Dataset name: Utrecht housing dataset

Dataset link: https://www.kaggle.com/datasets/ictinstitute/utrecht-housing-dataset?

select=utrechthousinghuge.csv

Import the dataset

df = pd.read_csv('gdrive/My Drive/Colab Notebooks/utrechthousinghuge.csv')

Data cleaning

First of all, we will see the shape of the dataset, which is:

(2499, 16)

This dataset has 2499 rows and 16 columns, or features.

Drop duplicates

We drop the duplicates and then we show the shape again , to see if there were duplicates in the dataset.

df.drop_duplicates()

(2499, 16)

There were not duplicates, since the rows didn't changed.

Drop NA variables

df.dropna(inplace = True)

Returns none, since there are not any NaN variables.

Searching for missing data

There is no null data.

```
Ismull:
id
zipcode
lot-lem
lot-width
lot-area
house-area
garden-size
balcony
N-coor
y-coor
buildyear
bathrooms
taxvalue
retailvalue
energy-eff
monument
dtype: int64
```

Viewing not unique data

There exists not unique data.

Nunique:	
id	2499
zipcode	4
lot-lem	736
lot-width	101
lot-area	381
house-area	170
garden-size	907
balcony	3
X-COOP	583
y-coor	927
buildyear	41
bathrooms	2
taxvalue	1380
retailvalue	325
energy-eff	2
monument	2
dtype: int64	

Choosing the target variable

Until now, we cleaned the data, from now on we will work with machine learning models, we will choose attributes, change location of attributes, dropping features and much more machine learning data.

Putting the attribute in the first column

We will have prediction on the price feature of the house, the retailvalue attribute, based on predictors. We will put it in the first column position to have a greater understanding perspective of the soon to be shown, the correlation matrix, which will help us to choose the predictors in order to use machine learning models.

```
columns = list(df.columns)

columns.remove('retailvalue')
columns.insert(0,'retailvalue')
df = df[columns]
```

Dropping id column

We don't need the id column, we will drop it.

```
df = df.drop(columns=['id'])
```

This is the view of the dataset after we dropped id column.

	retailvalue	zipcode	lot-len	lot-width	lot-area	house-area	garden-size	balcomy	x-coor	y-coor	buildyear	bathrooms	taxvalue	energy-eff	monument
0	232000	3520	35.1	14.2	499	147	406		2192	5470	1978		173100		
1	184000	3520	22.2	18.2	404	109	328		2059	5228	1981		136000		
2	230000	3520	59.7	11.8	704	89	629		2243	5388	1972		169000		
3	257000	3520	39.0	18.6	726	130	669		2050	5432	1970		196900		
4	286000	3520	44.2	18.1	800	160	750		2138	5110	1978		226000		

Describe the dataset

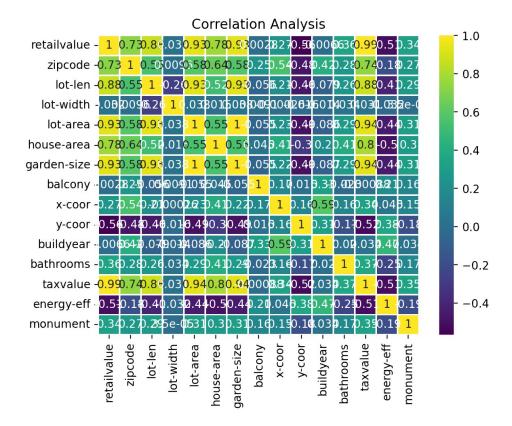
This method, shows us statistical information about the dataset.



From the data, it should not have outliers, we will plot the data, in order to see that there are outliers or not.

Correlation Matrix

This shows the correlation of the features between them.



