```
In [12]: import pandas as pd import numpy as np import matplotlib.pyplot as plt import seaborn as sns
```

In [13]: data=pd.read\_excel('ToyotaCorolla.xlsx', sheet\_name='Data')

In [14]: data.head()

Out[14]:

	ld	Model	Price	Age_08_04	Mfg_Month	Mfg_Year	KM	Fuel_Type	HP	Met_Color		Powered_Windows	Power_Steering	Radio	Mistlamps	Sį
_	<b>0</b> 1	TOYOTA Corolla 2.0 D4D HATCHB TERRA 2/3- Doors	13500	23	10	2002	46986	Diesel	90	1		1	1	0	0	_
	<b>1</b> 2	TOYOTA Corolla 2.0 D4D HATCHB TERRA 2/3- Doors	13750	23	10	2002	72937	Diesel	90	1	•••	0	1	0	0	
	<b>2</b> 3	TOYOTA Corolla 2.0 D4D HATCHB TERRA 2/3- Doors	13950	24	9	2002	41711	Diesel	90	1		0	1	0	0	
	<b>3</b> 4	TOYOTA Corolla 2.0 D4D HATCHB TERRA 2/3- Doors	14950	26	7	2002	48000	Diesel	90	0		0	1	0	0	
	<b>4</b> 5	TOYOTA Corolla 2.0 D4D HATCHB SOL 2/3- Doors	13750	30	3	2002	38500	Diesel	90	0		1	1	0	1	
5	5 rows × 39 columns															
4																<b>D</b>

In [15]: data.shape

Out[15]: (1436, 39)

