# 3blq7wmt1

November 13, 2023

### Mercedes- Benz Greener Manufacturing

#### 0.0.1 Description

Reduce the time a Mercedes-Benz spends on the test bench.

 Problem Statement Scenario: Since the first automobile, the Benz Patent Motor Car in 1886, Mercedes-Benz has stood for important automotive innovations. These include the passenger safety cell with a crumple zone, the airbag, and intelligent assistance systems. Mercedes-Benz applies for nearly 2000 patents per year, making the brand the European leader among premium carmakers. Mercedes-Benz is the leader in the premium car industry. With a huge selection of features and options, customers can choose the customized Mercedes-Benz of their dreams.

To ensure the safety and reliability of every unique car configuration before they hit the road, the company's engineers have developed a robust testing system. As one of the world's biggest manufacturers of premium cars, safety and efficiency are paramount on Mercedes-Benz's production lines. However, optimizing the speed of their testing system for many possible feature combinations is complex and time-consuming without a powerful algorithmic approach.

You are required to reduce the time that cars spend on the test bench. Others will work with a dataset representing different permutations of features in a Mercedes-Benz car to predict the time it takes to pass testing. Optimal algorithms will contribute to faster testing, resulting in lower carbon dioxide emissions without reducing Mercedes-Benz's standards.

Following actions should be performed:

- If for any column(s), the variance is equal to zero, then you need to remove those variable(s).
- Check for null and unique values for test and train sets.
- Apply label encoder.
- Perform dimensionality reduction.
- Predict your test\_df values using XGBoost.

```
[1]: #Import necessary Libraries
import numpy as np
import pandas as pd
import seaborn as sns
import matplotlib.pyplot as plt
import xgboost as xgb
from sklearn.preprocessing import LabelEncoder
from sklearn.feature_selection import VarianceThreshold
```

```
from sklearn.decomposition import PCA
     from sklearn.model_selection import train_test_split
     from sklearn.model_selection import GridSearchCV
     from sklearn.model_selection import KFold
     from sklearn.model_selection import RandomizedSearchCV
     from sklearn.metrics import make_scorer
     from sklearn.metrics import r2_score, mean_squared_error
     import warnings
[2]: #Suppressing warnings for better readability
     warnings.filterwarnings("ignore")
[3]: #Importing train_data
     train_df = pd.read_csv("train.csv")
     train_df.head()
[3]:
        ID
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                            X2 X3 X4 X5 X6 X8
                                                    X375
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     3
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     [5 rows x 378 columns]
[4]: #Importing test_data
     test_df = pd.read_csv("test.csv")
     test_df.head()
[4]:
                                                 X375
                                                       X376
                                                              X377
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        X382 X383
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     1
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           0
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```

```
0
     [5 rows x 377 columns]
[5]: test_df.shape
[5]: (4209, 377)
[6]: #Checking the data type of train_df
     train_df.dtypes
[6]: ID
               int64
             float64
    У
    ΧO
              object
    Х1
              object
    Х2
              object
    X380
               int64
    X382
               int64
    X383
               int64
    X384
               int64
    X385
               int64
    Length: 378, dtype: object
[7]: #Information about train_data
     train_df.info()
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 4209 entries, 0 to 4208
    Columns: 378 entries, ID to X385
    dtypes: float64(1), int64(369), object(8)
    memory usage: 12.1+ MB
[8]: #Printing categorical features in the dataset
     print("Categorical Features:")
     for i in train_df.columns:
         if train_df[i].dtypes == 'object':
             print(i)
    Categorical Features:
    ΧO
    X1
    Х2
    ХЗ
    Х4
    Х5
```

3

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0

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Х6
     Х8
 [9]: # Removing the columns 'ID' and 'y' from the data as they are not so important
      ⇔for learning
      X_train = train_df.drop(['ID','y'], axis =1)
      X_train.head()
 [9]:
         X0 X1 X2 X3 X4 X5 X6 X8
                                    X10
                                                  X375
                                                        X376
                                                              X377
                                                                     X378
                                                                           X379
                                         X11
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               X382
                    X383
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      [5 rows x 376 columns]
[10]: X_train.shape
[10]: (4209, 376)
[11]: #Storing the target feature in y_target
      y_train = train_df['y']
[12]: y_train.head()
[12]: 0
           130.81
      1
            88.53
      2
            76.26
      3
            80.62
            78.02
      4
      Name: y, dtype: float64
[13]: y_train_copy = y_train.copy()
[14]: y_train.head()
[14]: 0
           130.81
            88.53
      1
```