Checking attributes correlation for choosing the predictor

We can look at the correlation analysis plot from above and find the correlation data between the features , or we can use code to see what are the best attributes to take as predictors for Univariate and Bivariate type models .

```
1.000000
retailvalue
taxvalue
               0.992432
lot-area
               0.934471
garden-size
               0.933547
lot-len
               0.876142
house-area
               0.777607
zipcode
               0.727055
bathrooms
               0.362596
               0.335244
monument
x-coor
               0.265028
lot-width
               0.032310
balcony
               0.002792
buildyear
               -0.006575
energy-eff
               -0.508410
               -0.564726
v-coor
Name: retailvalue, dtype: float64
```

We will take lot-area for the first predictor because of 0.93 score , and taxvalue for the second predictor based on the correlation plot because of 0.94 .

According to "https://www.valuepenguin.com/mortgages/what-is-the-assessed-value-of-a-house",

The assessed value of a home is a yearly estimation of your home's worth, determined by your tax district's municipal property assessor. Local tax officials use this value to calculate the property taxes you pay on your home each year.

--

Univariate Linear Regression

We will chose the target variable (y) and predictor (X) , then we will split the data in training data and testing data .

```
y = df.iloc[:,0].values # target

\( \lambda = \text{df[['lot-area']] # predictor} \)
\( \lambda_train, \lambda_test, \lambda_train, \lambda_test = \text{train_test_split(\lambda,y,test_size=0.3,random_state=0)} \)
```

Then we will create the model, fit it, then predict the target variable based on testing predictors.

```
regressor = LinearRegression()
regressor.fit(X_train, y_train)
y_pred= regressor.predict(X_test)
```

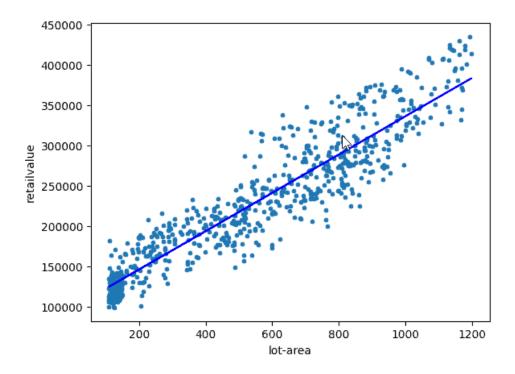
We will store in a table that is below , the R^2 score , Time , where is the case , cross_validation and mean of the cross_validation scores .

```
intercept_: 98657.36787337426
coef_: [237.51031368]

MAE: 21909.238986809483
MSE: 805103008.1358398
RMSE: 28374.337140025666
R^2 : 0.8839326089985096
Time: 0.015860319137573242
```

Plotting Univariate Linear Regression

There are not any outliers, based on the plot.



__

--

Bivariate Linear Regression

For bivariate, we will take 2 features as predictors, the remaining code, is the same.

```
X = df[['lot-area','taxvalue']] # predictor
y = df['retailvalue']
#y = df.iloc[:,0].values # target

X_train, X_test, y_train, y_test = train_test_split(X,y,test_size=0.3,random_state=0)
```

```
intercept_: 36138.6460388875
coef_: [9.34678258 1.04713042]

MAE: 7750.045887629295

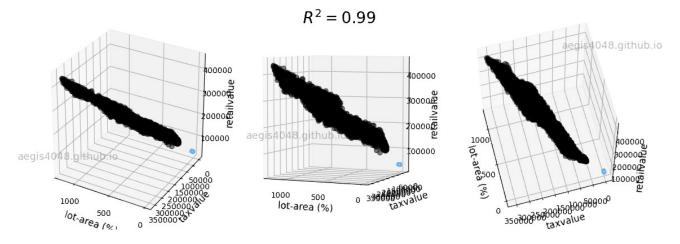
MSE: 100277548.10319632

RMSE: 10013.067789300702

R^2 : 0.9055435226713242

Time: 0.01605081553227539
```

Plotting Bivariate Regression



Univariate Polynomial Regression

Degree 2

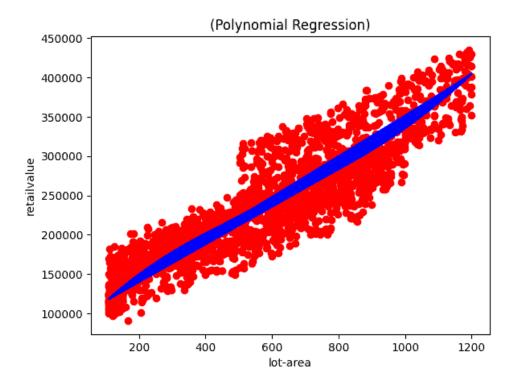
Degree 3

Degree 4

Degree 5

I've tried untill degree 10, in this case, the third and fourth had the same score, then the scores dropped slowly. The best is degree 3.