In [16]: data.dtypes

Out[16]: Id

int64 object int64 int64 Model Price Age\_08\_04 Mfg\_Month int64 Mfg\_Year KM int64 int64 object Fuel\_Type int64 ΗP Met\_Color int64 object Color Automatic int64  $\mathsf{CC}$ int64 Doors int64 Cylinders int64 Gears int64 Quarterly\_Tax int64 Weight int64 Mfr\_Guarantee int64 BOVAG\_Guarantee int64  ${\tt Guarantee\_Period}$ int64 int64 Airbag\_1 int64 Airbag\_2 int64 Airco int64 Automatic\_airco int64 Boardcomputer int64 CD Player int64 Central\_Lock int64 Powered\_Windows int64 Power\_Steering Radio int64 int64 int64 Mistlamps Sport\_Model
Backseat\_Divider int64 int64 Metallic\_Rim
Radio\_cassette
Parking\_Assistant int64 int64 int64 Tow\_Bar dtype: object int64

```
In [17]: data.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 1436 entries, 0 to 1435
         Data columns (total 39 columns):
          #
               Column
                                   Non-Null Count
                                                   Dtype
          a
               Td
                                   1436 non-null
                                                    int64
          1
               Mode1
                                   1436 non-null
                                                    object
          2
               Price
                                   1436 non-null
                                                    int64
          3
               Age_08_04
                                   1436 non-null
                                                    int64
          4
               Mfg_Month
                                   1436 non-null
                                                    int64
          5
               Mfg_Year
                                   1436 non-null
                                                    int64
          6
               ΚM
                                   1436 non-null
                                                    int64
           7
               Fuel_Type
                                   1436 non-null
                                                    object
          8
                                   1436 non-null
                                                    int64
          9
               Met Color
                                   1436 non-null
                                                    int64
          10
               Color
                                   1436 non-null
                                                    object
           11
               Automatic
                                   1436 non-null
                                                    int64
           12
               CC
                                   1436 non-null
                                                    int64
           13
               Doors
                                   1436 non-null
                                                    int64
               Cylinders
           14
                                   1436 non-null
                                                    int64
           15
                                   1436 non-null
                                                    int64
                                   1436 non-null
           16
               Quarterly_Tax
                                                    int64
           17
                                   1436 non-null
               Weight
                                                    int64
           18
               Mfr_Guarantee
                                   1436 non-null
           19
               BOVAG_Guarantee
                                   1436 non-null
                                                    int64
           20
               Guarantee_Period
                                   1436 non-null
                                                    int64
           21
                                   1436 non-null
                                                    int64
           22
               Airbag_1
                                   1436 non-null
                                                    int64
           23
               Airbag 2
                                   1436 non-null
                                                    int64
           24
                                   1436 non-null
                                                    int64
              Airco
           25
                                   1436 non-null
               Automatic airco
                                                    int64
               Boardcomputer
                                   1436 non-null
           26
                                                    int64
           27
               CD Plaver
                                   1436 non-null
                                                    int64
           28
               Central Lock
                                   1436 non-null
                                                    int64
           29
               Powered Windows
                                   1436 non-null
                                                    int64
               Power_Steering
                                   1436 non-null
           30
                                                    int64
               Radio
           31
                                   1436 non-null
                                                    int64
           32
              Mistlamps
                                   1436 non-null
                                                    int64
               Sport_Model
           33
                                   1436 non-null
                                                    int64
           34
               Backseat_Divider
                                   1436 non-null
                                                    int64
           35
               Metallic Rim
                                   1436 non-null
                                                    int64
           36
              Radio cassette
                                   1436 non-null
                                                    int64
           37
              Parking_Assistant
                                  1436 non-null
                                                    int64
          38 Tow Bar
                                   1436 non-null
                                                   int64
          dtypes: int64(36), object(3)
          memory usage: 437.7+ KB
In [ ]:
In [20]: | newdata=data.drop('Model',axis=1)
          newdata.head()
Out[20]:
             Id Price Age_08_04 Mfg_Month Mfg_Year
                                                      KM Fuel_Type HP Met_Color Color ... Powered_Windows Power_Steering Radio Mistlamps Spor
             1
                13500
                             23
                                       10
                                               2002 46986
                                                              Diesel
                                                                    90
                                                                                   Blue
                                                                                                                             n
                                                                                                                                      0
             2 13750
                             23
                                       10
                                                                                                        0
                                                                                                                             0
                                                                                                                                      0
                                               2002 72937
                                                                    90
                                                                               1
                                                                                 Silver
                                                              Diesel
                13950
                             24
                                        9
                                               2002
                                                    41711
                                                                    90
                                                                                   Blue
                                                                                                        0
                                                                                                                             0
                                                                                                                                      0
                                         7
                                                                                                        0
                                                                                                                             0
                                                                                                                                      0
             4 14950
                             26
                                               2002 48000
                                                                    90
                                                                               0
                                                                                 Black
                                                                                                                       1
                                                              Diesel
            5 13750
                             30
                                               2002 38500
                                                                                 Black
          5 rows × 38 columns
In [21]: #applying categorical encoding for columnsfuel_type and color
In [23]: | newdata_encoded=pd.get_dummies(newdata,columns=['Fuel_Type','Color'],drop_first=True,dtype=int)
In [24]: newdata_encoded.shape
Out[24]: (1436, 47)
```

```
In [26]: newdata1=newdata_encoded.drop('Id',axis=1)
          newdata1.head()
