1. Read the Data

```
import pandas as pd
In [1]:
          import numpy as np
          train=pd.read_csv("C:/Users/ASUS/Downloads/training_set.csv")
In [2]:
         train
                                                                                                      Utilities ... PoolArea PoolQC
Out[2]:
                  Id MSSubClass
                                  MSZoning
                                            LotFrontage LotArea Street Alley LotShape LandContour
                                                                                                                                    Fence
             0
                  1
                              60
                                         RL
                                                    65.0
                                                                                                       AllPub ...
                                                                                                                         0
                                                            8450
                                                                   Pave
                                                                         NaN
                                                                                    Reg
                                                                                                  LvI
                                                                                                                              NaN
                                                                                                                                     NaN
                  2
                              20
                                         RL
                                                    80.0
                                                            9600
                                                                   Pave
                                                                         NaN
                                                                                    Reg
                                                                                                       AllPub
                                                                                                                         0
                                                                                                                               NaN
                                                                                                                                      NaN
             2
                  3
                              60
                                         RL
                                                    68.0
                                                           11250
                                                                                    IR1
                                                                                                       AllPub ...
                                                                                                                         0
                                                                   Pave
                                                                         NaN
                                                                                                  LvI
                                                                                                                              NaN
                                                                                                                                      NaN
                                                                                                       AllPub ...
                  4
                              70
                                        RI
                                                                                    IR1
             3
                                                    60.0
                                                            9550
                                                                   Pave
                                                                         NaN
                                                                                                  LvI
                                                                                                                         0
                                                                                                                              NaN
                                                                                                                                      NaN
             4
                  5
                              60
                                         RL
                                                    84.0
                                                           14260
                                                                   Pave
                                                                         NaN
                                                                                    IR1
                                                                                                       AllPub ...
                                                                                                                         0
                                                                                                                               NaN
                                                                                                                                      NaN
                                                                                                       AllPub ...
          1455 1456
                              60
                                         RL
                                                            7917
                                                                                                                         0
                                                    62.0
                                                                   Pave
                                                                         NaN
                                                                                    Reg
                                                                                                  LvI
                                                                                                                              NaN
                                                                                                                                     NaN
          1456 1457
                              20
                                         RL
                                                    85.0
                                                           13175
                                                                   Pave
                                                                         NaN
                                                                                                       AllPub ...
                                                                                                                         0
                                                                                                                               NaN
                                                                                                                                    MnPrv
                                                                                    Reg
                              70
                                         RL
                                                    66.0
                                                                                                       AllPub ...
                                                                                                                         0
                                                                                                                                    GdPrv
          1457 1458
                                                            9042
                                                                   Pave
                                                                         NaN
                                                                                    Reg
                                                                                                  LvI
                                                                                                                              NaN
                                         RI
          1458 1459
                              20
                                                    68.0
                                                            9717
                                                                   Pave
                                                                         NaN
                                                                                    Reg
                                                                                                  I vI
                                                                                                       AllPub ...
                                                                                                                         0
                                                                                                                              NaN
                                                                                                                                      NaN
          1459 1460
                              20
                                         RL
                                                    75.0
                                                            9937
                                                                   Pave
                                                                                                       AllPub ...
                                                                                                                         0
                                                                                                                               NaN
                                                                                                                                      NaN
                                                                         NaN
                                                                                    Reg
         1460 rows × 81 columns
In [3]: train.head()
Out[3]:
            Id MSSubClass
                            MSZoning LotFrontage
                                                   LotArea
                                                            Street Alley LotShape LandContour
                                                                                                 Utilities ... PoolArea
                                                                                                                     PoolQC
                                                                                                                              Fence
                                                                                                                                     MiscFeat
                                                                                                  AllPub
          0
             1
                         60
                                   RL
                                              65.0
                                                      8450
                                                             Pave
                                                                    NaN
                                                                              Reg
                                                                                                                   0
                                                                                                                         NaN
                                                                                                                                NaN
          1
             2
                         20
                                   RL
                                              80.0
                                                       9600
                                                             Pave
                                                                    NaN
                                                                              Reg
                                                                                            Lvl
                                                                                                  AllPub
                                                                                                                   0
                                                                                                                         NaN
                                                                                                                                NaN
          2
             3
                         60
                                   RL
                                              68.0
                                                      11250
                                                             Pave
                                                                    NaN
                                                                               IR1
                                                                                            LvI
                                                                                                  AllPub
                                                                                                                   0
                                                                                                                         NaN
                                                                                                                                NaN
          3
             4
                         70
                                   RI
                                              60.0
                                                      9550
                                                             Pave
                                                                    NaN
                                                                               IR1
                                                                                            LvI
                                                                                                  AllPub
                                                                                                                   0
                                                                                                                         NaN
                                                                                                                                NaN
          4
             5
                         60
                                   RL
                                              84.0
                                                      14260
                                                             Pave
                                                                    NaN
                                                                               IR1
                                                                                             Lvl
                                                                                                  AllPub
                                                                                                                   0
                                                                                                                         NaN
                                                                                                                                NaN
         5 rows × 81 columns
           1. Missing Data treatment
          from preprocesser import replacer
In [4]:
          replacer(train)
In [5]: train.isna().sum()
          Ιd
                              0
Out[5]:
          MSSubClass
                              0
          MSZoning
                              0
          LotFrontage
                              0
          LotArea
                              0
          MoSold
                              0
          YrSold
                              0
                             0
          SaleType
          {\sf SaleCondition}
                             0
          SalePrice
                             0
          Length: 81, dtype: int64
In [6]:
          cat=[]
          con=[]
          for i in train.columns:
              if train[i].dtypes=="object":
                   cat.append(i)
              else:
                   con.append(i)
In [7]: cat
```

```
['MSZoning',
Out[7]:
           'Street',
          'Alley',
          'LotShape',
           'LandContour',
           'Utilities',
          'LotConfig',
           'LandSlope',
           'Neighborhood',
           'Condition1',
           'Condition2',
           'BldgType',
           'HouseStyle',
           'RoofStyle',
          'RoofMatl',
           'Exterior1st',
          'Exterior2nd',
          'MasVnrType',
           'ExterQual',
           'ExterCond'
          'Foundation',
          'BsmtQual',
'BsmtCond',
          'BsmtExposure',
           'BsmtFinType1',
           'BsmtFinType2',
           'Heating'
           'HeatingQC'
          'CentralAir',
          'Electrical',
'KitchenQual',
          'Functional',
           'FireplaceQu',
           'GarageType'
          'GarageFinish',
           'GarageQual',
'GarageCond',
           'PavedDrive',
           'PoolQC',
          'Fence',
          'MiscFeature',
           'SaleType',
          'SaleCondition']
         5.1 Standardization of con columns
In [8]:
         con
         ['Id',
Out[8]:
           'MSSubClass',
```

```
'LotFrontage',
          'LotArea',
           'OverallQual',
           'OverallCond'
           'YearBuilt',
           'YearRemodAdd',
           'MasVnrArea',
           'BsmtFinSF1',
           'BsmtFinSF2',
           'BsmtUnfSF'
           'TotalBsmtSF',
          '1stFlrSF',
          'LowQualFinSF',
           'GrLivArea',
           'BsmtFullBath',
           'BsmtHalfBath',
          'FullBath',
'HalfBath',
           'BedroomAbvGr',
'KitchenAbvGr',
           'TotRmsAbvGrd',
           'Fireplaces',
'GarageYrBlt',
           'GarageCars',
           'GarageArea',
           'WoodDeckSF'
           'OpenPorchSF'
           'EnclosedPorch',
           '3SsnPorch'
           'ScreenPorch',
           'PoolArea',
           'MiscVal',
           'MoSold',
           'YrSold',
           'SalePrice']
In [9]: Y=train[["SalePrice"]]
```

X=train.drop(labels=["SalePrice"],axis=1)

1. Drop unnecessary columns (Columns with no statitical importance)

In [10]: Unwanted_cols=X=train.drop(labels=["Id","MSZoning","LotFrontage","Alley","LandSlope","YearBuilt","YearRemodAdd"

In [11]: Unwanted_cols

:	MSSubClass	LotArea	Street	LotShape	LandContour	Utilities	LotConfig	Neighborhood	Condition1	Condition2	 OpenPorchSF P	,
0	60	8450	Pave	Reg	LvI	AllPub	Inside	CollgCr	Norm	Norm	 61	
1	20	9600	Pave	Reg	LvI	AllPub	FR2	Veenker	Feedr	Norm	 0	
2	60	11250	Pave	IR1	LvI	AllPub	Inside	CollgCr	Norm	Norm	 42	
3	70	9550	Pave	IR1	LvI	AllPub	Corner	Crawfor	Norm	Norm	 35	
4	60	14260	Pave	IR1	LvI	AllPub	FR2	NoRidge	Norm	Norm	 84	
1455	60	7917	Pave	Reg	LvI	AllPub	Inside	Gilbert	Norm	Norm	 40	
1456	20	13175	Pave	Reg	LvI	AllPub	Inside	NWAmes	Norm	Norm	 0	
1457	70	9042	Pave	Reg	LvI	AllPub	Inside	Crawfor	Norm	Norm	 60	
1458	20	9717	Pave	Reg	LvI	AllPub	Inside	NAmes	Norm	Norm	 0	
1459	20	9937	Pave	Reg	Lvl	AllPub	Inside	Edwards	Norm	Norm	 68	

1460 rows × 50 columns

In [12]: numeric_cols=Unwanted_cols.select_dtypes(include=['int','float']).columns
a=Unwanted_cols[numeric_cols]

