Filterbasedpredictors

March 13, 2023

```
[2]: import numpy as np
       import pandas as pd
       import matplotlib.pyplot as plt
       import seaborn as sns
       %matplotlib inline
       from sklearn.model_selection import train_test_split
       from sklearn.feature_selection import mutual_info_regression, _
        →mutual_info_classif
[134]: #read dataset
       #data = pd.read_csv("/content/drive/MyDrive/CIND 820 Capstone Project/
        ⇒categoricaltonumericdata.csv")
       data = pd.read_csv("/content/drive/MyDrive/CIND 820 Capstone Project/
        →merged_completedata.csv")
       data.shape
[134]: (78032, 28)
[135]: data.head()
[135]:
                                                BusinessID \
          RecordID
                            X
                                          FID
                                                      1055
                 1 -79.689829
                               43.644181
                                             1
       1
                 2 -79.689419
                               43.644988
                                                      1057
       2
                 3 -79.689419
                               43.644988
                                             3
                                                      1058
       3
                 4 -79.689419
                               43.644988
                                                      1060
                 5 -79.690664
                               43.645493
                                                      1061
                                      Name
                                                       Address StreetNo \
       0
                          Golf Trends Inc.
                                            300 Ambassador Dr
                                                                     300
       1
                        Apex Graphics Inc.
                                             320 Ambassador Dr
                                                                     320
          Sands, John & Associates Limited 320 Ambassador Dr
                                                                     320
               Printmedia-Tackaberry Times 320 Ambassador Dr
       3
                                                                     320
                     S W R Industries Ltd.
                                             321 Ambassador Dr
                                                                     321
             StreetName BldgNo
                                             Fax TollFree EMail
                                                                 WebAddress
          Ambassador Dr
                            No
                                   905-795-8988
                                                      Yes
                                                            Yes
                                                                        Yes
          Ambassador Dr
                                   905-795-8775
                                                            Yes
                                                       No
                                                                        Yes
                            No
```

```
2 Ambassador Dr
                            905-795-8775
                                                                   No
                     No
                                                No
                                                      No
3 Ambassador Dr
                             905-564-7395
                                                      Yes
                                                                  Yes
                     No
                                                No
4 Ambassador Dr
                             905-564-5003
                                                      Yes
                     No
                        •••
                                                No
                                                                  Yes
   EmplRange
                   CENT_X
                                  CENT_Y
                                          Year isnew Closed
0
           3
             605668.2538
                           4.833187e+06
                                          2016
                                                  No
                                                          No
1
              605699.9370
                           4.833277e+06
                                          2016
                                                  No
                                                          No
2
           5
              605699.9370
                           4.833277e+06
                                          2016
                                                  No
                                                          No
3
             605699.9370
                           4.833277e+06
           1
                                          2016
                                                          No
                                                  No
              605598.6442 4.833332e+06
                                          2016
                                                  No
                                                          No
```

[5 rows x 28 columns]

[136]: data.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 78032 entries, 0 to 78031
Data columns (total 28 columns):