Plotting Univariate Polynomial Regression



Bivariate Polynomial Regression

Degree 2

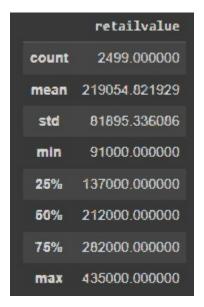
Degree 3

Degree 4

The same thing happened, it growed untill 0.9864, then slowly dropped to 0.9862 and so on.

Logistic Regression

We will create a feature for Logistic Regression model , based on the retailvalue attribute . The new attribute will show the threshold between high-priced houses and low-priced houses , the treshold that is on the second quartile , 50% .



Creating a feature for Logistic Regression

	retailvalue	zipcode	lot-len	lot-width	lot-area	house-area	garden-size	balcony	x-coor	y-coor	buildyear	bathrooms	taxvalue	energy-eff	monument	priceLogistic
0	232000	3520	35.1	14.2	499	147	406		2192	5470	1978		173100			
1	184000	3520	22.2	18.2	404	109	328		2059	5228	1981		136000			
2	230000	3520	59.7	11.8	704	89	629		2243	5388	1972		169000			
3	257000	3520	39.0	18.6	726	130	669		2050	5432	1970		196900			
4	286000	3520	44.2	18.1	800	160	750		2138	5110	1978		226000			
5	185000	3520	16.8	11.4	192	154	124		2194	5214	1972		131200			
6	182000	3520	6.7	16.5		159			2381	5378	1972		122100			
7	184000	3520	17.4	14.4	250	139	180		2083	5292	1974		130900			
8	266000	3520	48.8	17.4	849		796		2140	5192	1976		206400			
9	280000	3520	76.3	11.6	885	118	793		2349	5240	1985		213600			

Univariate

```
Intercept: [-6.56699663]
Coef: [[0.01327895]]
Result: [1 0 1 ... 0 0 1]
Score: 0.9327731092436975
Time: 0.0164031982421875
confusion matrix:
[[1146 110]
[ 58 1185]]
classification_report:
              precision
                         recall f1-score
                                             support
          0
                  0.95
                            0.91
                                      0.93
                                                1256
          1
                  0.92
                            0.95
                                      0.93
                                                1243
                                      0.93
                                                2499
    accuracy
   macro avg
                  0.93
                            0.93
                                      0.93
                                                2499
                                                2499
weighted avg
                  0.93
                            0.93
                                      0.93
```

Bivariate

```
Intercept: [-0.00012213]
Coef: [[ 1.36935190e-02 -3.60089181e-05]]
Result: [1 1 1 ... 1 0 1]
Score: 0.8339335734293718
Time: 0.015445947647094727
confusion matrix:
[[ 996 260]
[ 155 1088]]
classification report:
             precision recall f1-score
                                             support
          0
                  0.87
                            0.79
                                      0.83
                                                1256
          1
                  0.81
                                      0.84
                            0.88
                                                1243
                                      0.83
                                                2499
   accuracy
                  0.84
                            0.83
                                      0.83
                                                2499
  macro avg
weighted avg
                  0.84
                            0.83
                                      0.83
                                                2499
```

Ridge, Lasso and ElasticNet

MSE: 805103008.21768 Time: 0.006439685821533203

0.8732353212041651

Time: 0.004304409027099609

Score eLastic : 0.8732353211831004

Time: 0.010235071182250977

KNN

MAE: 30992.0

MSE: 1818549333.3333333 RMSE: 42644.45255051744 R^2: 0.7378294772289729 Time: 0.06321978569030762