2

76.26

```
80.62
      3
      4
            78.02
      Name: y, dtype: float64
[15]: | id_test = test_df['ID'].values
[16]: X_test = test_df.drop('ID', axis = 1)
[17]: X_test.head()
Γ17]:
                                    X10
                                         X11
                                                  X375
                                                        X376
                                                               X377
                                                                     X378
                                                                           X379
         XO X1
                X2 X3 X4 X5 X6 X8
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      [5 rows x 376 columns]
[18]: X_test.shape
[18]: (4209, 376)
     0.0.2 Removing Features with Zero Variance
[19]: #Separating numerical features for applying VarianceThreshold
      X_train_numerical_features = X_train.iloc[:, 8:]
[20]: #Initializing VarianceThreshold with desired threshold (In this case it is Zero)
      var_thres = VarianceThreshold(threshold = 0)
[21]: #Fitting the VarianceThreshold to the numerical features
      var_thres.fit(X_train_numerical_features)
[21]: VarianceThreshold(threshold=0)
[22]: #Finding the non-constant features
      non_constant_features = X_train_numerical_features.columns[var_thres.
       →get_support()]
```

```
[23]: #Displaying the non-constant features
      print('Non-constant features: ', non_constant_features)
     Non-constant features: Index(['X10', 'X12', 'X13', 'X14', 'X15', 'X16', 'X17',
      'X18', 'X19', 'X20',
             'X375', 'X376', 'X377', 'X378', 'X379', 'X380', 'X382', 'X383', 'X384',
             'X385'],
            dtype='object', length=356)
[24]: constant_columns = [column for column in X_train_numerical_features.columns if
       -column not in X train numerical features.columns[var thres.get support()]]
[25]: for column in constant_columns:
          print(column)
     X11
     X93
     X107
     X233
     X235
     X268
     X289
     X290
     X293
     X297
     X330
     X347
[26]: X_train_numerical_features.drop(constant_columns, axis = 1, inplace = True)
[27]: #Displaying after removing the columns having zero variance
      X_train_numerical_features.head()
[27]:
         X10
              X12
                    X13
                         X14
                              X15
                                   X16
                                         X17
                                              X18
                                                   X19
                                                         X20
                                                                 X375
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[5 rows x 356 columns]

## 0.0.3 Applying Label Encoder

```
[28]: #Applying Label Encoder to categorical features
      LE = LabelEncoder()
[29]: X_train_categorical_features = X_train.iloc[:, 0:8]
[30]: X_train_categorical_features = X_train_categorical_features.apply(LE.
       →fit_transform)
[31]: X_train_categorical_features.head()
[31]:
         XΟ
                                  Х6
            Х1
                 Х2
                      X3 X4
                              Х5
                                      Х8
             23
                              24
      0
         32
                 17
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                                  11
             23 34
         20
                       5
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                              12
                                   3
                                      13
[32]: #Concatenating categorical and numerical features
      Final_X_train = pd.
       Goncat([X_train_categorical_features, X_train_numerical_features], axis = 1)
[33]: Final_X_train.head()
[33]:
         XΟ
             Х1
                 X2
                      ХЗ
                          Х4
                              Х5
                                  Х6
                                      Х8
                                           X10
                                                X12
                                                        X375
                                                               X376
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      [5 rows x 364 columns]
[34]: Final_X_train.shape
[34]: (4209, 364)
```

```
[35]: y_train.shape
[35]: (4209,)
     0.0.4 Applying the same preprocessing steps to the test data
[36]: X_test_categorical_features = X_test.iloc[:,0:8]
[37]: X_test_categorical_features.head()
[37]:
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        az
                n
                      d
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            1
         w s as c d y i m
[38]: X_test_categorical_features = X_test_categorical_features.apply(LE.
       →fit_transform)
[39]: X_test_categorical_features.head()
[39]:
        XO X1
                Х2
                    X3 X4
                            Х5
                                Х6
                                    Х8
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            23
                34
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                17
                            30
                                  8
                                    12
[40]: X_test.drop(X_test.iloc[:,0:8], axis = 1, inplace = True)
[41]: var_thres.transform(X_test)
[41]: array([[0, 0, 0, ..., 0, 0, 0],
             [0, 0, 0, ..., 0, 0, 0],
             [0, 0, 0, ..., 0, 0, 0],
             [0, 0, 0, ..., 0, 0, 0],
             [0, 0, 1, ..., 0, 0, 0],
             [0, 0, 0, ..., 0, 0, 0]], dtype=int64)
[42]: constant_columns = [column for column in X_test.columns if column not in X_test.
      →columns[var_thres.get_support()]]
      print(len(constant_columns))
```