#	Column	Non-Null Count	Dtype
0	RecordID	78032 non-null	int64
1	X	78032 non-null	float64
2	Y	78032 non-null	float64
3	FID	78032 non-null	int64
4	${\tt BusinessID}$	78032 non-null	int64
5	Name	78032 non-null	object
6	Address	78032 non-null	object
7	StreetNo	78032 non-null	int64
8	${\tt StreetName}$	78032 non-null	object
9	BldgNo	78032 non-null	object
10	${\tt UnitNo}$	78032 non-null	object
11	PostalCode	78032 non-null	object
12	Location	78032 non-null	object
13	Ward	78032 non-null	int64
14	NAICSCode	78032 non-null	int64
15	NAICSCat	78032 non-null	object
16	NAICSDescr	78032 non-null	object
17	Phone	78032 non-null	object
18	Fax	78032 non-null	object
19	TollFree	78032 non-null	object
20	EMail	78032 non-null	object
21	WebAddress	78032 non-null	object
22	EmplRange	78032 non-null	int64
23	CENT_X	78032 non-null	float64
24	CENT_Y	78032 non-null	float64
25	Year	78032 non-null	int64
26	isnew	78032 non-null	object

```
27 Closed
                       78032 non-null object
      dtypes: float64(4), int64(8), object(16)
      memory usage: 16.7+ MB
[137]: #NAICSCode back to object as it is nominal not ordinal
       data['NAICSCode'] = data['NAICSCode'].astype(str)
[138]: #drop unique fields
       #data.drop(['FID', 'BusinessID', 'Name', 'Address', _
        →'StreetNo', 'StreetName', 'Location', 'Phone', 'Fax', 'NAICSDescr', 'EMail', 'NAICSCode', 'BldgNo',
        \Rightarrow axis=1, inplace=True)
       data.drop(['RecordID', 'FID', 'BusinessID', 'Name', 'Address', _

¬'StreetNo','StreetName','NAICSDescr'], axis=1, inplace=True)

[139]: data.info()
      <class 'pandas.core.frame.DataFrame'>
      RangeIndex: 78032 entries, 0 to 78031
      Data columns (total 20 columns):
                       Non-Null Count Dtype
           Column
       0
           Х
                       78032 non-null float64
       1
           Y
                       78032 non-null float64
       2
           BldgNo
                       78032 non-null object
       3
           UnitNo
                       78032 non-null object
           PostalCode 78032 non-null object
       4
       5
           Location
                       78032 non-null object
       6
           Ward
                       78032 non-null int64
       7
           NAICSCode
                       78032 non-null object
       8
           NAICSCat
                       78032 non-null object
       9
           Phone
                       78032 non-null object
       10
          Fax
                       78032 non-null
                                       object
          TollFree
                       78032 non-null
                                       object
       11
       12 EMail
                       78032 non-null object
                                       object
       13
          WebAddress 78032 non-null
       14 EmplRange
                       78032 non-null int64
       15 CENT_X
                       78032 non-null float64
       16 CENT Y
                       78032 non-null float64
       17
          Year
                       78032 non-null int64
       18
          isnew
                       78032 non-null object
       19 Closed
                       78032 non-null object
      dtypes: float64(4), int64(3), object(13)
      memory usage: 11.9+ MB
[140]: #decribe categorical data
       data.describe(include='0')
       #There is none if I get an error
```

```
78032
                       78032
                                  78032
                                                         78032
                                                                   78032
                                                                                  78032
       count
       unique
                    2
                           2
                                     37
                                                            56
                                                                      24
                                                                                     19
       top
                   No
                         Yes
                                    L4W
                                         Northeast EA (West)
                                                                      81
                                                                          Retail Trade
       freq
               73798
                       53665
                                  12410
                                                         21104
                                                                                  11071
                                                                    9052
               Phone
                         Fax TollFree EMail WebAddress
                                                          isnew Closed
               78032
                                78032
                                       78032
                                                   78032
                                                          78032
                                                                 78032
       count
                       78032
               25064
                                    2
                                            2
                                                               2
                                                                      2
       unique
                       15752
                                                       2
       top
                                   No
                                          Yes
                                                     Yes
                                                              No
                                                                     No
       freq
                                66596
                                       47406
                                                   56765 71148
                                                                 71617
                1457
                       29473
[141]: #if there is categorical data then factorize it
       data['WebAddress'] = pd.factorize(data['WebAddress'])[0]
       data['BldgNo'] = pd.factorize(data['BldgNo'])[0]
       data['Fax'] = pd.factorize(data['Fax'])[0]
       data['TollFree'] = pd.factorize(data['TollFree'])[0]
       data['UnitNo'] = pd.factorize(data['UnitNo'])[0]
       data['isnew'] = pd.factorize(data['isnew'])[0]
       data['Closed'] = pd.factorize(data['Closed'])[0]
       data['NAICSCode'] = pd.factorize(data['NAICSCode'])[0]
       data['NAICSCat'] = pd.factorize(data['NAICSCat'])[0]
       data['Location'] = pd.factorize(data['Location'])[0]
       data['Phone'] = pd.factorize(data['Phone'])[0]
       data['EMail'] = pd.factorize(data['EMail'])[0]
       data['PostalCode'] = pd.factorize(data['PostalCode'])[0]
[142]:
      data.head()
[142]:
                                 BldgNo
                                          UnitNo
                                                  PostalCode
                                                               Location
                                                                         Ward
       0 -79.689829
                     43.644181
                                      0
                                                            0
                                                                      0
                                                                             5
       1 -79.689419
                     43.644988
                                       0
                                               0
                                                            0
                                                                      0
                                                                             5
       2 -79.689419 43.644988
                                                            0
                                                                      0
                                                                             5
                                       0
                                               0
       3 -79.689419 43.644988
                                       0
                                               0
                                                            0
                                                                      0
                                                                             5
       4 -79.690664 43.645493
                                       0
                                               0
                                                            0
                                                                      0
                                                                             5
          NAICSCode
                     NAICSCat Phone Fax
                                            TollFree
                                                       EMail
                                                               WebAddress
                                                                           EmplRange
       0
                             0
                                    0
                                          0
                                                    0
                                                            0
                                                    1
                                                            0
                                                                        0
       1
                   1
                             1
                                    1
                                          1
                                                                                    4
       2
                                    2
                                          1
                                                    1
                                                                                    5
                   1
                             1
                                                            1
                                                                        1
                                          2
                                                                        0
       3
                   1
                             1
                                    3
                                                    1
                                                            0
                                                                                    1
                  0
                             0
                                    4
                                          3
                                                    1
                                                            0
                                                                        0
                                                                                    2
               CENT X
                              CENT Y
                                      Year
                                                    Closed
                                             isnew
          605668.2538
                       4.833187e+06
                                                          0
                                       2016
                                                 0
                                                          0
          605699.9370
                        4.833277e+06
                                       2016
                                                 0
          605699.9370 4.833277e+06
                                      2016
                                                 0
```