SVC

Linear

```
Result: [1 0 1 ... 0 0 1]
Score: 0.9295718287314926
Time: 0.015386343002319336
confusion matrix:
[[1136 120]
[ 56 1187]]
classification_report:
              precision
                         recall f1-score
                                              support
           0
                   0.95
                             0.90
                                       0.93
                                                 1256
           1
                   0.91
                             0.95
                                       0.93
                                                 1243
                                       0.93
                                                 2499
    accuracy
                                       0.93
   macro avg
                   0.93
                             0.93
                                                 2499
weighted avg
                   0.93
                             0.93
                                       0.93
                                                 2499
```

Poly

```
Result: [1 0 1 ... 1 0 1]
Score: 0.9211684673869548
Time: 0.14380574226379395
confusion matrix:
[[1102 154]
[ 43 1200]]
classification_report:
             precision
                          recall f1-score
                                             support
          0
                  0.96
                            0.88
                                      0.92
                                                1256
          1
                  0.89
                            0.97
                                      0.92
                                                1243
                                      0.92
                                                2499
   accuracy
                                      0.92
  macro avg
                  0.92
                            0.92
                                                2499
weighted avg
                  0.92
                            0.92
                                      0.92
                                                2499
```

radial basis function

```
Result: [0 0 1 ... 0 0 1]
Score: 0.0919567827130052
Time: 1.250969409942627
confusion matrix:
[[1183 73]
[ 197 1046]]
classification_report:
             precision
                         recall f1-score
                                             support
                                      0.90
           0
                  0.86
                            0.94
                                                1256
                  0.93
                            0.84
                                      0.89
                                                1243
                                      0.89
                                                2499
    accuracy
                            0.89
                                      0.89
                                                2499
   macro avg
                  0.90
weighted avg
                  0.90
                            0.89
                                      0.89
                                                2499
```

SVR

This dataset has 2499 rows and 16 columns, or features.

Linear

MAE: 49937.29615596176 MSE: 3348808474.35345 RMSE: 57868.8903846743 R^2: 0.5172202082788571 Time: 0.01723623275756836

Poly

MAE: 26350.96539547016 MSE: 1128230517.6764596 RMSE: 33589.14285414946 R^2: 0.8373490456355703 Time: 0.14835214614868164

radial basis function

MAE: 70437.32979032413 MSE: 7020078573.356591 RMSE: 83785.90915754624 R^2: -0.012047149744953023 Time: 0.21212506294250488

Nystroem/Classification-SVC

This dataset has 2499 rows and 16 columns, or features.

Linear

```
Result: [0 0 1 ... 0 0 1]
Score: 0.9267707082833133
Time: 0.16744542121887207
confusion matrix:
[[1158 98]
[ 85 1158]]
classification_report:
             precision
                         recall f1-score
                                             support
          0
                  0.93
                            0.92
                                      0.93
                                                1256
          1
                  0.92
                            0.93
                                      0.93
                                                1243
                                      0.93
   accuracy
                                                2499
  macro avg
                  0.93
                            0.93
                                      0.93
                                                2499
weighted avg
                  0.93
                            0.93
                                      0.93
                                                2499
```

Poly

```
Result: [1 1 1 ... 1 0 1]
Score: 0.7735094037615046
Time: 0.6935691833496094
confusion_matrix:
[[ 700 556]
[ 10 1233]]
classification_report:
             precision
                          recall f1-score
                                              support
                            0.56
                                      0.71
          0
                  0.99
                                                 1256
                  0.69
                            0.99
                                      0.81
                                                 1243
                                      0.77
                                                 2499
   accuracy
  macro avg
                  0.84
                            0.77
                                      0.76
                                                 2499
weighted avg
                  0.84
                            0.77
                                      0.76
                                                 2499
```

radial basis function

```
Result: [0 0 0 ... 0 0 0]
Score: 0.5026010404161665
Time: 3.486034870147705
confusion_matrix:
        0]
[[1256
         0]]
[1243
classification report:
             precision
                          recall f1-score
                                             support
          0
                  0.50
                            1.00
                                      0.67
                                                1256
                  0.00
                            0.00
                                      0.00
                                                1243
   accuracy
                                      0.50
                                                2499
  macro avg
                  0.25
                            0.50
                                      0.33
                                                2499
weighted avg
                  0.25
                            0.50
                                      0.34
                                                2499
```