```
[43]: for column in constant_columns:
           print(column)
     X11
      X93
     X107
     X233
     X235
      X268
     X289
     X290
     X293
     X297
     X330
      X347
[44]: X_test.drop(constant_columns, axis =1, inplace = True)
[45]: X_test.head()
[45]:
          X10
               X12
                     X13
                           X14
                                X15
                                      X16
                                            X17
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                                                             X20
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                       X380
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      3
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                                                      0
      [5 rows x 356 columns]
[46]: #Concatenating the categorical features and X_test
      Final_X_test=pd.concat([X_test_categorical_features,X_test],axis=1)
      Final_X_test.head()
[46]:
                                              X10
                                                             X375
                                                                    X376
                                                                           X377
          XΟ
                   X2
                       ХЗ
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X379
           X380
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[5 rows x 364 columns]

```
[47]: Final_X_test.head()
```

```
[47]:
           XΟ
                Х1
                     X2
                          ХЗ
                               X4
                                    Х5
                                         Х6
                                              Х8
                                                   X10
                                                         X12
                                                                   X375
                                                                          X376
                                                                                  X377
                                                                                         X378
           21
                23
                     34
                           5
                                    26
                                3
                                          0
                                              22
                                                     0
                                                                              0
                                                                                             1
       1
           42
                 3
                      8
                           0
                                3
                                     9
                                          6
                                              24
                                                     0
                                                            0
                                                                       0
                                                                              0
                                                                                      1
                                                                                             0
       2
           21
                23
                     17
                           5
                                3
                                     0
                                          9
                                               9
                                                     0
                                                            0
                                                                       0
                                                                              0
                                                                                      0
                                                                                             1
           21
                     34
                                3
                                                            0
                                                                       0
                                                                              0
                                                                                      0
                                                                                             1
       3
                13
                           5
                                    31
                                         11
                                              13
                                                     0
                20
                           2
                                3
                                              12
                                                                                      0
                                                                                             0
           45
                     17
                                    30
                                          8
                                                            0
                                                                       1
                                                                              0
```

```
X385
   X379
           X380
                   X382
                          X383
                                  X384
0
       0
               0
                                              0
                       0
                               0
                                      0
1
       0
               0
                       0
                               0
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                                              0
2
       0
               0
                       0
                              0
                                      0
                                              0
3
       0
               0
                       0
                               0
                                      0
                                              0
       0
               0
                       0
                               0
                                              0
                                      0
```

[5 rows x 364 columns]

```
[48]: Final_X_test.shape
```

[48]: (4209, 364)

### 0.0.5 Checking for Null Values and Unique Values in the train and test data

```
[49]: # Checking for missing values in the data
def check_missing_values(df):
    if df.isnull().sum().any() == True:
        print("There are missing values in the data")
    else:
        print("There are no missing values in the data")
```

```
[50]: check_missing_values(Final_X_train)
```

There are no missing values in the data

```
[51]: check_missing_values(Final_X_test)
```

