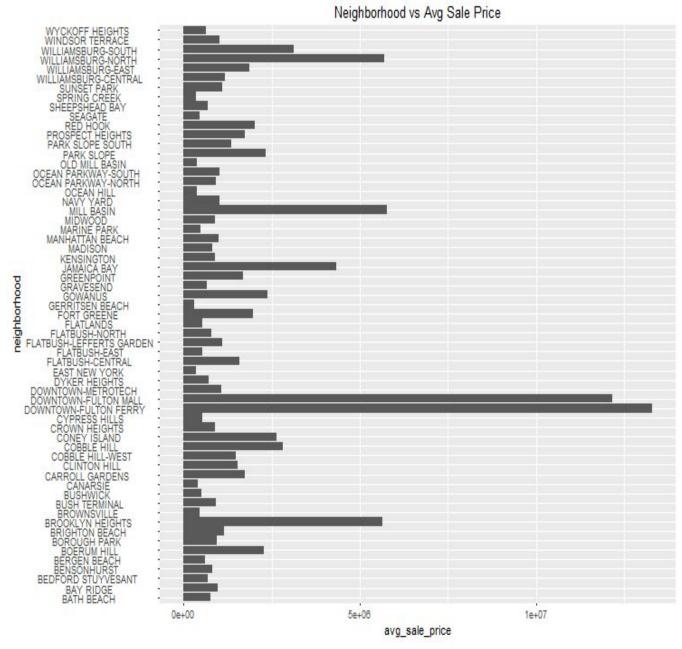
Number of sales increased in 2013.



At the same time, the average sale price decreased in 2013.

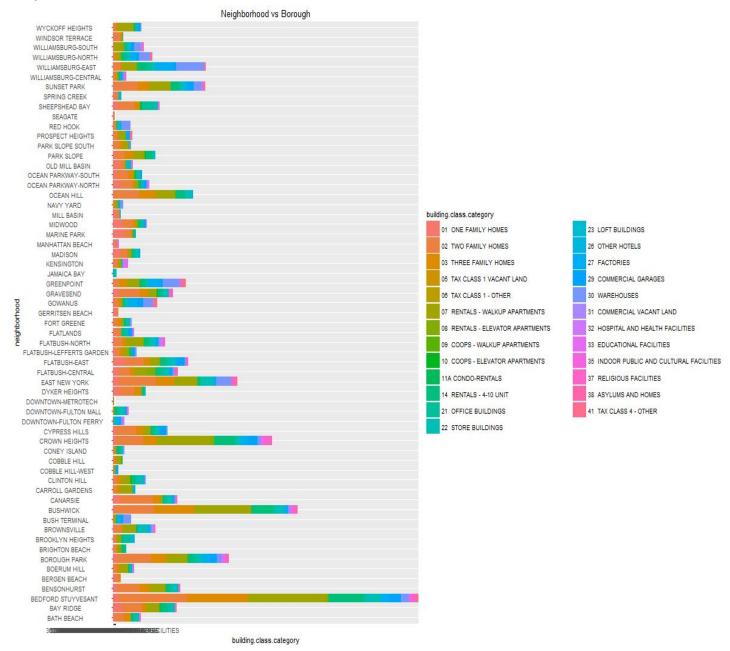


We can see the sales that happened across all the neighborhoods in Brooklyn in the graph. Highest sales took place in the neighborhood of Bedford Stuyvesant (because of low average sale price as shown in next graph) whereas min sales occured at Downtown-Metrotech.



Downtown Fulton Mall had the highest avg sale price. Hence, very low sales happened in that neighborhood as can be seen in the graph above. We can see that neighborhoods having high avg sale price had lower sales.





Bedford Stuyvesant has every type of building in the neighborhood. That is probably why highest sales took place in that neighborhood, whereas Downtown Metrotech only has one class, I think vacant land, because of which its price is one of the highest.

ANALYSIS FOR A MULTIPLE BOROUGHS

Here we take the data for the Brooklyn, Bronx, Staten Island, Manhattan and Queens Boroughs.