Decision Trees

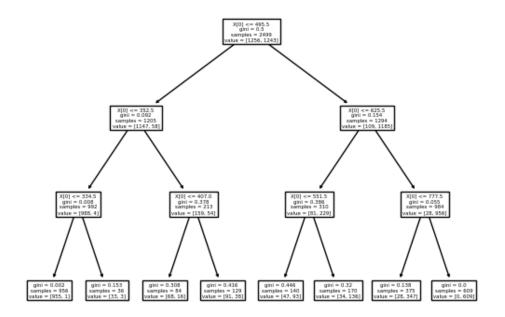
This dataset has 2499 rows and 16 columns, or features.

Regression

MAE: 27049.060589301764 MSE: 1405966591.9032333 RMSE: 37496.22103496875 R^2: 0.7973093225234453 Time: 0.010043144226074219

Classification (with gini criterion)

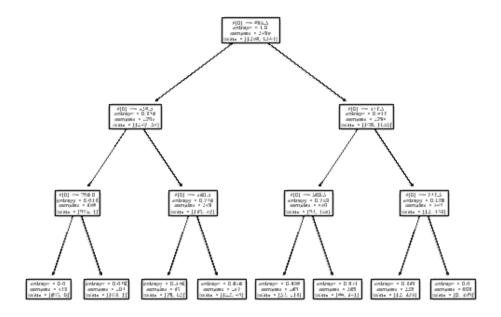
```
Result: [101...001]
Score: 0.933173269307723
Time: 0.010600437030012695
confusion_matrix:
[[1147 109]
[ 58 1185]]
classification_report:
            precision recall f1-score
                                          support
                 0.95
                        0.91
                                    0.93
          0
                                             1256
          1
                 0.92
                          0.95
                                    0.93
                                             1243
   accuracy
                                    0.93
                                             2499
                 0.93
                                    0.93
                                             2499
  macro avg
                          0.93
weighted avg
                 0.93
                          0.93
                                    0.93
                                             2499
```



Classification (with entropy criterion)

```
Result: [1 0 1 ... 0 0 1]
Score: 0.933173269307723
Time: 0.011295318603515625
confusion_matrix:
[[1147 109]
 [ 58 1185]]
classification_report:
              precision
                           recall f1-score
                                               support
           0
                   0.95
                              0.91
                                        0.93
                                                  1256
           1
                              0.95
                   0.92
                                        0.93
                                                  1243
    accuracy
                                        0.93
                                                  2499
                                        0.93
                                                  2499
   macro avg
                   0.93
                              0.93
weighted avg
                   0.93
                              0.93
                                        0.93
                                                  2499
```

Tree Visualization



Random Forest

This dataset has 2499 rows and 16 columns, or features.

Regression

MAE: 25055.504743625657 MSE: 1146603231.4586546 RMSE: 33861.5302586675 R^2: 0.8347003498379306 Time: 0.16644501686096191