There are no missing values in the data

```
[52]: # Function to check unique values in each column
      def check_unique_values(df):
          for column in df.columns:
              print(f"Unique values in {column}:", df[column].nunique())
[53]: check_unique_values(Final_X_train)
     Unique values in XO: 47
     Unique values in X1: 27
     Unique values in X2: 44
     Unique values in X3: 7
     Unique values in X4: 4
     Unique values in X5: 29
     Unique values in X6: 12
     Unique values in X8: 25
     Unique values in X10: 2
     Unique values in X12: 2
     Unique values in X13: 2
     Unique values in X14: 2
     Unique values in X15: 2
     Unique values in X16: 2
     Unique values in X17: 2
     Unique values in X18: 2
     Unique values in X19: 2
     Unique values in X20: 2
     Unique values in X21: 2
     Unique values in X22: 2
     Unique values in X23: 2
     Unique values in X24: 2
     Unique values in X26: 2
     Unique values in X27: 2
     Unique values in X28: 2
     Unique values in X29: 2
     Unique values in X30: 2
     Unique values in X31: 2
     Unique values in X32: 2
     Unique values in X33: 2
     Unique values in X34: 2
     Unique values in X35: 2
     Unique values in X36: 2
     Unique values in X37: 2
     Unique values in X38: 2
     Unique values in X39: 2
     Unique values in X40: 2
     Unique values in X41: 2
     Unique values in X42: 2
     Unique values in X43: 2
```

```
Unique values in X44: 2
Unique values in X45: 2
Unique values in X46: 2
Unique values in X47: 2
Unique values in X48: 2
Unique values in X49: 2
Unique values in X50: 2
Unique values in X51: 2
Unique values in X52: 2
Unique values in X53: 2
Unique values in X54: 2
Unique values in X55: 2
Unique values in X56: 2
Unique values in X57: 2
Unique values in X58: 2
Unique values in X59: 2
Unique values in X60: 2
Unique values in X61: 2
Unique values in X62: 2
Unique values in X63: 2
Unique values in X64: 2
Unique values in X65: 2
Unique values in X66: 2
Unique values in X67: 2
Unique values in X68: 2
Unique values in X69: 2
Unique values in X70: 2
Unique values in X71: 2
Unique values in X73: 2
Unique values in X74: 2
Unique values in X75: 2
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Unique values in X77: 2
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Unique values in X79: 2
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Unique values in X81: 2
Unique values in X82: 2
Unique values in X83: 2
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Unique values in X85: 2
Unique values in X86: 2
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Unique values in X88: 2
Unique values in X89: 2
Unique values in X90: 2
Unique values in X91: 2
Unique values in X92: 2
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Unique values in X99: 2
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Unique values in X101: 2
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Unique values in X137: 2
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Unique values in X194: 2
```

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Unique values in X195: 2
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Unique values in X245: 2
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Unique values in X296: 2
```

```
Unique values in X298: 2
Unique values in X299: 2
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Unique values in X301: 2
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     Unique values in X350: 2
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     Unique values in X371: 2
     Unique values in X372: 2
     Unique values in X373: 2
     Unique values in X374: 2
     Unique values in X375: 2
     Unique values in X376: 2
     Unique values in X377: 2
     Unique values in X378: 2
     Unique values in X379: 2
     Unique values in X380: 2
     Unique values in X382: 2
     Unique values in X383: 2
     Unique values in X384: 2
     Unique values in X385: 2
[54]: check_unique_values(Final_X_test)
     Unique values in XO: 49
     Unique values in X1: 27
     Unique values in X2: 45
     Unique values in X3: 7
     Unique values in X4: 4
     Unique values in X5: 32
     Unique values in X6: 12
     Unique values in X8: 25
```

Unique values in X10: 2

```
Unique values in X12: 2
Unique values in X13: 2
Unique values in X14: 2
Unique values in X15: 2
Unique values in X16: 2
Unique values in X17: 2
Unique values in X18: 2
Unique values in X19: 2
Unique values in X20: 2
Unique values in X21: 2
Unique values in X22: 2
Unique values in X23: 2
Unique values in X24: 2
Unique values in X26: 2
Unique values in X27: 2
Unique values in X28: 2
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Unique values in X46: 2
Unique values in X47: 2
Unique values in X48: 2
Unique values in X49: 2
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Unique values in X51: 2
Unique values in X52: 2
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Unique values in X54: 2
Unique values in X55: 2
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Unique values in X57: 2
Unique values in X58: 2
Unique values in X59: 2
Unique values in X60: 2
```

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Unique values in X61: 2
Unique values in X62: 2
Unique values in X63: 2
Unique values in X64: 2
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Unique values in X68: 2
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Unique values in X104: 2
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Unique values in X109: 2
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Unique values in X111: 2
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Unique values in X112: 2
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Unique values in X162: 2
Unique values in X163: 2
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Unique values in X203: 2
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Unique values in X205: 2
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Unique values in X248: 2
Unique values in X249: 2
Unique values in X250: 2
Unique values in X251: 2
Unique values in X252: 2
Unique values in X253: 2
Unique values in X254: 2
Unique values in X255: 2
Unique values in X256: 2
Unique values in X257: 1
Unique values in X258: 1
Unique values in X259: 2
Unique values in X260: 2
Unique values in X261: 2
```

```
Unique values in X262: 2
Unique values in X263: 2
Unique values in X264: 2
Unique values in X265: 2
Unique values in X266: 2
Unique values in X267: 2
Unique values in X269: 2
Unique values in X270: 2
Unique values in X271: 2
Unique values in X272: 2
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Unique values in X288: 2
Unique values in X291: 2
Unique values in X292: 2
Unique values in X294: 2
Unique values in X295: 1
Unique values in X296: 1
Unique values in X298: 2
Unique values in X299: 2
Unique values in X300: 2
Unique values in X301: 2
Unique values in X302: 2
Unique values in X304: 2
Unique values in X305: 2
Unique values in X306: 2
Unique values in X307: 2
Unique values in X308: 2
Unique values in X309: 2
Unique values in X310: 2
Unique values in X311: 2
Unique values in X312: 2
Unique values in X313: 2
Unique values in X314: 2
Unique values in X315: 2
```