Out[26]:
              Price Age_08_04 Mfg_Month Mfg_Year
                                                      KM HP
                                                               Met_Color Automatic
                                                                                     CC Doors ... Fuel_Type_Petrol Color_Black Color_Blue Color_Green
           0 13500
                            23
                                       10
                                                    46986
                                                           90
                                                                                 0
                                                                                   2000
                                                                                                                 0
                                                                                                                             0
                                                                                                                                                    0
                                              2002
                           23
                                       10
                                                                                                                 n
                                                                                                                             n
                                                                                                                                        O
           1 13750
                                              2002 72937
                                                           90
                                                                                 0 2000
                                                                                             3
                                                                                                                                                    0
                            24
                                        9
                                                                                                                 0
                                                                                                                             0
                                                                                                                                                    0
           2 13950
                                              2002
                                                    41711
                                                           90
                                                                                 0
                                                                                   2000
                                                                                             3
             14950
                            26
                                              2002
                                                    48000
                                                           90
                                                                      0
                                                                                 0
                                                                                   2000
                                                                                                                 0
                                                                                                                                        0
                                                                                                                                                    0
                                                                                                                 0
                                                                                                                                        0
           4 13750
                            30
                                        3
                                              2002
                                                    38500
                                                                      0
                                                                                   2000
                                                           90
                                                                                 0
                                                                                             3
                                                                                                                                                    0
          5 rows × 46 columns
In [27]: # price is dependent variuable, target varible and others are independent and features variable for that we use PCA ...how to
In [34]: newdata1.shape
Out[34]: (1436, 46)
In [38]: target_df=pd.DataFrame(newdata1.iloc[:,0])
          #above commands separate target column into new data frame
          feature_df=newdata1.drop('Price',axis=1)
          #above commands remove first column and keeps all other columns
In [39]: target_df.head()
Out[39]:
              Price
           0 13500
           1 13750
           2 13950
           3 14950
           4 13750
In [40]: feature_df.head()
Out[40]:
              Age_08_04 Mfg_Month
                                                KM
                                                    HP
                                                        Met Color Automatic
                                                                              CC
                                                                                  Doors
                                                                                         Cylinders
                                                                                                      Fuel_Type_Petrol
                                                                                                                      Color Black
                                                                                                                                   Color Blue
           0
                     23
                                10
                                        2002
                                             46986
                                                    90
                                                                          0
                                                                            2000
                                                                                       3
                                                                                                 4
                                                                                                                    0
                                                                                                                                0
                     23
                                10
                                                    90
                                                                          0 2000
                                                                                       3
                                                                                                 4
                                                                                                                    0
                                                                                                                                0
                                                                                                                                           0
           1
                                        2002
                                             72937
                                                                1
                     24
                                 9
                                        2002
                                                                          0
                                                                            2000
                                                                                       3
                                                                                                 4
                                                                                                                    0
                                                                                                                                0
                     26
                                 7
                                                                0
                                        2002 48000
                                                    90
                                                                          0 2000
                                                                                       3
                                                                                                 4
                                                                                                                    0
                                                                                                                                           0
                                        2002 38500
                                                                          0 2000
          5 rows × 45 columns
In [41]:
          #applying scaling to ALL COLUMNS
          #for presence of outliers use standard scaling other wise
          #use min max scaling
          from sklearn.preprocessing import StandardScaler
In [44]: scaler=StandardScaler()
          scaler.fit(feature_df)
Out[44]: StandardScaler()
In [48]: |scaler_df=scaler.transform(feature_df)
          final_df=pd.DataFrame(scaler_df,columns=feature_df.columns)
          final_df.head()
Out[48]:
              Age_08_04 Mfg_Month
                                    Mfg_Year
                                                   KM
                                                             HP
                                                                Met_Color Automatic
                                                                                          CC
