# XGBclassifier

# March 10, 2023

- 0.0.1 Here is the predictive model to distinguish between the main product categories in the dataset provided by the Otto Group company.
- 0.0.2 Provided dataset has 93 features and more than 2000,000 products.
- 0.0.3 For reducing high dimensionality, Linear Discriminant Analysis, a method of Dimensionality Reduction is used.
- 0.0.4 This model is built on the XG Boost Classifier algorithm, a popular and efficient algorithm which attempts to predict the target variable accurately.

# Importing Libraries...

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

# Loading data...

```
[3]:
              feat 1
                        feat 2
                                  feat_3
                                            feat_4
                                                      feat_5
                                                               feat 6
                                                                          feat_7
                                                                                    feat 8
                                                                                             feat 9
           1
                     1
                              0
                                        0
                                                  0
                                                            0
                                                                      0
                                                                                0
                                                                                          0
                                                                                                    0
      0
           2
                     0
                              0
                                        0
                                                  0
                                                            0
                                                                      0
                                                                                0
                                                                                          1
      1
                                                                                                    0
      2
           3
                    0
                              0
                                        0
                                                  0
                                                            0
                                                                      0
                                                                                0
                                                                                          1
                                                                                                    0
      3
           4
                    1
                              0
                                        0
                                                  1
                                                            6
                                                                      1
                                                                                5
                                                                                          0
                                                                                                    0
                                        0
                                                                      0
                                                                                          0
           5
                    0
                              0
                                                  0
                                                            0
                                                                                                    0
```

```
feat_85
                  feat_86
                            feat_87
                                        feat_88
                                                  feat_89
                                                              feat_90
                                                                         feat_91
                                               0
0
                         0
                                    0
1
              0
                         0
                                    0
                                               0
                                                          0
                                                                     0
                                                                                0
2
                         0
                                               0
                                                          0
              0
                                    0
                                                                     0
                                                                                0
3
              0
                         1
                                    2
                                               0
                                                          0
                                                                     0
                                                                                0
                         0
                                    0
                                               0
                                                                                0
              1
                                                                     1
```

```
feat_92 feat_93 target
0 0 0 Class_1
1 0 0 Class_1
```

```
2 0 0 Class_1
3 0 0 Class_1
4 0 0 Class_1
```

[5 rows x 95 columns]

```
[4]: data.columns
```

```
[4]: Index(['id', 'feat_1', 'feat_2', 'feat_3', 'feat_4', 'feat_5', 'feat_6',
            'feat_7', 'feat_8', 'feat_9', 'feat_10', 'feat_11', 'feat_12',
            'feat_13', 'feat_14', 'feat_15', 'feat_16', 'feat_17', 'feat_18',
            'feat_19', 'feat_20', 'feat_21', 'feat_22', 'feat_23', 'feat_24',
            'feat_25', 'feat_26', 'feat_27', 'feat_28', 'feat_29', 'feat_30',
            'feat_31', 'feat_32', 'feat_33', 'feat_34', 'feat_35', 'feat_36',
            'feat_37', 'feat_38', 'feat_39', 'feat_40', 'feat_41', 'feat_42',
            'feat_43', 'feat_44', 'feat_45', 'feat_46', 'feat_47', 'feat_48',
            'feat_49', 'feat_50', 'feat_51', 'feat_52', 'feat_53', 'feat_54',
            'feat_55', 'feat_56', 'feat_57', 'feat_58', 'feat_59', 'feat_60',
            'feat_61', 'feat_62', 'feat_63', 'feat_64', 'feat_65', 'feat_66',
            'feat_67', 'feat_68', 'feat_69', 'feat_70', 'feat_71', 'feat_72',
            'feat_73', 'feat_74', 'feat_75', 'feat_76', 'feat_77', 'feat_78',
            'feat_79', 'feat_80', 'feat_81', 'feat_82', 'feat_83', 'feat_84',
            'feat_85', 'feat_86', 'feat_87', 'feat_88', 'feat_89', 'feat_90',
            'feat_91', 'feat_92', 'feat_93', 'target'],
           dtype='object')
```

#### [5]: data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 61878 entries, 0 to 61877
Data columns (total 95 columns):