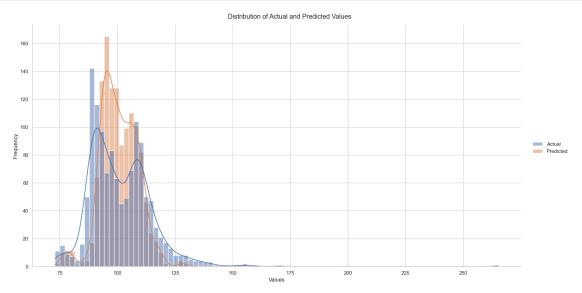
```
Unique values in X316: 2
Unique values in X317: 2
Unique values in X318: 2
Unique values in X319: 2
Unique values in X320: 2
Unique values in X321: 2
Unique values in X322: 2
Unique values in X323: 2
Unique values in X324: 2
Unique values in X325: 2
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Unique values in X359: 2
Unique values in X360: 2
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Unique values in X364: 2
Unique values in X365: 2
```

```
Unique values in X366: 2
     Unique values in X367: 2
     Unique values in X368: 2
     Unique values in X369: 1
     Unique values in X370: 2
     Unique values in X371: 2
     Unique values in X372: 2
     Unique values in X373: 2
     Unique values in X374: 2
     Unique values in X375: 2
     Unique values in X376: 2
     Unique values in X377: 2
     Unique values in X378: 2
     Unique values in X379: 2
     Unique values in X380: 2
     Unique values in X382: 2
     Unique values in X383: 2
     Unique values in X384: 2
     Unique values in X385: 2
[55]: ### Dimensionality Reduction Using PCA
[56]: pca = PCA(n_components=0.95)
[57]: pca.fit(Final_X_train)
[57]: PCA(n_components=0.95)
[58]: Final_X_train_transformed = pca.transform(Final_X_train)
[59]: Final_X_train_transformed.shape
[59]: (4209, 6)
[60]: Final_X_test_transformed=pca.transform(Final_X_test)
[61]: Final_X_test_transformed.shape
[61]: (4209, 6)
[62]: #Train-Test Split
     X_train, X_test, y_train, y_test = train_test_split(Final_X_train_transformed,_
```

#### 0.0.6 Model Building and Evaluation

```
[63]: # Building model using XGBoost on train data
[64]: | xgbr = xgb.XGBRegressor(objective='reg:linear', colsample bytree=0.5,__
       →learning_rate=0.2, max_depth=7, n_estimators=30)
[65]: xgbr.fit(X_train, y_train)
[65]: XGBRegressor(base score=None, booster=None, callbacks=None,
                   colsample bylevel=None, colsample bynode=None,
                   colsample_bytree=0.5, device=None, early_stopping_rounds=None,
                   enable categorical=False, eval metric=None, feature types=None,
                   gamma=None, grow_policy=None, importance_type=None,
                   interaction_constraints=None, learning_rate=0.2, max_bin=None,
                   max_cat_threshold=None, max_cat_to_onehot=None,
                   max_delta_step=None, max_depth=7, max_leaves=None,
                   min_child_weight=None, missing=nan, monotone_constraints=None,
                   multi_strategy=None, n_estimators=30, n_jobs=None,
                   num_parallel_tree=None, objective='reg:linear', ...)
[66]: | preds = xgbr.predict(X_test)
[67]: rmse = np.sqrt(mean squared error(y test, preds))
[68]: # Displaying model performance metrics
      print("RMSE: %f" % (rmse))
      print('r2_score: ', r2_score(y_test, preds))
     RMSE: 11.291051
     r2_score: 0.286889583619657
     Visualizing the Distribution of Actual and Predicted Values
[69]: # Creating a DataFrame for actual and predicted values
      data = {'Actual': y_test, 'Predicted': preds}
      df = pd.DataFrame(data)
[70]: # Setting the style and context for Seaborn
      sns.set(style="whitegrid")
      plt.figure(figsize=(12, 8))
[70]: <Figure size 1200x800 with 0 Axes>
     <Figure size 1200x800 with 0 Axes>
[71]: # Creating the distribution plot
      plot = sns.displot(data=df, kde=True, height=8, aspect=2)
```

```
plot.set_axis_labels("Values", "Frequency")
plot.fig.suptitle('Distribution of Actual and Predicted Values', y=1.02)
# Show the plot
plt.show()
```