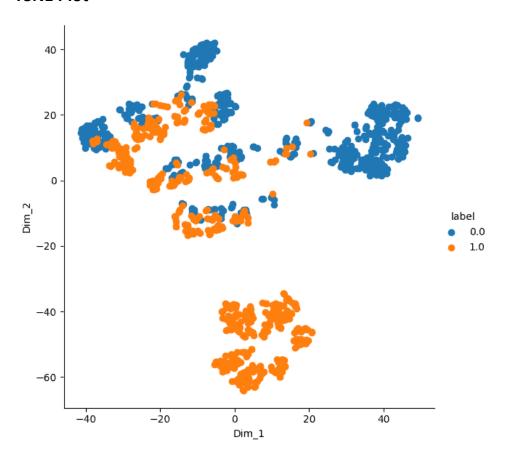
Classification

```
Result: [1 0 1 ... 0 0 1]
Score: 0.952781112444978
Time: 0.3152439594268799
confusion_matrix:
[[1174 82]
[ 36 1207]]
classification_report:
             precision
                       recall f1-score
                                         support
          0
                 0.97
                          0.93
                                   0.95
                                             1256
          1
                0.94
                          0.97
                                   0.95
                                             1243
   accuracy
                                    0.95
                                             2499
  macro avg
                 0.95
                          0.95
                                    0.95
                                             2499
weighted avg
                 0.95
                          0.95
                                    0.95
                                             2499
```

TSNE

```
Result: [1 0 1 ... 1 0 1]
Score: 0.9635854341736695
Time: 0.3649451732635498
confusion_matrix:
[[1192 64]
    27 1216]]
classification_report:
                           recall f1-score
              precision
                                              support
                                                  1256
           0
                   0.98
                             0.95
                                       0.96
           1
                   0.95
                             0.98
                                       0.96
                                                  1243
    accuracy
                                       0.96
                                                  2499
                                                  2499
                             0.96
                                       0.96
   macro avg
                   0.96
weighted avg
                   0.96
                             0.96
                                       0.96
                                                  2499
```

TSNE Plot



Kernel PCA

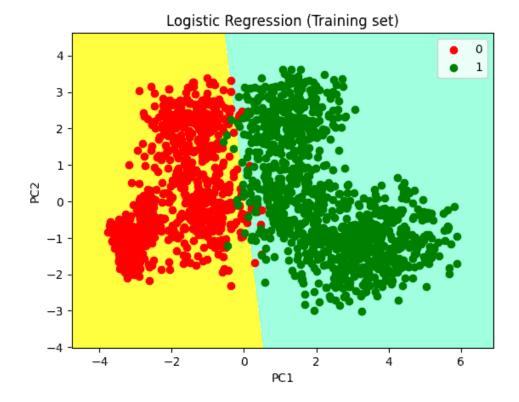
```
Result: [1 0 1 ... 1 0 1]
Score: 0.9467787114845938
Time: 0.49223828315734863
confusion_matrix:
[[1161 95]
[ 38 1205]]
classification_report:
             precision recall f1-score
                                           support
          0
                0.97
                         0.92
                                    0.95
                                              1256
                 0.93
                           0.97
                                    0.95
                                              1243
   accuracy
                                    0.95
                                              2499
  macro avg
                 0.95
                           0.95
                                    0.95
                                              2499
weighted avg
                 0.95
                           0.95
                                    0.95
                                              2499
```