#	Column	Non-Null Count	Dtype
0	id	61878 non-null	int64
1	feat_1	61878 non-null	int64
2	feat_2	61878 non-null	int64
3	feat_3	61878 non-null	int64
4	feat_4	61878 non-null	int64
5	feat_5	61878 non-null	int64
6	feat_6	61878 non-null	int64
7	feat_7	61878 non-null	int64
8	feat_8	61878 non-null	int64
9	feat_9	61878 non-null	int64
10	feat_10	61878 non-null	int64
11	feat_11	61878 non-null	int64
12	feat_12	61878 non-null	int64
13	feat_13	61878 non-null	int64

```
14
    feat_14
             61878 non-null
                               int64
15
    feat_15
              61878 non-null
                               int64
    feat_16
             61878 non-null
16
                               int64
17
    feat_17
              61878 non-null
                               int64
    feat 18
              61878 non-null
                               int64
19
    feat_19
             61878 non-null
                               int64
20
    feat 20
              61878 non-null
                               int64
21
    feat_21
             61878 non-null
                               int64
22
    feat_22
             61878 non-null
                               int64
23
    feat_23
             61878 non-null
                               int64
24
    feat_24
             61878 non-null
                               int64
25
    feat_25
              61878 non-null
                               int64
26
    feat_26
             61878 non-null
                               int64
27
    feat_27
              61878 non-null
                               int64
28
    feat_28
             61878 non-null
                               int64
29
    feat_29
             61878 non-null
                               int64
30
    feat_30
             61878 non-null
                               int64
31
    feat_31
              61878 non-null
                               int64
    feat_32
32
              61878 non-null
                               int64
33
    feat 33
             61878 non-null
                               int64
34
    feat_34
              61878 non-null
                               int64
35
    feat 35
             61878 non-null
                               int64
36
    feat_36
             61878 non-null
                               int64
37
    feat_37
             61878 non-null
                               int64
38
             61878 non-null
    feat_38
                               int64
39
    feat_39
             61878 non-null
                               int64
                               int64
40
    feat_40
             61878 non-null
41
    feat_41
              61878 non-null
                               int64
42
    feat_42
             61878 non-null
                               int64
43
    feat_43
             61878 non-null
                               int64
44
    feat_44
             61878 non-null
                               int64
45
    feat_45
             61878 non-null
                               int64
46
    feat_46
             61878 non-null
                               int64
47
    feat_47
             61878 non-null
                               int64
    feat 48
             61878 non-null
48
                               int64
49
    feat 49
             61878 non-null
                               int64
    feat 50
             61878 non-null
                               int64
    feat_51
             61878 non-null
51
                               int64
52
    feat_52
             61878 non-null
                               int64
53
    feat_53
             61878 non-null
                               int64
54
    feat_54
             61878 non-null
                               int64
55
    feat_55
             61878 non-null
                               int64
56
             61878 non-null
    feat_56
                               int64
    feat_57
              61878 non-null
                               int64
58
    feat_58
             61878 non-null
                               int64
59
    feat_59
             61878 non-null
                               int64
60
    feat_60
             61878 non-null
                               int64
             61878 non-null
61
    feat_61
                               int64
```

```
63
         feat_63
                  61878 non-null
                                   int64
     64
         feat_64
                  61878 non-null
                                   int64
     65
         feat_65
                  61878 non-null
                                   int64
     66
         feat 66
                  61878 non-null
                                   int64
     67
         feat 67
                  61878 non-null
                                   int64
         feat 68
                  61878 non-null
                                   int64
     69
         feat_69
                  61878 non-null
                                   int64
     70
         feat_70
                  61878 non-null
                                   int64
     71
         feat_71
                  61878 non-null
                                   int64
     72
         feat_72
                  61878 non-null
                                   int64
     73
         feat_73
                  61878 non-null
                                   int64
     74
         feat_74
                  61878 non-null
                                   int64
     75
         feat_75
                  61878 non-null
                                   int64
     76
         feat_76
                  61878 non-null
                                   int64
         feat_77
                  61878 non-null
                                   int64
     78
         feat_78
                  61878 non-null
                                   int64
     79
         feat_79
                  61878 non-null
                                   int64
     80
         feat_80
                  61878 non-null
                                   int64
     81
         feat 81
                  61878 non-null
                                   int64
         feat_82
                  61878 non-null
                                   int64
     83
         feat 83
                  61878 non-null
                                   int64
         feat_84
                  61878 non-null
                                   int64
                  61878 non-null
     85
         feat_85
                                   int64
     86
         feat_86
                  61878 non-null
                                   int64
     87
         feat_87
                  61878 non-null
                                   int64
     88
         feat_88
                  61878 non-null
                                   int64
     89
         feat_89
                  61878 non-null
                                   int64
     90
                  61878 non-null
         feat_90
                                   int64
         feat_91
                  61878 non-null
                                   int64
     92
         feat_92
                  61878 non-null
                                   int64
     93
         feat_93
                  61878 non-null
                                   int64
        target
                   61878 non-null
                                   object
    dtypes: int64(94), object(1)
    memory usage: 44.8+ MB
[6]: nulldata = data.isnull().sum()
     print(nulldata[nulldata>0])
    Series([], dtype: int64)
[7]: data.target.value_counts()
[7]: Class_2
                16122
     Class_6
                14135
     Class 8
                 8464
     Class_3
                 8004
```