#### 0.0.7 Hyperparameter Tuning using Grid Search

```
[72]: param_grid = {
    'learning_rate': [0.1, 0.2, 0.3],
    'max_depth': [5, 6, 7],
    'n_estimators': [20, 30, 40]
}
```

[73]: grid\_search = GridSearchCV(estimator=xgbr, param\_grid=param\_grid, cv=3,\_u on\_jobs=-1, verbose=2)

[74]: grid\_search.fit(X\_train, y\_train)

Fitting 3 folds for each of 27 candidates, totalling 81 fits

[74]: GridSearchCV(cv=3,

estimator=XGBRegressor(base\_score=None, booster=None, callbacks=None, colsample\_bylevel=None, colsample\_bynode=None, colsample\_bytree=0.5, device=None, early\_stopping\_rounds=None, enable\_categorical=False, eval\_metric=None, feature\_types=None, gamma=None, grow\_policy=None, importance\_type=None,

```
interaction_constraints=None,
                                          learning_rate=0.2, max...
                                          max_cat_threshold=None,
                                          max_cat_to_onehot=None, max_delta_step=None,
                                          max_depth=7, max_leaves=None,
                                          min_child_weight=None, missing=nan,
                                          monotone_constraints=None,
                                          multi_strategy=None, n_estimators=30,
                                          n_jobs=None, num_parallel_tree=None,
                                          objective='reg:linear', ...),
                   n_{jobs}=-1,
                   param_grid={'learning_rate': [0.1, 0.2, 0.3],
                               'max_depth': [5, 6, 7], 'n_estimators': [20, 30, 40]},
                   verbose=2)
[75]: # Getting the best parameters from grid search
      best_params = grid_search.best_params_
      print("Best parameters:", best_params)
     Best parameters: {'learning_rate': 0.1, 'max_depth': 7, 'n_estimators': 40}
[76]: # Building the model with the best parameters
      best_xgbr = xgb.XGBRegressor(objective='reg:linear', colsample_bytree=0.5,_
       →learning_rate=best_params['learning_rate'], max_depth=best_params['max_depth'], n_estimators=
[77]: best_xgbr.fit(X_train, y_train)
[77]: XGBRegressor(base_score=None, booster=None, callbacks=None,
                   colsample bylevel=None, colsample bynode=None,
                   colsample_bytree=0.5, device=None, early_stopping_rounds=None,
                   enable categorical=False, eval metric=None, feature types=None,
                   gamma=None, grow_policy=None, importance_type=None,
                   interaction_constraints=None, learning_rate=0.1, max_bin=None,
                   max_cat_threshold=None, max_cat_to_onehot=None,
                   max_delta_step=None, max_depth=7, max_leaves=None,
                   min_child_weight=None, missing=nan, monotone_constraints=None,
                   multi_strategy=None, n_estimators=40, n_jobs=None,
                   num_parallel_tree=None, objective='reg:linear', ...)
[78]: # Making predictions on the validation set with the best model
      best_preds = best_xgbr.predict(X_test)
[79]: best_rmse = np.sqrt(mean_squared_error(y_test, best_preds))
[80]: # Displaying the model performance after tuning
      print("Best RMSE after tuning: %f" % (best_rmse))
      print('Best r2_score after tuning: ', r2_score(y_test, best_preds))
```

```
Best RMSE after tuning: 11.252240
Best r2_score after tuning: 0.2917834921180851
```