1. Exploratory Data Analysis

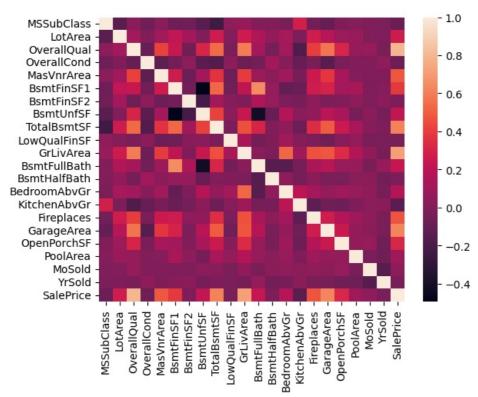
4.1 Correlation

In [13]: corrlation_matrix=a.corr()

In [14]: import seaborn as sns

In [15]: sns.heatmap(corrlation matrix)

Out[15]: <Axes: >



4.2 Check for Skew in X columns

In [16]: a.skew().sort_values()>0.7

```
GarageArea
          BedroomAbvGr
                             False
          MoSold
                             False
          OverallOual
                             False
          BsmtFullBath
                             False
          Fireplaces
                             False
          OverallCond
                             False
          BsmtUnfSF
                              True
          GrLivArea
                              True
          MSSubClass
                              True
          TotalBsmtSF
                              True
          BsmtFinSF1
                              True
          SalePrice
                              True
          OpenPorchSF
                              True
          MasVnrArea
                              True
          BsmtHalfBath
                              True
          BsmtFinSF2
                              True
          KitchenAbvGr
                              True
          LowQualFinSF
                              True
          LotArea
                              True
          PoolArea
                              True
          dtype: bool
          4.3 Remove skew
          skew_new=a.drop(labels=["BsmtUnfSF","GrLivArea","MSSubClass","TotalBsmtSF","BsmtFinSF1","SalePrice","OpenPorchS
In [17]:
           from preprocesser import data prep
In [18]:
          Xnew=data_prep(X)
In [19]:
          from sklearn.preprocessing import StandardScaler
           ss=StandardScaler()
           ss.fit_transform(Xnew)
          array([[ 0.07337496, -0.20714171, 0.65147924, ..., -0.11785113,
Out[19]:
                     0.4676514 , -0.30599503],
                   [-0.87256276, -0.09188637, -0.07183611, \ldots, -0.11785113,
                     0.4676514 , -0.30599503],
                   [ 0.07337496, 0.07347998,
                                                   0.65147924, ..., -0.11785113,
                     0.4676514 , -0.30599503],
                   [ 0.30985939, -0.14781027,
                                                   0.65147924, ..., -0.11785113,
                     0.4676514 , -0.30599503],
                   [-0.87256276, -0.08016039, -0.79515147, \ldots, -0.11785113,
                   0.4676514 , -0.30599503],
[-0.87256276, -0.05811155, -0.79515147, ..., -0.11785113,
                     0.4676514 , -0.30599503]])
In [20]: import pandas as pd
           pd.DataFrame(ss.fit transform(Xnew))
                                                                        5
                                                                                  6
                                                                                           7
                                                                                                               9 ...
                                 1
                                           2
                                                     3
                                                              4
                                                                                                     8
                                                                                                                          171
                                                                                                                                    172
                       0
                         -0.207142
                                    0.651479
                                             -0.517200
                                                        0.511418
                                                                 0.575425
                                                                          -0.288653 -0.944591
                                                                                             -0.459303
                                                                                                        -0.120242 ... -0.058621
              1 -0.872563 -0.091886 -0.071836
                                              2.179628
                                                       -0.574410
                                                                 1.171992 -0.288653 -0.641228
                                                                                               0.466465
                                                                                                        -0.120242 ... -0.058621
                                                                                                                               -0.301962
                                                                                                                                        -0.0
              2
                0.073375
                           0.073480
                                    0.651479
                                             -0.517200
                                                        0.323060
                                                                 0.092907
                                                                           -0.288653 -0.301643
                                                                                              -0.313369
                                                                                                        -0.120242 ... -0.058621
                                                                                                                               -0.301962
                                                                                                                                        -0.0
                 0.309859
                          -0.096897
                                    0.651479 -0.517200
                                                       -0.574410 -0.499274
                                                                          -0.288653 -0.061670
                                                                                              -0.687324
                                                                                                        -0.120242 ... -0.058621
                                                                                                                               -0.301962
                                                                 0.463568 -0.288653 -0.174865
                                                                                               0.199680 -0.120242 ... -0.058621 -0.301962 -0.0
              4
                0.073375
                          0.375148
                                    1.374795 -0.517200
                                                        1.364570
           1455
                 0.073375
                         -0.260560 -0.071836
                                             -0.517200
                                                       -0.574410
                                                                -0.973018
                                                                          -0.288653
                                                                                     0.873321
                                                                                              -0.238122 -0.120242 ... -0.058621
                                                                                                                               -0.301962
                                                                 0.759659
                                                                                     0.049262
                                                                                               1.104925 -0.120242 ... -0.058621
          1456
               -0.872563
                          0.266407 -0.071836
                                              0.381743
                                                        0.084843
                                                                           0.722112
                                                                                                                              -0.301962 -0.0
           1457
                 0.309859
                         -0.147810
                                    0.651479
                                              3.078570
                                                       -0.574410 -0.369871
                                                                           -0.288653
                                                                                     0.701265
                                                                                               0.215641 \quad \hbox{-} 0.120242 \quad ... \quad \hbox{-} 0.058621
                                                                                                                               -0.301962
                                                                                                                                        -0.0
               -0.872563
                         -0.080160 -0.795151
                                              0.381743 -0.574410 -0.865548
                                                                           6.092188 -1.284176
                                                                                               0.046905 -0.120242 ... -0.058621
                                                                                                                               -0.301962 -0.0
          1459 -0.872563 -0.058112 -0.795151 0.381743 -0.574410 0.847389
                                                                           1.509640 -0.976285
                                                                                               0.452784 -0.120242 ... -0.058621 -0.301962 -0.0
          1460 rows × 181 columns
          OHE of categorical columns
```

YrSold

Out[16]:

False

False

In [21]: pd.get_dummies(X,dtype='int')

Out[21]:		MSSubClass	LotArea	OverallQual	OverallCond	MasVnrArea	BsmtFinSF1	BsmtFinSF2	BsmtUnfSF	TotalBsmtSF	LowQualFinSF	
	0	60	8450	7	5	196.0	706	0	150	856	0	
	1	20	9600	6	8	0.0	978	0	284	1262	0	
	2	60	11250	7	5	162.0	486	0	434	920	0	
	3	70	9550	7	5	0.0	216	0	540	756	0	
	4	60	14260	8	5	350.0	655	0	490	1145	0	
	1455	60	7917	6	5	0.0	0	0	953	953	0	
	1456	20	13175	6	6	119.0	790	163	589	1542	0	
	1457	70	9042	7	9	0.0	275	0	877	1152	0	
	1458	20	9717	5	6	0.0	49	1029	0	1078	0	
	1459	20	9937	5	6	0.0	830	290	136	1256	0	

1460 rows × 181 columns

1. Preprocessing

1. Divide data in training & testing set(Random state: 31)0.8,0.2

In [22]: from sklearn.model_selection import train_test_split
xtrain,xtest,ytrain,ytest=train_test_split(Xnew,Y,test_size=0.2,random_state=21)

1. Create a backward elemination OLS model

Out[23]: OLS Regression Results

Dep. Variable: SalePrice R-squared: 1.000 OLS Model: Adj. R-squared: 1.000 Method: Least Squares F-statistic: 3.430e+29 **Date:** Tue, 26 Mar 2024 Prob (F-statistic): 0.00 16:58:05 Log-Likelihood: Time: 23774. No. Observations: 1168 AIC: -4.725e+04 Df Residuals: 1017 BIC: -4.648e+04 Df Model: 150

Covariance Type: nonrobust

	coef	std err	t	P> t	[0.025	0.975]
const	2.398e+04	5.8e-11	4.13e+14	0.000	2.4e+04	2.4e+04
MSSubClass	5.093e-11	7.6e-11	0.671	0.503	-9.81e-11	2e-10
LotArea	-3.638e-12	1.46e-11	-0.250	0.803	-3.22e-11	2.5e-11
OverallQual	4.866e-11	2.41e-11	2.016	0.044	1.3e-12	9.6e-11
OverallCond	-4.729e-11	1.58e-11	-3.001	0.003	-7.82e-11	-1.64e-11
MasVnrArea	-3.82e-11	1.45e-11	-2.627	0.009	-6.67e-11	-9.66e-12
BsmtFinSF1	3.138e-11	1.55e-11	2.026	0.043	9.94e-13	6.18e-11
BsmtFinSF2	-2.547e-11	2.09e-11	-1.219	0.223	-6.65e-11	1.55e-11
BsmtUnfSF	6.048e-11	1.35e-11	4.475	0.000	3.4e-11	8.7e-11
TotalBsmtSF	5.366e-11	1.73e-11	3.104	0.002	1.97e-11	8.76e-11
LowQualFinSF	-5.002e-11	1.56e-11	-3.203	0.001	-8.07e-11	-1.94e-11
GrLivArea	-8.731e-11	3.51e-11	-2.485	0.013	-1.56e-10	-1.84e-11
BsmtFullBath	1.273e-11	1.81e-11	0.703	0.482	-2.28e-11	4.83e-11
BsmtHalfBath	-4.093e-12	1.3e-11	-0.316	0.752	-2.95e-11	2.13e-11
BedroomAbvGr	-2.183e-11	1.73e-11	-1.260	0.208	-5.58e-11	1.22e-11
KitchenAbvGr	-4.366e-11	2.03e-11	-2.153	0.032	-8.34e-11	-3.87e-12
Fireplaces	-8.185e-12	1.53e-11	-0.537	0.592	-3.81e-11	2.18e-11