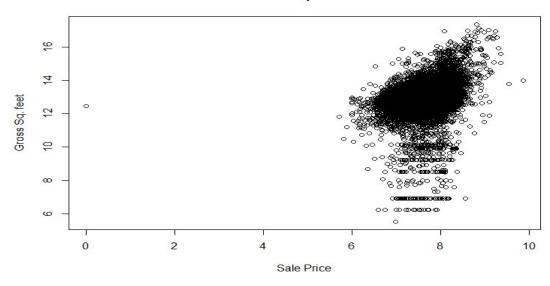
SUMMARY

```
BOROUGH
                                   NEIGHBORHOOD
                                                                                  BUILDING.CLASS.CATEGORY TAX.CLASS.AT.PRESENT
      :1.000
               MIDTOWN WEST
                                         : 6264
                                                  01 ONE FAMILY HOMES
                                                                                              :14846
                                                                                                          2
                                                                                                                 :32899
                                                                                                                 :32863
1st Qu.:1.000
               FLUSHING-NORTH
                                         : 2612
                                                  10 COOPS - ELEVATOR APARTMENTS
Median :3.000
               UPPER EAST SIDE (59-79)
                                        : 2569
                                                                                              :13678
                                                                                                          4
                                                                                                                 :11937
                                                 02 TWO FAMILY HOMES
               UPPER EAST SIDE (79-96)
                                        : 2117
                                                                                              :13313
                                                                                                          2A
                                                                                                                 : 2667
Mean :2.724
                                                 13 CONDOS - ELEVATOR APARTMENTS
                                                                                                          2C
                                        : 2053
                                                                                              : 4204
                                                                                                                 : 1905
3rd Qu.:4.000
               UPPER WEST SIDE (59-79)
       :5.000
                                         : 1699
                                                 03 THREE FAMILY HOMES
                                                                                              : 4135
                                                                                                          18
                                                                                                                 : 1221
               BEDFORD STUYVESANT
                                         :68661
                (Other)
                                                  (Other)
                                                                                              :22028
                                                                                                          (Other): 2483
    BLOCK
                                  EASE.MENT
                                                    BUILDING. CLASS. AT. PRESENT
                                                                                                                   ADDRESS
                     LOT
Min. : 1
               Min.
                      : 1.0
                                Length:85975
                                                           :13461
                                                                              870 7 AVENUE
                                                                                                                       : 2087
               1st Qu.: 23.0
1st Qu.: 1052
                                Class :character
                                                    R4
                                                           :13171
                                                                              102 WEST 57TH STREET
                                                                                                                       : 1322
Median: 2157
               Median: 51.0
                                                           : 5469
                                                                              200 WEST 56TH STREET
                                                                                                                          608
                                Mode :character
                                                   A1
                                                           : 4248
Mean : 3661
               Mean : 405.4
                                                                                                                          405
                                                    B1
                                                                              1335 AVENUE OF THE AMERIC
                                                                                                                          262
3rd Qu.: 5599
                                                           : 4226
                                                                              102 WEST 57TH ST
                3rd Qu.:1009.0
                                                    C<sub>0</sub>
                                                                                                                          191
      :16323
                       :9117.0
                                                           : 4143
                                                                              1335 AVENUE OF THE AMER
               Max.
                                                    (Other):41257
                                                                              (Other)
                                                                                                                       :81100
   APART. MENT. NUMBER
                       ZIP.CODE
                                     RESIDENTIAL.UNITS COMMERCIAL.UNITS
                                                                           TOTAL. UNITS
                                                                                              LAND. SQUARE. FEET GROSS. SQUARE. FEET
                           : 0
                                                                           Length:85975
                                                                                                                      :42780
            :63830
                    Min.
                                    Length: 85975
                                                        Length:85975
                                                                                              0
                                                                                                     :40340
TIMES
               599
                    1st Qu.:10028
                                    Class :character
                                                        Class :character
                                                                           Class :character
                                                                                              2,000
                                                                                                     : 3417
                                                                                                               112,850: 1634
               273
                    Median :11201
                                    Mode :character
                                                        Mode :character
                                                                           Mode :character
                                                                                              2,500
                                                                                                       3130
                                                                                                               2,400 : 349
                                                                                              4,000
3B
               249
                          :10758
                                                                                                    : 2688
                                                                                                               3,000 :
                                                                                                                         346
                    Mean
                                                                                                                         293
3A
               244
                     3rd Qu.:11238
                                                                                              7,532 : 1635
                                                                                                               1,800 :
                                                                                              1,800 : 1113
               235
                            :11694
                                                                                                               2,000 : 265
                    Max.
(Other)
            :20545
                                                                                              (Other):33652
                                                                                                               (Other):40308
 YEAR. BUILT
               TAX.CLASS.AT.TIME.OF.SALE BUILDING.CLASS.AT.TIME.OF.SALE
                                                                           SALE. PRICE
                                                                                              SALE. DATE
                     :1.000
                                                :13461
                                                                        $0
                                                                                         2012-09-27: 988
              Min.
                                                                                :28638
1st Qu.:1910
              1st Qu.:1.000
                                         R4
                                                :13313
                                                                        $10
                                                                                : 758
                                                                                         2012-12-20: 860
Median :1931
               Median:2.000
                                        A1
                                                : 5467
                                                                        $350,000: 394
                                                                                         2012-12-27:
Mean
      :1681
               Mean :1.868
                                         В1
                                                : 4238
                                                                        $400,000: 377
                                                                                         2012-12-17:
3rd Qu.:1964
               3rd Qu.: 2.000
                                         A5
                                                : 4228
                                                                        $300,000:
                                                                                  370
                                                                                         2012-12-28:
                                                                                                      737
Max.
       :2013
               Max.
                      :4.000
                                         C0
                                                : 4135
                                                                        $450,000: 366
                                                                                         2012-12-21:
               NA's
                                         (Other):41133
                                                                        (Other) :55072
                                                                                         (Other)
```