                                                                                                 Doors Cylinders ... Fuel_Type_Petrol Color_Black Color
                                                                                                                                                   2.0
           0
                                                                  0.694219
               -1.771966
                           1.327576
                                    1.541796
                                             -0.574695
                                                       -0.768042
                                                                            -0.242893
                                                                                     0.997419
                                                                                              -1.085139
                                                                                                              0.0
                                                                                                                            -2.710874
                                                                                                                                        -0.391681
               -1.771966
                           1.327576
                                    1.541796
                                              0.117454
                                                       -0.768042
                                                                  0.694219
                                                                            -0.242893
                                                                                     0.997419
                                                                                              -1.085139
                                                                                                              0.0 ...
                                                                                                                            -2.710874
                                                                                                                                        -0.391681
                                                                                                                                                   -0.49
               -1.718184
                           1.029329
                                    1.541796
                                             -0.715386
                                                       -0.768042
                                                                  0.694219
                                                                            -0.242893 0.997419 -1.085139
                                                                                                              0.0 ...
                                                                                                                            -2.710874
                                                                                                                                        -0.391681
                                                                                                                                                   2.0
               -1.610620
                                    1.541796 -0.547650 -0.768042
                                                                 -1.440467
                                                                            -0.242893 0.997419 -1.085139
                                                                                                              0.0 ...
                                                                                                                            -2.710874
                                                                                                                                        2.553101
                                                                                                                                                   -0.4
                           0.432833
                                                                                                              0.0 ...
                          -0.760158
                                    1.541796 -0.801028 -0.768042
                                                                 -1.440467
                                                                            -0.242893 0.997419 -1.085139
                                                                                                                            -2.710874
                                                                                                                                        2.553101
                                                                                                                                                   -0.49
          5 rows × 45 columns
```

```
In [ ]: #applying princial component analysis on this dataframe
In [50]: from sklearn.decomposition import PCA
           pca=PCA(n_components=0.95,random_state=5)
In [51]: pca.fit(final_df)
Out[51]: PCA(n_components=0.95, random_state=5)
In [52]: feature_pca=pca.transform(final_df)
           feature_pca.shape
Out[52]: (1436, 32)
In [53]: pca_df=pd.DataFrame(feature_pca)
           pca_df.head()
Out[53]:
                                                                                                          1.220118
            0 2.797736 4.848568
                                  0.343319
                                            -0.727748
                                                       -0.141659
                                                                 -0.388216
                                                                           -1.339298
                                                                                     -1.458137
                                                                                                0.297432
                                                                                                                        0.042180
                                                                                                                                 -0.039088
                                                                                                                                           -1.182932
                                                                                                                                                      -1.191405
            1 3.222340 5.160836
                                  0.882364 -1.161806
                                                       -0.323688
                                                                 0.047251 -1.057623 -0.742248
                                                                                               -1.042610 0.963418
                                                                                                                        0.766375
                                                                                                                                  1.445599
                                                                                                                                           -1.445530
                                                                                                                                                      -0.389533
               2.111314 5.011514
                                  -0.582138
                                            -2.319647
                                                       -0.390371
                                                                 -0.702172
                                                                           -1.436148
                                                                                     -0.391840
                                                                                                0.345422
                                                                                                          1.848586
                                                                                                                       -0.973201
                                                                                                                                 -0.387814
                                                                                                                                                      -1.539763
              1.950404 5.083516 -0.839480 -1.781638
                                                       0.296364 -1.715682 -0.847632 0.705913 -0.836044 0.647460 ...
                                                                                                                       -0.518379 -0.552121 -0.722059 -2.172290
            4 3.794326 4.287844 0.137677 0.859629
                                                       0.696811 -1.076015 -0.457588
                                                                                     0.507594 -1.316836 0.371489 ... -0.104411 -1.180035 -0.311513 -2.369693
           5 rows × 32 columns
In [54]: pca_table=pd.DataFrame(pca.components_.T,index=final_df.columns)
In [55]: pca_table
Out[55]:
                               -3.404190e-
                                           -2.115058e-
                                                       -1.582002e-
                                                                   2.550518e-
                                                                               1.823454e-
                                                                                           1.220895e-
                                                                                                       8.599873e-
                                                                                                                             6.103597e-
                                                                                                                                         -2.356409e-
                                                                                                                                                        2.815
                   Age_08_04