GarageArea	6.253e-12	1.67e-11	0.374	0.709	-2.66e-11	3.91e-11
OpenPorchSF	-3.797e-11	1.34e-11	-2.827	0.005	-6.43e-11	-1.16e-11
PoolArea	-7.276e-12	1.71e-11	-0.425	0.671	-4.09e-11	2.63e-11
MoSold	2.728e-12	1.19e-11	0.228	0.819	-2.07e-11	2.62e-11
YrSold	1.592e-11	1.22e-11	1.306	0.192	-8.01e-12	3.98e-11
SalePrice	7.942e+04	3.45e-11	2.3e+15	0.000	7.94e+04	7.94e+04
Street_GrvI	1.199e+04	1.11e-10	1.08e+14	0.000	1.2e+04	1.2e+04
Street_Pave	1.199e+04	9.97e-11	1.2e+14	0.000	1.2e+04	1.2e+04
LotShape_IR1	5996.0775	4.56e-11	1.32e+14	0.000	5996.077	5996.077
LotShape_IR2	5996.0775	6.36e-11	9.43e+13	0.000	5996.077	5996.077
LotShape_IR3	5996.0775	1.16e-10	5.18e+13	0.000	5996.077	5996.077
LotShape_Reg	5996.0775	4.76e-11	1.26e+14	0.000	5996.077	5996.077
LandContour_Bnk	5996.0775	5.54e-11	1.08e+14	0.000	5996.077	5996.077
LandContour_HLS	5996.0775	5.8e-11	1.03e+14	0.000	5996.077	5996.077
LandContour_Low	5996.0775	6.89e-11	8.7e+13	0.000	5996.077	5996.077
LandContour_LvI	5996.0775	3.72e-11	1.61e+14	0.000	5996.077	5996.077
Utilities_AllPub	1.199e+04	2.03e-10	5.91e+13	0.000	1.2e+04	1.2e+04
Utilities_NoSeWa	1.199e+04	2.25e-10	5.33e+13	0.000	1.2e+04	1.2e+04
LotConfig_Corner	4796.8620	5e-11	9.6e+13	0.000	4796.862	4796.862
LotConfig_CulDSac	4796.8620	6.04e-11	7.94e+13	0.000	4796.862	4796.862
LotConfig_FR2	4796.8620	6.87e-11	6.98e+13	0.000	4796.862	4796.862
LotConfig_FR3	4796.8620	1.65e-10	2.91e+13	0.000	4796.862	4796.862
LotConfig_Inside	4796.8620	4.68e-11	1.02e+14	0.000	4796.862	4796.862
Neighborhood_Blmngtn	959.3724	1.12e-10	8.54e+12	0.000	959.372	959.372
Neighborhood_Blueste	959.3724	3.73e-10	2.57e+12	0.000	959.372	959.372
Neighborhood_BrDale	959.3724	1.28e-10	7.49e+12	0.000	959.372	959.372
Neighborhood_BrkSide	959.3724	7.58e-11	1.27e+13	0.000	959.372	959.372
Neighborhood_ClearCr	959.3724	9.15e-11	1.05e+13	0.000	959.372	959.372
Neighborhood_CollgCr	959.3724	4.93e-11	1.95e+13	0.000	959.372	959.372
Neighborhood_Crawfor	959.3724	7.67e-11	1.25e+13	0.000	959.372	959.372
Neighborhood_Edwards	959.3724	5.65e-11	1.7e+13	0.000	959.372	959.372
Neighborhood_Gilbert	959.3724	6.38e-11	1.5e+13	0.000	959.372	959.372
Neighborhood_IDOTRR	959.3724	8.62e-11	1.11e+13	0.000	959.372	959.372
Neighborhood_MeadowV	959.3724	1.32e-10	7.25e+12	0.000	959.372	959.372
Neighborhood_Mitchel	959.3724	6.97e-11	1.38e+13	0.000	959.372	959.372
Neighborhood_NAmes	959.3724	4.71e-11	2.04e+13	0.000	959.372	959.372
Neighborhood_NPkVill	959.3724	1.63e-10	5.89e+12	0.000	959.372	959.372
Neighborhood_NWAmes	959.3724	6.16e-11	1.56e+13	0.000	959.372	959.372
Neighborhood_NoRidge	959.3724	8.28e-11	1.16e+13	0.000	959.372	959.372
Neighborhood_NridgHt	959.3724	6.9e-11	1.39e+13	0.000	959.372	959.372
Neighborhood_OldTown	959.3724	6.33e-11	1.52e+13	0.000	959.372	959.372
Neighborhood_SWISU	959.3724	9.68e-11	9.91e+12	0.000	959.372	959.372
Neighborhood_Sawyer	959.3724	6.06e-11	1.58e+13	0.000	959.372	959.372
Neighborhood_SawyerW	959.3724	6.23e-11	1.54e+13	0.000	959.372	959.372
Neighborhood_Somerst	959.3724	6.02e-11	1.59e+13	0.000	959.372	959.372
Neighborhood_StoneBr	959.3724	1.03e-10	9.3e+12	0.000	959.372	959.372
Neighborhood_Timber	959.3724	7.95e-11	1.21e+13	0.000	959.372	959.372
Neighborhood_Veenker	959.3724	1.22e-10	7.86e+12	0.000	959.372	959.372
Condition1_Artery	2664.9233	8.26e-11	3.22e+13	0.000	2664.923	2664.923
Condition1_Feedr	2664.9233	6.58e-11	4.05e+13	0.000	2664.923	2664.923
Condition1_Norm	2664.9233	5.11e-11	5.21e+13	0.000	2664.923	2664.923
Condition1_PosA	2664.9233	1.52e-10	1.76e+13	0.000	2664.923	2664.923
Condition1_PosN	2664.9233	1.15e-10	2.33e+13	0.000	2664.923	2664.923
Condition1_RRAe	2664.9233	1.45e-10	1.84e+13	0.000	2664.923	2664.923

Condition1 RRAn	2664.9233	1.03e-10	2.59e+13	0.000	2664.923	2664.923
Condition1 RRNe	2664.9233	2.49e-10	1.07e+13	0.000	2664.923	2664.923
Condition1 RRNn	2664.9233	1.73e-10	1.54e+13	0.000	2664.923	2664.923
Condition2 Artery	2998.0387	3.08e-10	9.73e+12	0.000	2998.039	2998.039
Condition2 Feedr	2998.0387	2.19e-10	1.37e+13	0.000	2998.039	2998.039
Condition2 Norm	2998.0387	1.42e-10	2.11e+13	0.000	2998.039	2998.039
Condition2 PosA	2998.0387	5.22e-10	5.74e+12	0.000	2998.039	2998.039
Condition2 PosN	2998.0387	3.79e-10	7.9e+12	0.000	2998.039	2998.039
Condition2 RRAe	2998.0387	5.05e-10	5.94e+12	0.000	2998.039	2998.039
Condition2 RRAn	2998.0387	3.68e-10	8.14e+12	0.000	2998.039	2998.039
Condition2 RRNn	2998.0387	3.76e-10	7.97e+12	0.000	2998.039	2998.039
BldgType_1Fam	4796.8620	1.4e-10	3.43e+13	0.000	4796.862	4796.862
BldgType 2fmCon	4796.8620	1.37e-10	3.5e+13	0.000	4796.862	4796.862
BldgType_Duplex	4796.8620	9.68e-11	4.96e+13	0.000	4796.862	4796.862
BldgType_Twnhs	4796.8620	9.01e-11	5.32e+13	0.000	4796.862	4796.862
BldgType TwnhsE	4796.8620	7.28e-11	6.59e+13	0.000	4796.862	4796.862
HouseStyle_1.5Fin	2998.0387	5.26e-11	5.7e+13	0.000	2998.039	2998.039
HouseStyle_1.5Unf	2998.0387	1.14e-10	2.63e+13	0.000	2998.039	2998.039
HouseStyle 1Story	2998.0387	7.61e-11	3.94e+13	0.000	2998.039	2998.039
HouseStyle_2.5Fin	2998.0387	1.9e-10	1.58e+13	0.000	2998.039	2998.039
HouseStyle 2.5Unf	2998.0387	1.32e-10	2.26e+13	0.000	2998.039	2998.039
HouseStyle_2Story	2998.0387	4.76e-11	6.29e+13	0.000	2998.039	2998.039
HouseStyle SFoyer	2998.0387	9.38e-11	3.2e+13	0.000	2998.039	2998.039
HouseStyle_SLvl	2998.0387	8.11e-11	3.7e+13	0.000	2998.039	2998.039
ExterCond Ex	4796.8620	3.24e-10	1.48e+13	0.000	4796.862	4796.862
ExterCond Fa	4796.8620	1.33e-10	3.6e+13	0.000	4796.862	4796.862
ExterCond Gd	4796.8620	1.2e-10	3.99e+13	0.000	4796.862	4796.862
ExterCond Po	4796.8620	3.5e-10	1.37e+13	0.000	4796.862	4796.862
ExterCond TA	4796.8620	1.16e-10	4.14e+13	0.000	4796.862	4796.862
Foundation_BrkTil	3997.3850			0.000	3997.385	3997.385
Foundation CBlock	3997.3850	6.5e-11	6.15e+13	0.000	3997.385	3997.385
Foundation PConc	3997.3850	6.68e-11	5.99e+13	0.000	3997.385	3997.385
Foundation Slab	3997.3850	1.12e-10	3.57e+13	0.000	3997.385	3997.385
Foundation Stone	3997.3850	2.23e-10	1.8e+13	0.000	3997.385	3997.385
Foundation Wood	3997.3850	1.98e-10	2.02e+13	0.000	3997.385	3997.385
BsmtQual Ex	5996.0775	5.75e-11	1.04e+14	0.000	5996.077	5996.077
BsmtQual Fa	5996.0775	6.96e-11	8.62e+13	0.000	5996.077	5996.077
BsmtQual Gd	5996.0775	3.74e-11	1.6e+14	0.000	5996.077	5996.077
BsmtQual TA	5996.0775	3.87e-11	1.55e+14	0.000	5996.077	5996.077
BsmtCond Fa	5996.0775	1.18e-10	5.06e+13	0.000	5996.077	5996.077
BsmtCond Gd	5996.0775	1.22e-10	4.91e+13	0.000	5996.077	5996.077
BsmtCond_Po	5996.0775	3.43e-10	1.75e+13	0.000	5996.077	5996.077
BsmtCond_TA	5996.0775	1.16e-10	5.19e+13	0.000	5996.077	5996.077
BsmtExposure_Av	5996.0775	3.18e-11	1.89e+14	0.000	5996.077	5996.077
BsmtExposure_Gd	5996.0775	4.03e-11	1.49e+14	0.000	5996.077	5996.077
BsmtExposure_Mn	5996.0775	3.88e-11	1.55e+14	0.000	5996.077	5996.077
BsmtExposure_No	5996.0775	2.76e-11	2.17e+14	0.000	5996.077	5996.077
BsmtFinType1_ALQ	3997.3850	3.42e-11	1.17e+14	0.000	3997.385	3997.385
BsmtFinType1_BLQ	3997.3850	3.62e-11	1.1e+14	0.000	3997.385	3997.385
BsmtFinType1_GLQ	3997.3850	3.39e-11	1.18e+14	0.000	3997.385	3997.385
BsmtFinType1_LwQ	3997.3850	5.13e-11	7.79e+13	0.000	3997.385	3997.385
BsmtFinType1_Rec	3997.3850	3.8e-11	1.05e+14	0.000	3997.385	3997.385
BsmtFinType1_Unf	3997.3850	3.55e-11	1.13e+14	0.000	3997.385	3997.385
BsmtFinType2_ALQ	3997.3850	9.5e-11	4.21e+13	0.000	3997.385	3997.385
BsmtFinType2_BLQ	3997.3850	8.14e-11	4.91e+13	0.000	3997.385	3997.385
76.5 = 5.5						