PCA - Logistic Regression

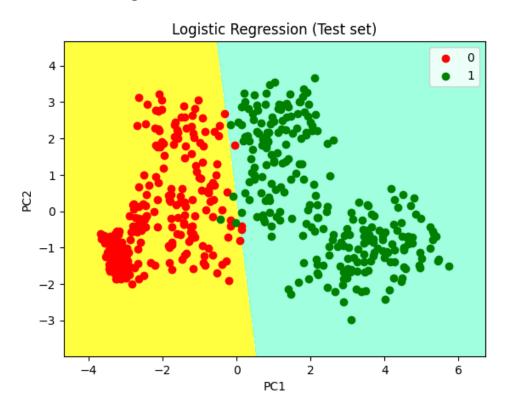
MAE: 0.012 MSE: 0.012

RMSE: 0.10954451150103323 R*2: 0.9519992319877117 Time: 0.007677793502807617

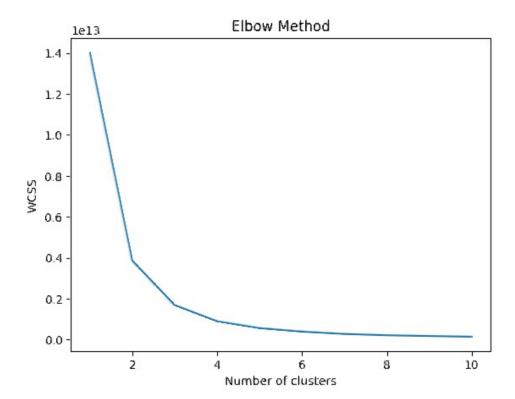
PCA Plot Training



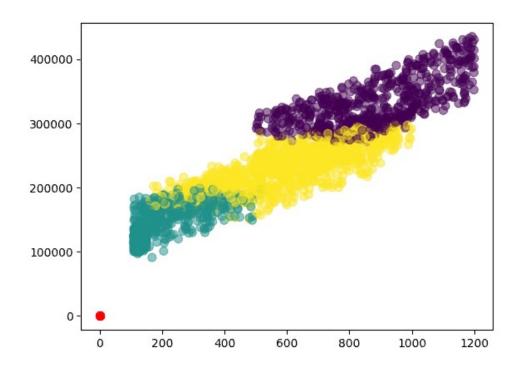
PCA Plot Testing



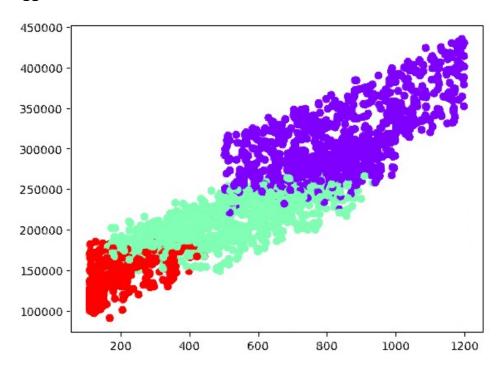
Elbow Method



Clustering – lot-area and retailvalue Kmeans

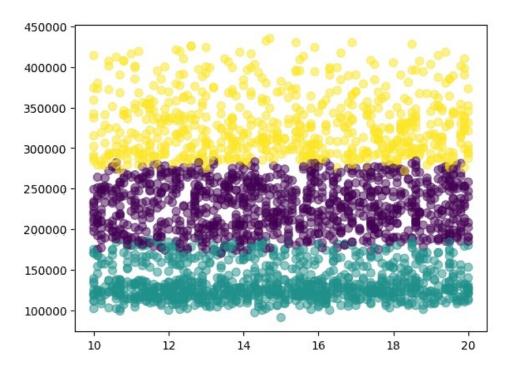


Agglomerative

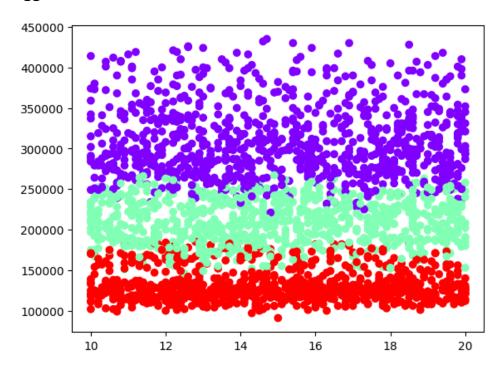


Clustering – lot-width and retailvalue

Kmeans



Agglomerative



Regression	Туре	R^2	Cross- Validation	MEAN (Cross- Validation)	TIME
Univariate Linear Regression		0.8839326089 985096			0.0164825916 2902832
Bivariate Linear Regression		0.9855435226 713242			0.0133330821 9909668
Univariate Polynomial Regression	Degree-2	0.8832			0.0176999568 939209
	Degree-3	0.8860			0.0239722728 72924805
Bivariate Polynomial Regression	Degree-2	0.9859			0.0112218856 81152344
	Degree-3	0.9864			0.0170538425 44555664
Logistic Regression	Univariate	0.9327731092 436975			0.0134501457 21435547
	Bivariate	0.8339335734 293718			0.0183672904 96826172
Ridge	Not a type MSE:	805103008.21 768			0.0046317577 36206055
Lasso		0.8732353212 041651			0.0060822963 71459961
ElasticNet		0.8732353211 831004			0.0085065364 83764648
K-nearest neighbors		0.7378294772 289729	r2: [0.73523295 0.73816774 0.7665821 0.74091509	0.7415317511 15086	0.0301744937 8967285