feat\_62

62

61878 non-null

int64

```
Class_9
                  4955
      Class_7
                  2839
      Class_5
                  2739
      {\tt Class\_4}
                  2691
      Class_1
                  1929
      Name: target, dtype: int64
     Separating dependent and independent variables
 [8]: x = data.drop('target',axis=1)
      y = data[['target']]
     Splitting the training data and validation data
 [9]: from sklearn.model selection import train test split
      x_train,x_valid,y_train,y_valid = train_test_split(x,y,test_size=0.2)
     Standardization
[10]: from sklearn.preprocessing import StandardScaler
      sc = StandardScaler()
      x_train = sc.fit_transform(x_train)
      x_valid = sc.transform(x_valid)
[11]: x_train.shape
[11]: (49502, 94)
[12]: data.shape
[12]: (61878, 95)
     Dimensionality Reduction
[13]: from sklearn.discriminant_analysis import LinearDiscriminantAnalysis
      lda = LinearDiscriminantAnalysis()
      x_train = lda.fit_transform(x_train,y_train)
      x_valid = lda.transform(x_valid)
     /opt/conda/lib/python3.7/site-packages/sklearn/utils/validation.py:993:
     DataConversionWarning: A column-vector y was passed when a 1d array was
     expected. Please change the shape of y to (n_samples, ), for example using
     ravel().
       y = column_or_1d(y, warn=True)
[14]: x_train.shape
[14]: (49502, 8)
```

```
Sorting Index
```

```
[15]: a = pd.DataFrame(y_train.value_counts())
      b = a.sort_index(axis=0)
      b.index
[15]: MultiIndex([('Class_1',),
                  ('Class_2',),
                  ('Class_3',),
                  ('Class_4',),
                  ('Class_5',),
                  ('Class_6',),
                  ('Class_7',),
                  ('Class_8',),
                  ('Class_9',)],
                 names=['target'])
     One Hot Encoding of the dependent variable
[16]: from sklearn.preprocessing import OneHotEncoder
      OHE = OneHotEncoder(handle_unknown='ignore',sparse=False)
      y_train = pd.DataFrame(OHE.fit_transform(y_train),columns = b.index)
      y_valid = pd.DataFrame(OHE.transform(y_valid),columns = b.index)
[17]: y_valid.head()
[17]: target Class_1 Class_2 Class_3 Class_4 Class_5 Class_6 Class_7 Class_8 Class_9
                 0.0
                         0.0
                                 0.0
                                         0.0
                                                  0.0
                                                          0.0
                                                                  0.0
                                                                          1.0
                                                                                  0.0
      0
                         1.0
                                         0.0
                                                  0.0
                                                                  0.0
                                                                          0.0
      1
                 0.0
                                 0.0
                                                          0.0
                                                                                  0.0
      2
                 0.0
                         0.0
                                 1.0
                                         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
      3
                 0.0
                 0.0
                         1.0
                                 0.0
                                         0.0
                                                  0.0
                                                          0.0
                                                                  0.0
                                                                          0.0
                                                                                  0.0
     XG Boost Classifier
[18]: from xgboost import XGBClassifier
[19]: my_model = XGBClassifier()
      my_model.fit(x_train,y_train)
      y_pred = my_model.predict(x_valid)
     Verifying Metrics
[20]: from sklearn.metrics import accuracy_score,
       →confusion_matrix,classification_report
      from sklearn.metrics import f1 score, precision score, recall score
[21]: print('Accuracy: ',accuracy_score(y_valid,y_pred))
      print('\nclassification report : \n',classification_report(y_valid,y_pred))
```

```
print('\nf1 score : \n',f1_score(y_valid,y_pred,average=None))
print('\nprecision_score : \n',precision_score(y_valid,y_pred,average=None))
print('\nrecall_score : \n',recall_score(y_valid,y_pred,average=None))
```