BsmtFinType2 GLQ	3997.3850	1.19e-10	3.37e+13	0.000	3997.385	3997.385
BsmtFinType2_bzQ	3997.3850	6.79e-11	5.89e+13	0.000	3997.385	3997.385
BsmtFinType2 Rec	3997.3850	6.31e-11	6.34e+13	0.000	3997.385	3997.385
BsmtFinType2 Unf	3997.3850	6.32e-11	6.32e+13	0.000	3997.385	3997.385
CentralAir N	1.199e+04	4.33e-11	2.77e+14	0.000	1.2e+04	1.2e+04
CentralAir Y	1.199e+04	4.25e-11	2.82e+14	0.000	1.2e+04	1.2e+04
Electrical FuseA	5996.0775	8.45e-11	7.1e+13	0.000	5996.077	5996.077
Electrical FuseF	5996.0775	9.73e-11	6.16e+13	0.000	5996.077	5996.077
Electrical FuseP	5996.0775	2.18e-10	2.75e+13	0.000	5996.077	5996.077
Electrical_Mix	-1.086e-12	1.5e-25	-7.22e+12	0.000	-1.09e-12	-1.09e-12
Electrical_SBrkr	5996.0775	8.04e-11	7.46e+13	0.000	5996.077	5996.077
KitchenQual_Ex	5996.0775	5.48e-11	1.09e+14	0.000	5996.077	5996.077
KitchenQual_Fa	5996.0775	6.29e-11	9.54e+13	0.000	5996.077	5996.077
KitchenQual_Gd	5996.0775	3.49e-11	1.72e+14	0.000	5996.077	5996.077
KitchenQual_TA	5996.0775	3.42e-11	1.75e+14	0.000	5996.077	5996.077
Functional_Maj1	3426.3300	1.44e-10	2.38e+13	0.000	3426.330	3426.330
Functional_Maj2	3426.3300	2.05e-10	1.67e+13	0.000	3426.330	3426.330
Functional_Min1	3426.3300	9.74e-11	3.52e+13	0.000	3426.330	3426.330
Functional_Min2	3426.3300	1e-10	3.42e+13	0.000	3426.330	3426.330
Functional_Mod	3426.3300	1.27e-10	2.69e+13	0.000	3426.330	3426.330
Functional_Sev	3426.3300	3.48e-10	9.85e+12	0.000	3426.330	3426.330
Functional_Typ	3426.3300	7.56e-11	4.53e+13	0.000	3426.330	3426.330
GarageQual_Ex	4796.8620	2.05e-10	2.34e+13	0.000	4796.862	4796.862
GarageQual_Fa	4796.8620	1.03e-10	4.64e+13	0.000	4796.862	4796.862
GarageQual_Gd	4796.8620	1.38e-10	3.48e+13	0.000	4796.862	4796.862
GarageQual_Po	4796.8620	2.76e-10	1.74e+13	0.000	4796.862	4796.862
GarageQual_TA	4796.8620	8.81e-11	5.45e+13	0.000	4796.862	4796.862
PavedDrive_N	7994.7699	4.67e-11	1.71e+14	0.000	7994.770	7994.770
PavedDrive_P	7994.7699	6.04e-11	1.32e+14	0.000	7994.770	7994.770
PavedDrive_Y	7994.7699	3.96e-11	2.02e+14	0.000	7994.770	7994.770
PoolQC_Ex	8465.0505	2.21e-10	3.83e+13	0.000	8465.051	8465.051
PoolQC_Fa	7054.2088	1.69e-10	4.17e+13	0.000	7054.209	7054.209
PoolQC_Gd	8465.0505	1.88e-10	4.51e+13	0.000	8465.051	8465.051
Fence_GdPrv	5996.0775	6.04e-11	9.93e+13	0.000	5996.077	5996.077
Fence_GdWo	5996.0775	6.02e-11	9.96e+13	0.000	5996.077	5996.077
Fence_MnPrv	5996.0775	4.2e-11	1.43e+14	0.000	5996.077	5996.077
Fence_MnWw	5996.0775	1.03e-10	5.82e+13	0.000	5996.077	5996.077
MiscFeature_Gar2	5643.3670	2.91e-10	1.94e+13	0.000	5643.367	5643.367
MiscFeature_Othr	5643.3670	2.41e-10	2.34e+13	0.000	5643.367	5643.367
MiscFeature_Shed	5643.3670	1.48e-10	3.82e+13	0.000	5643.367	5643.367
MiscFeature_TenC	7054.2088	1.69e-10	4.17e+13	0.000	7054.209	7054.209
SaleType_COD	2664.9233	9.9e-11	2.69e+13	0.000	2664.923	2664.923
SaleType_CWD	2664.9233	2.58e-10	1.03e+13	0.000	2664.923	2664.923
SaleType_Con	2664.9233	2.55e-10	1.04e+13	0.000	2664.923	2664.923
SaleType_ConLD	2664.9233	1.48e-10	1.8e+13	0.000	2664.923	2664.923
SaleType_ConLI	2664.9233	2.14e-10	1.25e+13	0.000	2664.923	2664.923
SaleType_ConLw	2664.9233	1.98e-10	1.35e+13	0.000	2664.923	2664.923
SaleType_New	2664.9233	2.17e-10	1.23e+13	0.000	2664.923	2664.923
SaleType_Oth	2664.9233	2.55e-10	1.04e+13	0.000	2664.923	2664.923
SaleType_WD	2664.9233	7.47e-11	3.57e+13	0.000	2664.923	2664.923
SaleCondition_Abnorml	3997.3850	7.32e-11	5.46e+13	0.000	3997.385	3997.385
SaleCondition_AdjLand	3997.3850	1.93e-10	2.07e+13	0.000	3997.385	3997.385
SaleCondition_Alloca	3997.3850	1.29e-10	3.1e+13	0.000	3997.385	3997.385
SaleCondition_Family	3997.3850	1.02e-10	3.9e+13	0.000	3997.385	3997.385
SaleCondition_Normal	3997.3850	6.18e-11	6.46e+13	0.000	3997.385	3997.385

```
SaleCondition_Partial 3997.3850
                                      2e-10
                                                2e+13 0.000 3997.385 3997.385
     Omnibus: 1171.654
                            Durbin-Watson:
                                                 0.794
Prob(Omnibus):
                   0.000 Jarque-Bera (JB): 116953.920
         Skew:
                   4.456
                                 Prob(JB):
                                                  0.00
                  51.205
      Kurtosis:
                                 Cond. No.
                                              1 03e+16
```

Notes:

- [1] Standard Errors assume that the covariance matrix of the errors is correctly specified.
- [2] The smallest eigenvalue is 2.3e-28. This might indicate that there are strong multicollinearity problems or that the design matrix is singular.
 - 1. Remove unncessary columns on the basis of pval

```
D=pd.DataFrame(model.pvalues,columns=["pval"])
column_to_drop=D.sort_values(by="pval",ascending=False)[0:1].index[0]
In [24]:
            Xnew=Xnew.drop(labels=[column to drop],axis=1)
In [25]: Xnew
                                  LotArea OverallQual OverallCond MasVnrArea BsmtFinSF1 BsmtFinSF2 BsmtUnfSF TotalBsmtSF LowQualFinSF
                  MSSubClass
Out[25]:
               0
                      0.073375 -0.207142
                                              0.651479
                                                            -0.517200
                                                                          0.511418
                                                                                        0.575425
                                                                                                     -0.288653
                                                                                                                 -0.944591
                                                                                                                                -0.459303
                                                                                                                                                -0.120242 ...
               1
                     -0.872563 -0.091886
                                              -0.071836
                                                            2.179628
                                                                         -0.574410
                                                                                        1.171992
                                                                                                     -0.288653
                                                                                                                 -0.641228
                                                                                                                                0.466465
                                                                                                                                                -0.120242 ...
               2
                      0.073375
                                 0.073480
                                              0.651479
                                                            -0.517200
                                                                          0.323060
                                                                                        0.092907
                                                                                                     -0.288653
                                                                                                                 -0.301643
                                                                                                                                -0.313369
                                                                                                                                                -0.120242
                      0.309859 -0.096897
                                              0.651479
                                                            -0.517200
                                                                         -0.574410
                                                                                       -0.499274
                                                                                                     -0.288653
                                                                                                                 -0.061670
                                                                                                                                -0.687324
                                                                                                                                                -0.120242 ...
               4
                      0.073375
                                0.375148
                                              1.374795
                                                            -0.517200
                                                                          1.364570
                                                                                        0.463568
                                                                                                     -0.288653
                                                                                                                 -0.174865
                                                                                                                                0.199680
                                                                                                                                                -0.120242 ...
            1455
                      0.073375 -0.260560
                                              -0.071836
                                                            -0.517200
                                                                         -0.574410
                                                                                       -0.973018
                                                                                                     -0.288653
                                                                                                                  0.873321
                                                                                                                                -0.238122
                                                                                                                                                -0.120242 ...
            1456
                     -0.872563
                                 0.266407
                                              -0.071836
                                                            0.381743
                                                                          0.084843
                                                                                        0.759659
                                                                                                     0.722112
                                                                                                                  0.049262
                                                                                                                                1.104925
                                                                                                                                                -0.120242 ...
            1457
                      0.309859 -0.147810
                                              0.651479
                                                            3.078570
                                                                         -0.574410
                                                                                       -0.369871
                                                                                                     -0.288653
                                                                                                                  0.701265
                                                                                                                                0.215641
                                                                                                                                                -0.120242
            1458
                     -0.872563 -0.080160
                                              -0.795151
                                                            0.381743
                                                                         -0.574410
                                                                                       -0.865548
                                                                                                     6.092188
                                                                                                                 -1.284176
                                                                                                                                0.046905
                                                                                                                                                -0.120242 ...
            1459
                     -0.872563 -0.058112
                                              -0.795151
                                                            0.381743
                                                                         -0.574410
                                                                                        0.847389
                                                                                                     1.509640
                                                                                                                  -0.976285
                                                                                                                                0.452784
                                                                                                                                                -0.120242 ...
           1460 rows × 180 columns
```

1. Create a Linear Regression model on the basis of selected columns.

```
In [26]: from sklearn.linear_model import LinearRegression
lm=LinearRegression()
model=lm.fit(xtrain,ytrain)

In [27]: pred=model.predict(xtest)

In [28]: from sklearn.metrics import mean_absolute_error
mean_absolute_error(ytest,pred)

Out[28]: 0.013268572693399221
```

1. Find training | testing error --> Overfitting or not

```
In [29]: from sklearn.linear_model import LinearRegression
lm=LinearRegression()
model=lm.fit(xtrain,ytrain)
from sklearn.metrics import mean_squared_error
pred_tr=model.predict(xtrain)
tr_err=round(mean_squared_error(ytrain,pred_tr),3)
pred_ts=model.predict(xtest)
ts_err=round(mean_squared_error(ytest,pred_ts),3)
print("Training Error:",tr_err)
print("\nTesting Error:",ts_err)
if(tr_err<ts_err):
    print("Overfitting")</pre>
```

Training Error: 0.0
Testing Error: 0.03
Overfitting

alpha 21.18

tr Err 1901.9665

```
Q=[]
          x = 20.5
          for i in range(0,100,1):
              x=x+0.01
              x=round(x,4)
              Q.append(x)
         from sklearn.linear model import Ridge
In [31]:
          for i in 0:
              rr=Ridge(alpha=i)
              model=rr.fit(xtrain,ytrain)
              tr pred=model.predict(xtrain)
              ts_pred=model.predict(xtest)
              from sklearn.metrics import mean absolute error
              tr err=mean absolute error(ytrain,tr pred)
              ts err=mean absolute error(ytest,ts pred)
              print("alpha",i,"\ttr_Err",round(tr_err,4),"\tts_Err",round(ts_err,4))
         alpha 20.51
                          tr Err 1854.3472
                                                    ts Err 2082.9042
                                                    ts Err 2083.6831
         alpha 20.52
                          tr Err 1855.061
         alpha 20.53
                          tr Err 1855.7749
                                                   ts_Err 2084.4618
         alpha 20.54
                          tr_Err 1856.4887
                                                    ts_Err 2085.2403
         alpha 20.55
                          tr Err 1857.2024
                                                    ts Err 2086.0187
                          tr_Err 1857.916
                                                   ts_Err 2086.797
         alpha 20.56
                                                    ts_Err 2087.5751
         alpha 20.57
                          tr Err 1858.6295
         alpha 20.58
                          tr Err 1859.3428
                                                    ts Err 2088.353
                                                   ts_Err 2089.1308
ts_Err 2089.9085
         alpha 20.59
                          tr_Err 1860.056
                          tr_Err 1860.7691
         alpha 20.6
         alpha 20.61
                          tr_Err 1861.4823
                                                    ts_Err 2090.686
                          tr_Err 1862.1959
tr_Err 1862.9094
                                                   ts_Err 2091.4633
ts_Err 2092.2405
         alpha 20.62
         alpha 20.63
         alpha 20.64
                          tr_Err 1863.6228
                                                    ts_Err 2093.0176
         alpha 20.65
                          tr Err 1864.336
                                                    ts Err 2093.7945
                          tr Err 1865.0492
                                                    ts Err 2094.5712
         alpha 20.66
         alpha 20.67
                          tr_Err 1865.7622
                                                   ts_Err 2095.3478
                                                    ts_Err 2096.1243
         alpha 20.68
                          tr_Err 1866.4751
                                                    ts Err 2096.9006
         alpha 20.69
                          tr Err 1867.1879
                          tr_Err 1867.9005
                                                   ts_Err 2097.6767
         alpha 20.7
         alpha 20.71
                          tr Err 1868.613
                                                    ts Err 2098.4527
         alpha 20.72
                          tr Err 1869.3254
                                                    ts Err 2099.2286
                          tr_Err 1870.0376
         alpha 20.73
                                                    ts_Err 2100.0043
                          tr_Err 1870.7498
                                                    ts_Err 2100.7798
         alpha 20.74
         alpha 20.75
                          tr_Err 1871.4618
                                                    ts_Err 2101.5552
                          tr_Err 1872.1737
tr_Err 1872.8854
                                                    ts_Err 2102.3305
ts_Err 2103.1056
         alpha 20.76
         alpha 20.77
         alpha 20.78
                          tr Err 1873.597
                                                    ts Err 2103.8805
                          tr_Err 1874.3085
                                                    ts_Err 2104.6553
         alpha 20.79
                                                    ts Err 2105.43
         alpha 20.8
                          tr Err 1875.0199
         alpha 20.81
                          tr_Err 1875.7311
                                                    ts_Err 2106.2045
         alpha 20.82
                          tr Err 1876.4423
                                                    ts Err 2106.9789
                                                    ts Err 2107.7531
         alpha 20.83
                          tr Err 1877.1533
         alpha 20.84
                          tr_Err 1877.8641
                                                    ts_Err 2108.5271
                                                    ts Err 2109.3011
         alpha 20.85
                          tr Err 1878.5749
         alpha 20.86
                          tr_Err 1879.2855
                                                    ts_Err 2110.0748
                          tr_Err 1879.996
         alpha 20.87
                                                    ts_Err 2110.8484
                          tr_Err 1880.7063
                                                    ts_Err 2111.6219
         alpha 20.88
         alpha 20.89
                          tr Err 1881.4166
                                                    ts Err 2112.3952
                          tr_Err 1882.1267
                                                    ts_Err 2113.1684
         alpha 20.9
                          tr Err 1882.8366
                                                    ts Err 2113.9414
         alpha 20.91
         alpha 20.92
                          tr_Err 1883.5466
                                                    ts_Err 2114.7143
         alpha 20.93
                                                    ts_Err 2115.487
                          tr Err 1884.2566
                          tr Err 1884.9665
                                                    ts Err 2116.2596
         alpha 20.94
         alpha 20.95
                          tr_Err 1885.6763
                                                    ts_Err 2117.032
         alpha 20.96
                          tr Err 1886.3859
                                                    ts_Err 2117.8043
                          tr Err 1887.0954
                                                    ts Err 2118.5765
         alpha 20.97
         alpha 20.98
                          tr_Err 1887.8048
                                                    ts_Err 2119.3485
         alpha 20.99
                          tr Err 1888.5141
                                                    ts_Err 2120.1203
         alpha 21.0
                          tr Err 1889.2233
                                                    ts Err 2120.892
                          tr_Err 1889.9323
tr_Err 1890.6412
                                                   ts_Err 2121.6635
ts_Err 2122.4349
         alpha 21.01
         alpha 21.02
         alpha 21.03
                          tr Err 1891.35 ts Err 2123.2062
                                                   ts_Err 2123.9773
ts_Err 2124.7482
         alpha 21.04
                          tr Err 1892.0586
                          tr Err 1892.7671
         alpha 21.05
         alpha 21.06
                          tr_Err 1893.4755
                                                    ts_Err 2125.5191
         alpha 21.07
                          tr Err 1894.1838
                                                    ts Err 2126.2897
                          tr Err 1894.8919
         alpha 21.08
                                                    ts Err 2127.0602
                          tr_Err 1895.6 ts_Err 2127.8306
         alpha 21.09
         alpha 21.1
                          tr Err 1896.3079
                                                    ts Err 2128.6008
         alpha 21.11
                          tr Err 1897.0156
                                                    ts Err 2129.3709
                          tr_Err 1897.7233
                                                   ts_Err 2130.1408
         alpha 21.12
         alpha 21.13
                          tr Err 1898.4308
                                                    ts Err 2130.9106
         alpha 21.14
                          tr Err 1899.1382
                                                    ts Err 2131.6802
                          tr_Err 1899.8455
         alpha 21.15
                                                    ts_Err 2132.4497
                                                    ts_Err 2133.2191
                          tr Err 1900.5526
         alpha 21.16
         alpha 21.17
                         tr Err 1901.2596
                                                    ts Err 2133.9882
```