Similar to the summary for a single borough, we can now observe all metrics and outliers like sale.price, year.built,zipcode etc. for multiple boroughs.

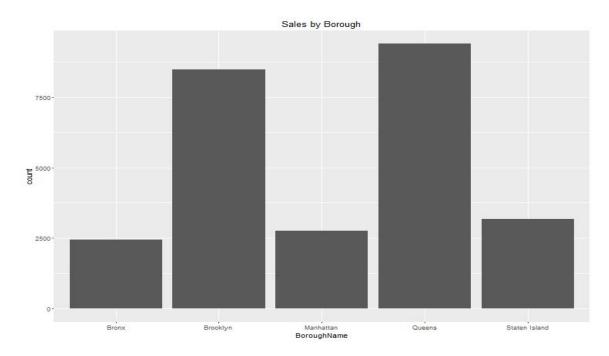
PLOTS 1)

Sale Price vs Gross Sq. Feet without outliers

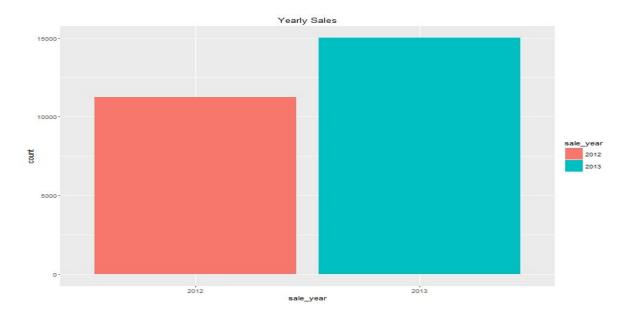


After seeing data for all boroughs, now we can see that the average sale price has increased for gross square feet.