After tuning the model we got the best RMSE, which is 11.25

#### 0.0.8 Predictions on Test Data

```
[81]: # Predict on test data using the best model
      test_preds = best_xgbr.predict(Final_X_test_transformed)
[82]: # Displaying the predictions on the test data
      print("Predictions on the test data:")
      print(test_preds)
     Predictions on the test data:
     [ 79.98787 105.03395
                             95.04669 ... 103.711685 104.94805 101.07462 ]
[83]: # Creating a DataFrame with the ID column and predictions
      output_df = pd.DataFrame({'ID': test_df['ID'], 'y': test_preds})
[84]: output_df
[84]:
              ID
      0
               1
                  79.987869
               2 105.033951
      1
      2
               3
                  95.046692
      3
               4
                  91.216881
               5 102.211876
      4204 8410 107.010094
      4205 8411 97.876816
      4206 8413 103.711685
      4207 8414 104.948051
```

[4209 rows x 2 columns]

4208 8416 101.074623

```
[85]: # Saving the DataFrame to a CSV file
output_df.to_csv('Prediction.csv', index=False)
```

Now, we will further attempt to reduce the RMSE by employing K-Fold Cross-Validation with RandomizedSearchCV to identify the best parameters.

```
[86]: # Again checking the shapes of transformed train data and target variable print("Shape of Final_X_train_transformed:", Final_X_train_transformed.shape) print("Shape of y_train:", y_train_copy.shape)
```

```
Shape of Final_X_train_transformed: (4209, 6) Shape of y_train: (4209,)
```

## 0.0.9 Kfold Cross Validation with RandomizedSearchCV to find the best parameters

```
[87]: # Set a random seed for reproducibility
     random state = 4242
[88]: # Splitting the data into training and validation sets
     X_train, X_valid, y_train, y_valid =
      →random_state=4242)
[89]: # Define a custom scoring function to calculate RMSE
     def rmse_scorer(y_true, y_pred):
         return np.sqrt(mean_squared_error(y_true, y_pred))
[90]: # Define the parameter grid for random search
     param dist = {
         'learning rate': [0.02, 0.05, 0.1, 0.2],
         'max_depth': [4, 5, 6, 7],
         'n estimators': [10, 20, 30, 40],
         'colsample_bytree': [0.45, 0.50, 0.6, 0.7, 1.0]
     }
[91]: # Create the XGBoost model
     xgbr = xgb.XGBRegressor(objective='reg:linear')
[92]: # Perform K-fold cross-validation with random search
     kf = KFold(n_splits=13, shuffle=True, random_state=4242)
[93]: random_search = RandomizedSearchCV(estimator=xgbr,__
       ⇒param_distributions=param_dist, n_iter=40, cv=kf, n_jobs=-1,
       scoring=make_scorer(rmse_scorer, greater_is_better=False), random_state=4242)
[94]: random_search.fit(X_train, y_train)
[94]: RandomizedSearchCV(cv=KFold(n_splits=13, random_state=4242, shuffle=True),
                        estimator=XGBRegressor(base_score=None, booster=None,
                                              callbacks=None,
                                              colsample_bylevel=None,
                                              colsample_bynode=None,
                                              colsample_bytree=None, device=None,
                                              early_stopping_rounds=None,
                                              enable_categorical=False,
                                              eval metric=None, feature types=None,
                                              gamma=None, grow_policy=None,
                                              importance type=...
                                              monotone_constraints=None,
                                              multi_strategy=None,
```

```
n_estimators=None, n_jobs=None,
                                                num_parallel_tree=None,
                                                objective='reg:linear', ...),
                         n_iter=40, n_jobs=-1,
                         param_distributions={'colsample_bytree': [0.45, 0.5, 0.6,
                                                                    0.7, 1.0],
                                               'learning_rate': [0.02, 0.05, 0.1, 0.2],
                                               'max_depth': [4, 5, 6, 7],
                                               'n_estimators': [10, 20, 30, 40]},
                         random_state=4242,
                         scoring=make_scorer(rmse_scorer, greater_is_better=False))
[95]: # Get the best parameters from random search
      best_params = random_search.best_params_
      print("Best parameters:", best_params)
     Best parameters: {'n_estimators': 40, 'max_depth': 5, 'learning_rate': 0.2,
     'colsample_bytree': 1.0}
[96]: # Train the final model with the best parameters
      xgbr_best = xgb.XGBRegressor(objective='reg:linear', **best_params)
[97]: xgbr_best.fit(X_train, y_train, eval_metric="rmse", eval_set=[(X_train,__

    y_train), (X_valid, y_valid)], early_stopping_rounds=1, verbose=True)

     [0]
             validation_0-rmse:12.14276
                                              validation_1-rmse:11.11439
     [1]
             validation_0-rmse:11.61985
                                              validation_1-rmse:10.58670
     [2]
             validation_0-rmse:11.23708
                                              validation_1-rmse:10.22761
     [3]
             validation 0-rmse:10.88403
                                              validation 1-rmse:9.91344
     [4]
             validation 0-rmse:10.63431
                                              validation_1-rmse:9.69145
     [5]
             validation 0-rmse:10.47990
                                              validation_1-rmse:9.58799
     [6]
             validation_0-rmse:10.26181
                                              validation_1-rmse:9.49428
     [7]
             validation 0-rmse:10.09721
                                              validation 1-rmse:9.41754
     [8]
             validation_0-rmse:10.00043
                                              validation_1-rmse:9.34202
     [9]
             validation 0-rmse:9.89744
                                              validation 1-rmse:9.27018
                                              validation_1-rmse:9.26285
     [10]
             validation_0-rmse:9.82136
             validation 0-rmse:9.71762
     [11]
                                              validation_1-rmse:9.24684
     [12]
             validation_0-rmse:9.61939
                                              validation_1-rmse:9.22065
                                              validation_1-rmse:9.19613
             validation_0-rmse:9.53394
     [13]
     [14]
             validation_0-rmse:9.39030
                                              validation_1-rmse:9.20527
[97]: XGBRegressor(base_score=None, booster=None, callbacks=None,
                   colsample_bylevel=None, colsample_bynode=None,
                   colsample_bytree=1.0, device=None, early_stopping_rounds=None,
                   enable_categorical=False, eval_metric=None, feature_types=None,
                   gamma=None, grow_policy=None, importance_type=None,
                   interaction_constraints=None, learning_rate=0.2, max_bin=None,
```

```
max_cat_threshold=None, max_cat_to_onehot=None,
max_delta_step=None, max_depth=5, max_leaves=None,
min_child_weight=None, missing=nan, monotone_constraints=None,
multi_strategy=None, n_estimators=40, n_jobs=None,
num_parallel_tree=None, objective='reg:linear', ...)
```

```
[98]: # Make predictions on the training set
preds_train = xgbr_best.predict(X_train)
```

```
[99]: # Make predictions on the validation set
preds_valid = xgbr_best.predict(X_valid)
```

```
[100]: # Calculate RMSE for the training set
rmse_train = rmse_scorer(y_train, preds_train)
print("RMSE on the training set:", rmse_train)
```