ts Err 2134.7573

```
tr_Err 1902.6733
         alpha 21.2
                         tr_Err 1903.38 ts_Err 2136.2949
         alpha 21.21
                         tr Err 1904.0865
                                                 ts Err 2137.0635
                                                 ts Err 2137.832
         alpha 21.22
                         tr Err 1904.7929
                         tr_Err 1905.4992
         alpha 21.23
                                                 ts_Err 2138.6003
         alpha 21.24
                         tr_Err 1906.2053
                                                 ts_Err 2139.3685
         alpha 21.25
                         tr_Err 1906.9113
                                                 ts_Err 2140.1365
                         tr_Err 1907.6172
         alpha 21.26
                                                 ts Err 2140.9044
         alpha 21.27
                         tr Err 1908.323
                                                 ts_Err 2141.6721
         alpha 21.28
                         tr Err 1909.0287
                                                 ts Err 2142.4397
         alpha 21.29
                         tr Err 1909.7342
                                                 ts Err 2143.2071
         alpha 21.3
                         tr Err 1910.4396
                                                 ts_Err 2143.9744
         alpha 21.31
                         tr_Err 1911.1449
                                                 ts_Err 2144.7416
                         tr Err 1911.85 ts Err 2145.5086
         alpha 21.32
         alpha 21.33
                         tr Err 1912.5551
                                                 ts Err 2146.2754
         alpha 21.34
                         tr_Err 1913.2602
                                                 ts_Err 2147.0421
         alpha 21.35
                         tr Err 1913.9651
                                                 ts Err 2147.8087
         alpha 21.36
                         tr Err 1914.6699
                                                 ts Err 2148.5751
                         tr_Err 1915.3745
                                                 ts_Err 2149.3414
         alpha 21.37
         alpha 21.38
                         tr_Err 1916.0791
                                                  ts_Err 2150.1075
         alpha 21.39
                         tr Err 1916.7835
                                                 ts Err 2150.8735
                         tr Err 1917.4878
         alpha 21.4
                                                 ts Err 2151.6393
                         tr Err 1918.192
                                                 ts Err 2152.405
         alpha 21.41
         alpha 21.42
                         tr Err 1918.896
                                                 ts Err 2153.1705
         alpha 21.43
                         tr Err 1919.5999
                                                 ts Err 2153.9359
                         tr Err 1920.3037
                                                 ts_Err 2154.7012
         alpha 21.44
         alpha 21.45
                         tr_Err 1921.0074
                                                 ts_Err 2155.4663
                         tr Err 1921.711
                                                  ts_Err 2156.2313
         alpha 21.46
                         tr Err 1922.4144
         alpha 21.47
                                                 ts Err 2156.9961
                         tr_Err 1923.1177
                                                 ts_Err 2157.7608
         alpha 21.48
         alpha 21.49
                         tr Err 1923.8209
                                                  ts Err 2158.5253
                         tr Err 1924.524
                                                 ts_Err 2159.2897
         alpha 21.5
In [32]: Q=[]
         x=0.03
         for i in range(0,100,1):
             x=x+0.001
             x = round(x, 4)
             Q.append(x)
In [33]:
         from sklearn.linear model import Lasso
         trerrs=[]
         tserrs=[]
         for i in Q:
             ls=Lasso(alpha=i)
             model=ls.fit(xtrain,ytrain)
             tr_pred=model.predict(xtrain)
             ts_pred=model.predict(xtest)
             from sklearn.metrics import mean_absolute_error
             ts err = mean absolute error(ytest,ts pred)
             tserrs.append(ts err)
             tr err = mean_absolute_error(ytrain,tr_pred)
             trerrs.append(tr_err)
             print("alpha",i,"\ttr_Err",round(tr_err,4),"\tts_Err",round(ts_err,4))
         alpha 0.031
                         tr Err 10.9821 ts Err 14.5597
         alpha 0.032
                         tr_Err 10.9352 ts_Err 14.4751
         alpha 0.033
                         tr_Err 10.8889
                                        ts Err 14.3892
         alpha 0.034
                         tr Err 10.8437
                                         ts Err 14.3098
         alpha 0.035
                         tr Err 10.8014 ts Err 14.2377
         alpha 0.036
                         tr Err 10.7612
                                         ts Err 14.1701
                         tr Err 10.7227 ts Err 14.1022
         alpha 0.037
         alpha 0.038
                         tr_Err 10.6851 ts_Err 14.0301
         alpha 0.039
                         tr_Err 10.6496
                                         ts_Err 13.9635
         alpha 0.04
                         tr Err 10.616
                                         ts Err 13.9009
         alpha 0.041
                         tr_Err 10.5838 ts_Err 13.8415
         alpha 0.042
                         tr Err 10.5527
                                         ts Err 13.7842
         alpha 0.043
                         tr Err 10.5218 ts Err 13.7282
         alpha 0.044
                         tr_Err 10.4911 ts_Err 13.6732
         alpha 0.045
                         tr_Err 10.4612
                                         ts_Err 13.6151
         alpha 0.046
                         tr_Err 10.4308 ts_Err 13.5644
         alpha 0.047
                         tr Err 10.3999
                                         ts_Err 13.5128
                         tr Err 10.3694
                                         ts_Err 13.4616
         alpha 0.048
         alpha 0.049
                         tr Err 10.3388 ts Err 13.412
         alpha 0.05
                         tr Err 10.308
                                         ts Err 13.3645
                         tr Err 10.2774
                                         ts Err 13.3179
         alpha 0.051
         alpha 0.052
                         tr_Err 10.2472 ts_Err 13.2732
         alpha 0.053
                         tr Err 10.2172
                                         ts_Err 13.229
                         tr Err 10.1877
         alpha 0.054
                                         ts Err 13.1852
         alpha 0.055
                         tr_Err 10.159
                                         ts_Err 13.1439
         alpha 0.056
                         tr Err 10.1296
                                         ts Err 13.1013
         alpha 0.057
                         tr Err 10.1006 ts Err 13.0595
         alpha 0.058
                         tr_Err 10.0722
                                         ts_Err 13.019
         alpha 0.059
                         tr_Err 10.0434
                                         ts_Err 12.9794
         alpha 0.06
                         tr Err 10.0154 ts Err 12.9408
                         tr Err 9.987
         alpha 0.061
                                         ts Err 12.9013
                                         ts_Err 12.8644
                         tr_Err 9.9591
         alpha 0.062
```