			0.72676087]		
SVC	linear	0.9295718287 314926	r2: [0.664 0.67997952 0.77594264 0.75999616 0.73541888]	0.7230674391 743643	0.0157434940 33813477
	poly	0.9211684673 869548	r2: [0.664 0.63997696 0.76794059 0.67199475 0.67929561]	0.6846415820 836903	0.1298956871 0327148
	rbf	0.8919567827 130852	r2: [-0.112 0.04793907 - 0.05627041 0.0559849 0.01383399]	- 0.0101024898 54037078	0.8501145839 691162
SVR	linear	0.5173531813 57521	r2: [0.43113634 0.43754391 0.47957509 0.52916761 0.47007231]	0.4694990537 855683	0.0135142803 19213867
	poly	0.8373490456 355703	r2: [0.8128313 0.7818608 0.82083026 0.82747687 0.81741196]	0.8120822381 083886	0.1526551246 6430664
	rbf	- 0.0120471497 44953023	r2: [- 0.00902752 - 0.01354 - 0.00143056 - 0.02130689 - 0.00728011]	- 0.0105170136 41642814	0.1808793544 769287

Nystroem	linear	0.9267707082 833133	r2: [0.664 0.67997952 0.77594264 0.75999616 0.73541888]	0.7230674391 743643	0.1675586700 439453
	poly	0.7739095638 255302	r2: [0.664 0.63997696 0.76794059 0.67199475 0.67929561]	0.7110503464 557106	0.6729810237 884521
	rbf	0.5026010404 161665	r2: [-0.112 0.04793907 - 0.05627041 0.0559849 0.01383399]	- 0.0101024898 54037078	1.9959745407 104492
Decision Trees	Regression	0.7973093225 234453	r2: [0.80280485 0.79619226 0.83031905 0.81129357 0.8015902]	0.8084399862 03505	0.0211586952 20947266

Decision Trees	Classification	0.9331732693 07723	r2: [0.672 0.68798003 0.75993854 0.79199667 0.73541888]	0.7294668245 727879	0.0100448131 5612793
	Classification entropy	0.9331732693 07723	r2: [0.672 0.68798003 0.77594264 0.79199667 0.73541888]	0.7326676439 825568	0.0098295211 79199219

Random Forest	Regression	0.8347003498 379306	r2: [0.84668132 0.81888612 0.85988378 0.86046315 0.83306976]	0.8437968261 410418	0.1360030174 255371
Random Forest	Classification	0.9531812725 090036	r2: [0.584 0.61597542 0.7039242 0.68799501 0.71136605]	0.6606521362 820655	0.2874407768 2495117
Logistic Regression	PCA	0.9519992319 877117	r2: [0.864 0.87999232 0.92798156 0.95199923 0.89577107]	0.9039488374 223179	0.0123882293 70117188
Random Forest	Kernel PCA	0.9463785514 205683	r2: [0.32 0.30395545 0.51987709 0.44799117 0.39066165]	0.3964970726 388923	0.4568672180 1757810.9864
Random Forest	TSNE	0.9635854341 736695	r2: [0.608 0.63197645 0.68792011 0.63999424 0.65524278]	0.6446267143 344332	0.3213977813 720703

Univariate Polynomia I Regression	0.8860	0.8859	0.8841	0.8812	0.8765	0.8700	0.8620
Degree 4- 10							
Bivariate Polynomia I Regressio n Degree 4- 10	0.9862	0.9846	0.9776	0.9610	0.9344	0.9001	0.8611

The best classifier is Bivariate Polynomial Regression with Degree 3, and at the other end , is SVC with radial basis function and Nystroem kernel aproximation . Behind first classifier is Bivariate Polynomial Regression with Degree 2, and better than the last is SVR with linear .