Accuracy: 0.989414996767938

classification report :

		precision	recall	f1-score	support
	•	0.00	4 00	0.00	000
	0	0.99	1.00	0.99	388
	1	1.00	0.99	0.99	3152
	2	0.98	0.99	0.98	1647
	3	0.97	0.97	0.97	541
	4	1.00	0.99	1.00	539
	5	1.00	0.99	1.00	2775
	6	0.98	0.98	0.98	603
	7	0.99	1.00	0.99	1685
	8	1.00	0.99	1.00	1046
micro	avg	0.99	0.99	0.99	12376
macro	avg	0.99	0.99	0.99	12376
weighted	avg	0.99	0.99	0.99	12376
samples	avg	0.99	0.99	0.99	12376

#### f1 score :

[0.99485861 0.99491902 0.98427102 0.96952909 0.99628253 0.99602888 0.97840532 0.99318922 0.99520614]

# precision\_score :

[0.99230769 0.99586777 0.98071127 0.96863469 0.9981378 0.99783002 0.98003328 0.99113475 0.99807692]

#### recall\_score :

[0.99742268 0.99397208 0.98785671 0.97042514 0.99443414 0.99423423 0.97678275 0.99525223 0.99235182]

/opt/conda/lib/python3.7/site-packages/sklearn/metrics/\_classification.py:1318: UndefinedMetricWarning: Precision and F-score are ill-defined and being set to 0.0 in samples with no predicted labels. Use `zero\_division` parameter to control this behavior.

\_warn\_prf(average, modifier, msg\_start, len(result))

# Implementing the model to the test data

```
x_test = lda.transform(x_test)
[23]: x_test = pd.DataFrame(x_test)
      1 = list(x test.index)
      indexlist = pd.DataFrame(1,columns = ['id'])
[24]: ind =
       →['Class_1','Class_2','Class_3','Class_4','Class_5','Class_6','Class_7','Class_8','Class_9']
     Predicting the test data
[25]: predictions = pd.DataFrame(my_model.predict(x_test),columns = ind)
[26]: predictions.head()
[26]:
         Class 1
                  Class_2 Class_3 Class_4 Class_5 Class_6 Class_7 Class_8 \
             0.0
                      1.0
                                0.0
                                         0.0
                                                  0.0
                                                            0.0
                                                                     0.0
                                                                              0.0
             1.0
                      0.0
                                         0.0
                                                  0.0
                                                            0.0
                                                                     0.0
                                                                              0.0
      1
                                0.0
      2
             1.0
                      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
                                                                     0.0
                                                                              0.0
      3
      4
             1.0
                      0.0
                                0.0
                                         0.0
                                                  0.0
                                                            0.0
                                                                     0.0
                                                                              0.0
         Class_9
      0
             0.0
             0.0
      1
      2
             0.0
      3
             0.0
      4
             0.0
[27]: sample = pd.read_csv('/kaggle/input/otto-group-product-classification-challenge/
       ⇔sampleSubmission.csv')
      sample.head()
[27]:
         id
             Class_1 Class_2 Class_3 Class_4 Class_5 Class_6 Class_7
                                                                              Class_8 \
          1
                   1
                            0
                                      0
                                                        0
                                                                  0
                                                                           0
                                                                                     0
      0
                                               0
          2
      1
                   1
                            0
                                      0
                                               0
                                                        0
                                                                  0
                                                                           0
                                                                                     0
                   1
                                      0
                                                        0
                                                                  0
                                                                           0
                                                                                     0
      2
          3
                            0
                                               0
      3
          4
                   1
                            0
                                      0
                                               0
                                                        0
                                                                  0
                                                                           0
                                                                                     0
                   1
                            0
                                      0
                                               0
                                                        0
                                                                  0
          5
                                                                           0
         Class_9
      0
               0
      1
               0
      2
               0
      3
               0
               0
```

```
[28]: x_test.head()
[28]:
                 0
                                       2
                                                  3
                                                              4
                                                                                    6 \
                            1
                                                                         5
      0 \; -9.580837 \; -0.467278 \; -0.992099 \quad 0.133397 \; -1.221610 \quad 0.324263 \quad 1.671230
      1 - 8.847654 \quad 1.354975 \quad -0.165058 \quad 1.131874 \quad 2.524327 \quad -0.472635 \quad -1.096662
      2 -8.556826 4.511615 1.041851 0.749542 1.865802 -0.234163 -0.401307
      3 - 9.510612 - 0.807562 - 1.101659 - 0.975898 0.459598 0.723522 - 1.317780
      4 -8.720170 -0.265293 -0.023465 -0.039500 3.749187 -1.060294 0.109233
                 7
      0 2.902215
      1 -0.771124
      2 -1.031381
      3 1.453158
      4 0.482871
[29]: output = pd.concat((indexlist,predictions),axis=1)
      output.to_csv('submission.csv',index=False,header=1)
 []:
```