ts Err 2135.5262

alpha 21.19

```
alpha 0.063
                          tr Err 9.93
                                           ts Err 12.8271
         alpha 0.064
                          tr_Err 9.9026
                                           ts_Err 12.7913
         alpha 0.065
                          tr Err 9.8741
                                            ts Err 12.7535
         alpha 0.066
                          tr Err 9.847
                                           ts Err 12.7184
                          tr_Err 9.8189
         alpha 0.067
                                           ts Err 12.682
         alpha 0.068
                          tr_Err 9.7923
                                           ts_Err 12.6477
                          tr_Err 9.7644
         alpha 0.069
                                           ts Err 12.6116
                          tr_Err 9.7379
                                           ts Err 12.577
         alpha 0.07
                                           ts_Err 12.542
         alpha 0.071
                          tr_Err 9.7114
         alpha 0.072
                          tr Err 9.6823
                                           ts Err 12.5043
         alpha 0.073
                          tr Err 9.6548
                                           ts Err 12.4685
         alpha 0.074
                          tr Err 9.6274
                                           ts Err 12.4311
         alpha 0.075
                          tr_Err 9.6014
                                           ts_Err 12.3934
         alpha 0.076
                          tr_Err 9.5737
                                            ts_Err 12.3532
         alpha 0.077
                          tr Err 9.5469
                                           ts Err 12.3135
         alpha 0.078
                          tr_Err 9.5183
                                           ts_Err 12.27
         alpha 0.079
                          tr Err 9.4893
                                            ts Err 12.2276
                                           ts Err 12.1851
         alpha 0.08
                          tr Err 9.4585
                          tr_Err 9.4284
                                           ts_Err 12.1433
         alpha 0.081
         alpha 0.082
                          tr_Err 9.3984
                                           ts_Err 12.1007
                          tr Err 9.3694
                                           ts Err 12.0578
         alpha 0.083
                          tr_Err 9.3403
                                           ts_Err 12.0168
ts_Err 11.9739
         alpha 0.084
                          tr Err 9.3111
         alpha 0.085
         alpha 0.086
                          tr Err 9.2814
                                           ts Err 11.9322
         alpha 0.087
                          tr Err 9.2518
                                           ts Err 11.8915
                                           ts Err 11.8491
         alpha 0.088
                          tr Err 9.2221
         alpha 0.089
                          tr_Err 9.1925
                                           ts_Err 11.8078
         alpha 0.09
                          tr_Err 9.4204
                                           ts Err 12.1058
         alpha 0.091
                          tr Err 9.3906
                                           ts Err 12.0632
                          tr_Err 9.3613
         alpha 0.092
                                           ts_Err 12.0226
         alpha 0.093
                          tr Err 9.3315
                                            ts Err 11.9833
                                           ts_Err 11.9433
         alpha 0.094
                          tr Err 9.3016
                          tr_Err 9.2721
         alpha 0.095
                                           ts_Err 11.9045
         alpha 0.096
                          tr_Err 9.2424
                                           ts Err 11.8661
         alpha 0.097
                          tr Err 9.213
                                            ts Err 11.8274
                          tr_Err 9.1834
                                           ts_Err 11.79
ts_Err 11.7509
         alpha 0.098
                          tr Err 9.1517
         alpha 0.099
         alpha 0.1
                          tr Err 9.1209
                                           ts Err 11.7125
         alpha 0.101
                          tr Err 9.0914
                                           ts_Err 11.6759
                                            ts Err 11.6388
                          tr_Err 9.061
         alpha 0.102
         alpha 0.103
                          tr_Err 9.0312
                                           ts Err 11.6022
         alpha 0.104
                          tr Err 9,0026
                                           ts Err 11.567
         alpha 0.105
                          tr Err 8.9737
                                           ts Err 11.5314
         alpha 0.106
                          tr_Err 8.9443
                                           ts Err 11.4951
         alpha 0.107
                          tr Err 8.9162
                                            ts Err 11.4599
         alpha 0.108
                          tr Err 8.8869
                                           ts Err 11.422
                          tr_Err 8.8552
         alpha 0.109
                                           ts_Err 11.3811
         alpha 0.11
                          tr_Err 8.8225
                                           ts_Err 11.339
                                            ts Err 11.299
         alpha 0.111
                          tr Err 8.791
         alpha 0.112
                          tr Err 8.7594
                                           ts Err 11.2592
                                           ts Err 11.2174
                          tr Err 8.7262
         alpha 0.113
         alpha 0.114
                          tr Err 8.6932
                                           ts Err 11.1745
         alpha 0.115
                          tr Err 8.6625
                                           ts Err 11.1339
                          tr Err 8.6316
                                           ts Err 11.0928
         alpha 0.116
         alpha 0.117
                          tr_Err 8.5994
                                           ts_Err 11.05
         alpha 0.118
                          tr Err 8.5676
                                           ts Err 11.0076
         alpha 0.119
                          tr Err 8.5377
                                           ts Err 10.9672
         alpha 0.12
                          tr_Err 8.5075
                                           ts_Err 10.9262
         alpha 0.121
                          tr Err 8.4758
                                           ts Err 10.8831
                                            ts Err 11.1856
         alpha 0.122
                          tr Err 8.708
                          tr_Err 8.6783
         alpha 0.123
                                           ts_Err 11.145
                                           ts Err 11.1043
         alpha 0.124
                          tr_Err 8.6486
                                           ts Err 11.0616
         alpha 0.125
                          tr Err 8.6173
         alpha 0.126
                          tr_Err 8.5863
                                           ts_Err 11.0191
                                           ts_Err 10.9782
         alpha 0.127
                          tr Err 8.5567
         alpha 0.128
                          tr Err 8.5279
                                           ts_Err 10.9378
         alpha 0.129
                          tr Err 8.4982
                                            ts Err 10.8958
                          tr Err 8.4679
                                           ts_Err 10.8534
         alpha 0.13
In [34]:
         from sklearn.model_selection import train_test_split
          xtrain,xtest,ytrain,ytest=train_test_split(Xnew,Y,test_size=0.2,random_state=19)
          ls=Lasso(alpha=0.99)
          model=ls.fit(xtrain,ytrain)
          tr pred=model.predict(xtrain)
          ts_pred=model.predict(xtest)
          from sklearn.metrics import mean absolute error
          ts_err=mean_absolute_error(ytest,ts_pred)
         tr_err=mean_absolute_error(ytrain,tr_pred)
print("alpha",1.99,"\ttr_Err=",round(tr_err,4),"\tts_Err=",round(ts_err,4))
         alpha 1.99
                          tr Err= 0.6463 ts Err= 0.5397
         Create a Tuning grid
```

```
In [35]:
          0 = [1]
          for i in range(0,100,1):
              x=x+0.001
```

```
x = round(x, 4)
              Q.append(x)
In [36]:
          tuning_grid={"alpha":Q}
          ls=Lasso()
          from sklearn.model selection import GridSearchCV
          cv=GridSearchCV(ls,tuning_grid,scoring="neg_mean_squared_error",cv=4)
          cvmodel=cv.fit(Xnew,Y)
          cvmodel.best_params_
          {'alpha': 0.991}
Out[36]:
In [37]: test=pd.read_csv("C:/Users/ASUS/Downloads/testing_set.csv")
In [38]:
          test.head()
               Id MSSubClass MSZoning LotFrontage LotArea Street Alley
                                                                       LotShape LandContour Utilities ... ScreenPorch PoolArea PoolQC
Out[38]:
          0 1461
                                   RH
                                              80.0
                                                     11622
                                                            Pave
                                                                  NaN
                                                                            Reg
                                                                                         Lvl
                                                                                              AllPub ...
                                                                                                               120
                                                                                                                               NaN
          1 1462
                          20
                                    RI
                                              81.0
                                                                                              AllPub
                                                                                                                 0
                                                                                                                          0
                                                                                                                               NaN
                                                     14267
                                                            Pave
                                                                            IR1
                                                                                         LvI
                                                                  NaN
          2 1463
                          60
                                    RL
                                              74.0
                                                     13830
                                                            Pave
                                                                  NaN
                                                                            IR1
                                                                                         LvI
                                                                                              AllPub
                                                                                                                 0
                                                                                                                          0
                                                                                                                               NaN
          3 1464
                          60
                                    RL
                                              78.0
                                                     9978
                                                            Pave
                                                                  NaN
                                                                            IR1
                                                                                         Lvl
                                                                                              AllPub
                                                                                                                 0
                                                                                                                          0
                                                                                                                               NaN
          4 1465
                         120
                                    RI
                                              43.0
                                                      5005
                                                            Pave
                                                                            IR1
                                                                                        HI S
                                                                                              AllPub ...
                                                                                                               144
                                                                                                                          0
                                                                                                                               NaN
                                                                  NaN
         5 rows × 80 columns
          from preprocesser import replacer
In [39]:
          replacer(test)
In [40]: test.isna().sum()
          Ιd
                            0
Out[40]:
          MSSubClass
                            0
          MSZoning
                            0
                            0
          LotFrontage
          LotArea
                            0
          MiscVal
                            0
          MoSold
                            0
          YrSold
                            0
          SaleType
                            0
          SaleCondition
                            0
          Length: 80, dtype: int64
In [41]: cols_keep=list(xtrain.columns)
In [42]: cols_keep
          ['MSSubClass',
Out[42]:
           'LotArea'
           'OverallQual'
           'OverallCond',
           'MasVnrArea',
           'BsmtFinSF1'
           'BsmtFinSF2',
           'BsmtUnfSF'
           'TotalBsmtSF'
           'LowQualFinSF',
           'GrLivArea',
           'BsmtFullBath',
           'BsmtHalfBath',
           'BedroomAbvGr'
           'KitchenAbvGr',
           'Fireplaces',
           'GarageArea'
           'OpenPorchSF',
           'PoolArea',
           'YrSold',
           'SalePrice'
           'Street Grvl',
           'Street_Pave'
           'LotShape_IR1',
           'LotShape IR2',
           'LotShape_IR3',
           'LotShape_Reg'
           'LandContour_Bnk',
           'LandContour HLS',
           'LandContour_Low',
           'LandContour_Lvl',
           'Utilities_AllPub',
           'Utilities_NoSeWa',
           'LotConfig_Corner',
```

```
'LotConfig_CulDSac',
'LotConfig_FR2',
'LotConfig_FR3'
'LotConfig Inside',
'Neighborhood Blmngtn',
'Neighborhood_Blueste',
'Neighborhood BrDale',
'Neighborhood_BrkSide',
'Neighborhood_ClearCr',
'Neighborhood_CollgCr',
'Neighborhood Crawfor',
'Neighborhood Edwards',
'Neighborhood_Gilbert',
'Neighborhood IDOTRR'
'Neighborhood MeadowV',
'Neighborhood Mitchel',
'Neighborhood NAmes'
'Neighborhood_NPkVill',
'Neighborhood_NWAmes'
'Neighborhood_NoRidge'
'Neighborhood NridgHt',
'Neighborhood_OldTown',
'Neighborhood_SWISU',
'Neighborhood Sawyer'
'Neighborhood SawyerW',
'Neighborhood_Somerst',
'Neighborhood_StoneBr',
'Neighborhood Timber'
'Neighborhood Veenker',
'Condition1_Artery',
'Condition1 Feedr',