RMSE on the training set: 9.533944047798038

```
[101]: # Calculate RMSE for the validation set
rmse_valid = rmse_scorer(y_valid, preds_valid)
print("RMSE on the validation set:", rmse_valid)
```

RMSE on the validation set: 9.196126721821981

## 0.0.10 Predictions on Test Data Using XgBoost

```
[102]: # Make predictions on the test set
preds_test = xgbr_best.predict(Final_X_test_transformed)
```

```
[103]: # Display the predictions on the test data
print("Predictions on the test data:")
print(preds_test)
```

Predictions on the test data:
[ 80.018326 97.78724 97.737816 ... 104.67179 108.53205 98.01387 ]

```
[104]: # Creating a DataFrame with the ID column and predictions
FinalOutput = pd.DataFrame()
FinalOutput['ID'] = id_test
FinalOutput['y'] = preds_test
```

- [105]: # Saving the final predictions to a CSV file FinalOutput.to\_csv('Finalpredictions.csv', index=False)
- [106]: # Displaying the first 30 rows of the final predictions
  FinalOutput.head(30)

```
[106]:
           ID
       0
            1
                 80.018326
       1
            2
                 97.787239
       2
            3
                 97.737816
                 86.885231
       3
            4
       4
            5
                106.913811
       5
            8
                 93.962547
       6
           10
                 93.150291
       7
           11
                 94.715431
           12
               114.863129
       8
       9
           14
                96.264915
       10
           15
                114.549004
       11
           16
                104.512589
       12
           17
                100.101540
       13
           19
                 95.390556
       14
           20
                 99.948204
       15
           21
               100.372787
       16
           22
               117.756950
       17
           23
                100.101540
           26
                97.845894
       18
       19
           28
               104.686066
       20
           29
                100.101540
       21
           33
               100.101540
       22
           35
                101.978271
       23
           41
                100.101540
       24
           42
                103.070137
       25
           43
                111.051109
       26
           45
                98.807396
       27
                102.356476
           46
       28
           51
                 95.801765
       29
           53
                 97.737816
```