2)

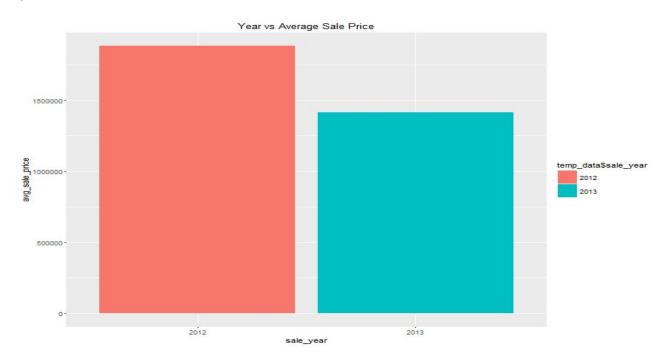


Queens had the maximum sales while Bronx had the minimum

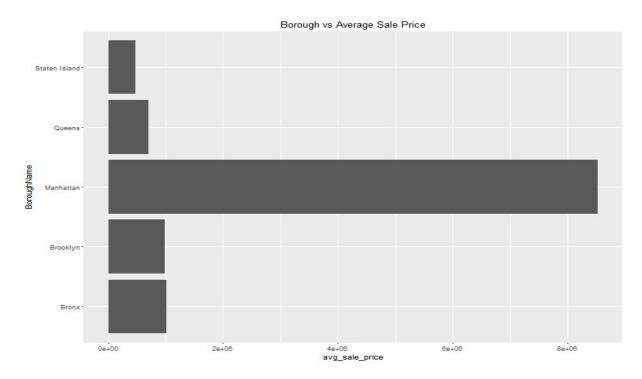


More sales happened in 2013.

4)

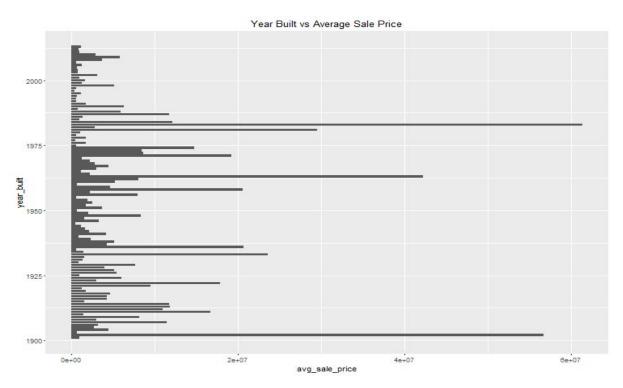


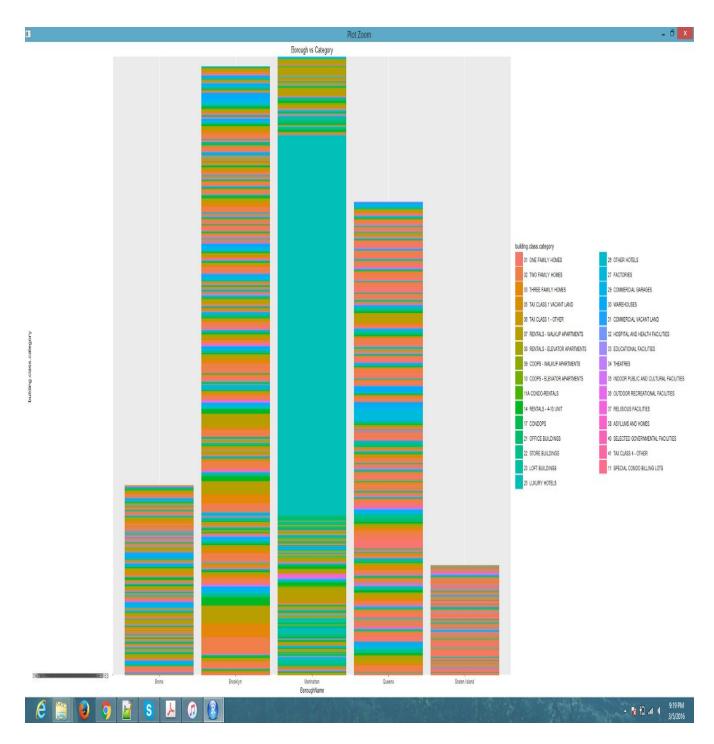
Average Sale price decreased in 2013 even after considering all boroughs data.



Manhattan had the highest average sales price while Staten Island had the least.

6)





In this Boroughs vs Building Category graph, we can observe that Manhattan has the highest no of hotels as property sales

CONCLUSION

Thus, we have analyzed and identified interesting facts in the Real Direct Dataset