                                                                                                                   0.067060
                                                                                                                             -3.241562e-
                                1.588516e-
                                           2.527798e-
                                                       -1.078668e-
                                                                   -1.154071e-
                                                                               -4.503892e-
                                                                                          -1.160742e-
                                                                                                      -6.318007e
                                                                                                                                         2.502723e
                                                                                                                                                        -6.4532
                   Mfg_Month
                                                                                                                   -0.167967
                                                   02
                                                                                                                                                01
                                                                                      02
                                                                                                  01
                                            1.669218e
                                                        1.591723e-
                                                                               -1.017368e
                                                                                                       2.810035e-
03
                                                                                                                                         -2.169669e
                                                                   -2.544939e
                                                                                           -1.017673e
                                                                                                                  -0.036992
                     Mfg_Year
                                           2.504879e
                                                       -9.851922e
                                                                   2.685095e
                                                                                                                   -0.058246
                                       01
                                                   01
                                                               02
                                                                           01
                                                                                      02
                                                                                                  02
                                                                                                              02
                                                                                                                                    02
                                                                                                                                                03
                                1.154640e-
                                                       1.077846e-
                                           -2.900713e
                                                                   7.490710e-
                          HP
                                                                                                                   0.166084
                                       01
                                                   01
                                                               01
                                                                           02
                                                                                      03
                                                                                                  02
                                                                                                              01
                                                                                                                                    01
                                                                                                                                                02
                               7.980948e-
                                           -3.676033e-
                                                       7.093389e-
                                                                               -1.818924e-
                                                                                           2.781066e-
                                                                                                                             -3.040390e-
                                                                                                                                         1.522320e-
                                                                   2.689544e-
                                                                                                       -4.229378e-
                                                                                                                                                        -1.1379
                    Met Color
                                                                                                                   0.160382
                                                   02
                                                               02
                                                                           02
                                                                                      01
                                                                                                   01
                                                                                                                                     02
                                                                                                                                                01
                               -6.056964e-
                                           -3.333030e-
                                                       8.204808e-
                                                                  -5.132102e-
                                                                               1.128064e-
                                                                                           1.554104e-
                                                                                                                             4.312673e-
                                                                                                                                         1.206380e-
                                                                                                                                                        -3.3968
                                                                                                       9.197235e-
                    Automatic
                                                                                                                   0.133317
In [56]: feature_mean=feature_df.mean()
           feature_std=feature_df.std()
           Z=(feature_df-feature_mean)/feature_std
In [57]: C=Z.cov()
In [58]: sns.heatmap(C,cmap='Pastel1')
           plt.title('Heatmap for all feature columns')
           plt.show()
                                 Heatmap for all feature columns
                                                                          - 1.00
                  Age_08_04
                        KM
                                                                          - 0.75
                   Automatic
                   Cylinders
                                                                          - 0.50
                     Weight
             Guarantee Period
                                                                          -025
                    Airbag_2
              Boardcomputer
                                                                          - 0.00
             Powered_Windows
                  Mistlamps
                                                                           -0.25
                 Metallic Rim
                    Tow_Bar
                                                                          -0.50
                  Color Black
                  Color_Grey
                                                                           -0.75
                 Color Violet
```

```
In [59]: print('The selected variables are: \n',pca.explained_variance_ratio_)
         The selected variables are:
          [0.12722256 0.0866339 0.06910537 0.05533474 0.04644602 0.03651697
          0.03262553 0.030516 0.0295579 0.02901791 0.02718674 0.02633937
          0.02165934 0.01980327 0.01940082 0.01877815 0.01697536 0.01618503
          0.01579723 0.01527302 0.01389044 0.01349731 0.0120324 0.01130805
          0.01073508 0.01003409]
In [60]: variable_list=pca.explained_variance_ratio_
         print(variable_list)
         [0.12722256 0.0866339 0.06910537 0.05533474 0.04644602 0.03651697
          0.03262553 0.030516 0.0295579 0.02901791 0.02718674 0.02633937 0.025785 0.0248257 0.02374919 0.02322952 0.02272153 0.02206638
          0.02165934 0.01980327 0.01940082 0.01877815 0.01697536 0.01618503
          0.01579723 0.01527302 0.01389044 0.01349731 0.0120324 0.01130805
          0.01073508 0.01003409]
In [61]: total_variation=variable_list.sum()
In [62]: print('The total variation=',total_variation)
         The total variation= 0.9542499514462021
In [ ]:
           #conclusion
            #original 45 features were reducted to 32 features
             #this presents data reduction technique
             #these 32 features represents around 95% of data variation
             #PCA reduced 45 features to 32 features
             #these 32 features explains about 95% of data
```