'Condition1 Norm',
'Condition1_PosA',
'Condition1 PosN',
'Condition1 RRAe',
'Condition1 RRAn',
'Condition1 RRNe',
'Condition1_RRNn',
'Condition2_Artery',
'Condition2 Feedr',
'Condition2 Norm',
'Condition2 PosA',
'Condition2 PosN',
'Condition2_RRAe',
'Condition2 RRAn'
'Condition2 RRNn',
'BldgType_1Fam',
'BldgType 2fmCon'
'BldgType Duplex',
'BldgType_Twnhs',
'BldgType_TwnhsE'
'HouseStyle_1.5Fin',
'HouseStyle_1.5Unf',
'HouseStyle_1Story',
'HouseStyle 2.5Fin',
'HouseStyle 2.5Unf',
'HouseStyle_2Story',
'HouseStyle_SFoyer',
'HouseStyle_SLvl',
'ExterCond_Ex',
'ExterCond Fa',
'ExterCond Gd',
'ExterCond Po',
'ExterCond_TA'
'Foundation BrkTil',
'Foundation_CBlock',
'Foundation PConc',
'Foundation Slab',
'Foundation Stone',
'Foundation_Wood',
'BsmtQual_Ex',
'BsmtQual_Fa',
'BsmtQual Gd',
'BsmtQual TA',
'BsmtCond Fa',
'BsmtCond Gd',
'BsmtCond Po',
'BsmtCond TA',
'BsmtExposure Av',
'BsmtExposure_Gd',
'BsmtExposure Mn',
'BsmtExposure No',
'BsmtFinType1_ALQ',
'BsmtFinType1_BLQ',
'BsmtFinType1 GLQ',
'BsmtFinType1_LwQ',
'BsmtFinType1_Rec',
'BsmtFinType1_Unf',
'BsmtFinType2_ALQ',
```

```
'BsmtFinType2_BLQ',
              'BsmtFinType2_GLQ',
'BsmtFinType2_LwQ',
'BsmtFinType2_Rec',
               'BsmtFinType2_Unf',
               'CentralAir_N',
               'CentralAir_Y',
              'Electrical_FuseA',
'Electrical_FuseF',
'Electrical_FuseP',
               'Electrical Mix',
               'Electrical_SBrkr',
               'KitchenQual_Ex',
              'KitchenQual_Fa',
'KitchenQual_Gd',
               'KitchenQual_TA',
'Functional_Maj1',
               'Functional Maj2',
               'Functional_Min1',
'Functional_Min2',
               'Functional Mod',
              'Functional_Sev',
'Functional_Typ',
               'GarageQual Ex',
               'GarageQual_Fa',
'GarageQual_Gd',
               'GarageQual_Po',
'GarageQual_TA',
               'PavedDrive_N',
'PavedDrive_P',
               'PavedDrive Y',
               'PoolQC_Ex',
               'PoolQC_Fa',
'PoolQC_Gd',
               'Fence GdPrv',
              'Fence_GdWo',
'Fence_MnPrv',
              'Fence_MnWw',
'MiscFeature_Gar2',
               'MiscFeature_Othr',
               'MiscFeature_Shed',
'MiscFeature_TenC',
               'SaleType_COD',
               'SaleType_CWD',
'SaleType_Con',
               'SaleType_ConLD',
               'SaleType_ConLI',
'SaleType_ConLw',
              'SaleType_New',
'SaleType_Oth',
               'SaleType_WD',
               'SaleCondition_Abnorml',
               'SaleCondition AdjLand',
               'SaleCondition_Alloca',
               'SaleCondition Family',
               'SaleCondition Normal'
              'SaleCondition_Partial']
In [43]:
             cat=[]
             con=[]
             for i in test.columns:
                   if test[i].dtypes=="object":
                        cat.append(i)
                   else:
                         con.append(i)
In [44]: cat
```

```
Out[44]: ['MSZoning',
            'Street',
            'Alley',
            'LotShape',
            'LandContour',
            'Utilities',
            'LotConfig',
            'LandSlope',
            'Neighborhood',
            'Condition1',
            'Condition2',
            'BldgType',
            'HouseStyle',
            'RoofStyle',
            'RoofMatl',
            'Exterior1st',
            'Exterior2nd',
            'MasVnrType',
            'ExterQual',
            'ExterCond'
            'Foundation',
            'BsmtQual',
'BsmtCond',
            'BsmtExposure',
            'BsmtFinType1',
            'BsmtFinType2',
            'Heating'
            'HeatingQC'
            'CentralAir',
            'Electrical',
'KitchenQual',
            'Functional',
            'FireplaceQu',
            'GarageType'
            'GarageFinish',
            'GarageQual',
'GarageCond',
            'PavedDrive',
            'PoolQC',
            'Fence',
            'MiscFeature',
            'SaleType',
            'SaleCondition']
In [45]: con
          ['Id',
Out[45]:
            'MSSubClass',
            'LotFrontage',
            'LotArea',
            'OverallQual',
            'OverallCond',
            'YearBuilt',
            'YearRemodAdd',
            'MasVnrArea',
            'BsmtFinSF1',
            'BsmtFinSF2',
            'BsmtUnfSF'
            'TotalBsmtSF',
            '1stFlrSF',
'2ndFlrSF',
            'LowQualFinSF',
            'GrLivArea',
            'BsmtFullBath',
            'BsmtHalfBath',
            'FullBath',
'HalfBath',
            'BedroomAbvGr',
'KitchenAbvGr',
            'TotRmsAbvGrd',
            'Fireplaces',
'GarageYrBlt',
            'GarageCars',
            'GarageArea',
            'WoodDeckSF'
            'OpenPorchSF'
            'EnclosedPorch',
            '3SsnPorch'
            'ScreenPorch',
            'PoolArea',
            'MiscVal',
            'MoSold',
            'YrSold']
In [46]: X1=pd.DataFrame(ss.fit transform(test[con]))
In [47]: X2=pd.get dummies(test[cat],dtype='int')
To [40]: V-V1 ioin(V2)
```

```
In [49]:
                                              2
                                                       3
                                                                 4
                                                                           5
                                                                                     6
                                                                                              7
                                    1
                                                                                                        8
                                                                                                                  9 ... SaleType ConLw SaleTy
   Out[49]:
                 0 -1.730864 -0.874711
                                       0.555587
                                                 0.363929 -0.751101
                                                                    0.400766
                                                                             -0.340945 -1.072885
                                                                                                -0.570108
                                                                                                           0.063295
                                                                                                                                     0
                 1 -1.728490 -0.874711 0.604239
                                                 0.897861 -0.054877
                                                                    0.400766 -0.439695 -1.214908
                                                                                                  0.041273
                                                                                                           1.063392 ...
                                                                                                                                     0
                 2 -1 726115
                             0.061351
                                                 0.809646 -0.751101 -0.497418
                                                                              0.844059  0.678742  -0.570108
                                                                                                           0.773254 ...
                                                                                                                                     0
                                       0.263676
                 3 -1.723741
                             0.061351
                                       0.458284
                                                 0.032064
                                                          -0.054877
                                                                    0.400766
                                                                              0.876976
                                                                                        0.678742
                                                                                                -0.456889
                                                                                                           0.357829 ...
                                                                                                                                     0
                 4 -1.721367
                             1.465443 -1.244533
                                                -0.971808
                                                           1.337571 -0.497418
                                                                              0.679475
                                                                                        0.394694
                                                                                                -0.570108
                                                                                                                                     0
                                                                                                          -0.387298 ...
              1454
                   1.721367 2.401505 -2.314875 -1.591330 -1.447325
                                                                    1.298950 -0.044694 -0.646813 -0.570108 -0.965376 ...
                                                                                                                                     0
             1455
                    1.723741 2.401505 -2.314875 -1.599808 -1.447325 -0.497418 -0.044694 -0.646813 -0.570108 -0.411477 ...
                                                                                                                                     0
                                                                                                           1.724994 ...
                                                                                                                                     0
              1456
                    1.726115 -0.874711 4.447740
                                                 2.055150 -0.751101 1.298950 -0.373861
                                                                                        0.584059
                                                                                                -0.570108
                    1.728490
                             0.646389 -0.320147
                                                 0.125527 -0.751101 -0.497418
                                                                              0.679475
                                                                                        0.394694
                                                                                                -0.570108 -0.224645 ...
                                                                                                                                     0
             1458 1 730864 0 061351 0 263676 -0 038790 0 641347 -0 497418 0 712392 0 489377 -0 037980 0 700719
                                                                                                                                     0
             1459 rows × 270 columns
             cols to add=['MSSubClass', 'LotArea', 'OverallQual', 'OverallCond', 'MasVnrArea', 'BsmtFinSF1', 'BsmtFinSF2'
             for i in cols to add:
   In [51]:
                  X[i]=0
   In [52]:
              final preds=model.predict(X[cols keep])
   In [53]:
              final_preds
             array([180921.21450504, 180921.21450504, 180921.21450504,
                      180921.21450504, 180921.21450504, 180921.21450504])
             test["Predicted_sale_Price"]=final_preds
   In [54]:
   In [55]: test.head()
   Out[55]:
                   Id MSSubClass MSZoning LotFrontage LotArea Street Alley LotShape LandContour Utilities ... PoolArea PoolQC Fence MiscF
             0 1461
                               20
                                        RH
                                                    80.0
                                                           11622
                                                                  Pave
                                                                         Grvl
                                                                                   Reg
                                                                                                 LvI
                                                                                                      AllPub
                                                                                                                       0
                                                                                                                              Ex MnPrv
                                         RL
                                                           14267
                                                                                                      AllPub
                                                                                                                              Ex MnPrv
             1 1462
                               20
                                                    81.0
                                                                  Pave
                                                                         Grvl
                                                                                   IR1
                                                                                                 Lvl
                                         RI
                                                    74 0
                                                           13830
                                                                                                      AllPub
             2 1463
                               60
                                                                  Pave
                                                                                   IR1
                                                                                                                       0
                                                                                                                              Fx MnPrv
                                                                         GrvI
                                                                                                 ΙvΙ
             3 1464
                               60
                                         RL
                                                    78.0
                                                            9978
                                                                  Pave
                                                                         Grvl
                                                                                    IR1
                                                                                                 Lvl
                                                                                                      AllPub
                                                                                                                              Ex MnPrv
                                                                                                      AllPub ...
                                                    43.0
                                                                                                HLS
                                                                                                                              Ex MnPrv
              4 1465
                                         RL
                                                            5005
                                                                  Pave
                                                                         Grvl
                                                                                    IR1
             5 rows × 81 columns
   In [56]: test[["Id","Predicted_sale_Price"]].to_csv("C:/Users/ASUS/Downloads/Submission.csv")
   In [57]: pd.set_option("display.max_rows",5000)
Loading [MathJax]/jax/output/CommonHTML/fonts/TeX/fontdata.js
```