Location NAICSCode

NAICSCat

[140]:

BldgNo UnitNo PostalCode

```
4 605598.6442 4.833332e+06 2016
                                                         0
                                                 0
[143]: importances = data.drop('Closed', axis=1).apply(lambda x: x.corr(data.Closed))
       indices = np.argsort(importances)
       print(importances[indices])
      EmplRange
                    -0.047171
      Year
                    -0.043896
      CENT_Y
                    -0.033631
      Fax
                    -0.023913
      NAICSCode
                    -0.006639
      NAICSCat
                    -0.006051
      PostalCode
                    -0.004191
                    -0.004051
      Х
      Y
                    -0.002768
      TollFree
                     0.001339
      BldgNo
                     0.001632
      Ward
                     0.005117
      CENT_X
                     0.008961
      Phone
                     0.010661
      Location
                     0.011091
      WebAddress
                     0.021861
      EMail
                     0.022285
      isnew
                     0.027482
                     0.037975
      UnitNo
      dtype: float64
[148]: | #names=['UnitNo', 'isnew', 'EMail', 'WebAddress', 'Location', 'Phone', 'CENT_X', ___

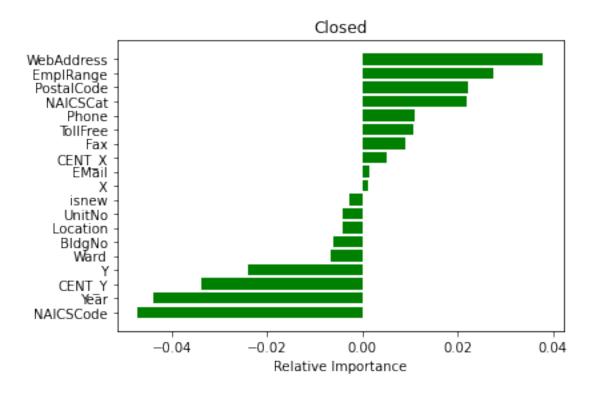
→ 'Ward',
□
        → 'BldgNo', 'TollFree', 'Y', 'X', 'PostalCode', 'NAICSCat', 'NAICSCode', 'Fax', 'CENT_Y', 'Year', 'Empl
       plt.title('Closed')
       plt.barh(range(len(indices)), importances[indices], color='g', align='center')
       plt.yticks(range(len(indices)), [names[i] for i in indices])
       plt.xlabel('Relative Importance')
```

0

0

3 605699.9370 4.833277e+06 2016

plt.show()



```
[145]: for i in range(0, len(indices)):
           if np.abs(importances[i])>0.2:
               print(names[i])
       #only WebAddress is close to 0.4!
[146]: X= data[ ['Fax', 'UnitNo', 'CENT_X', 'Phone', L

¬'NAICSCat','TollFree','WebAddress','PostalCode','CENT_Y', 'Ward']]

[147]: for i in range(0,len(X.columns)):
          for j in range(0,len(X.columns)):
               if i!=j:
                   corr_1=np.abs(X[X.columns[i]].corr(X[X.columns[j]]))
                   if corr 1 <0.3:
                       print( X.columns[i] , " is not correlated with ", X.columns[j])
                   elif corr 1>0.75:
                       print( X.columns[i] , " is highly correlated with ", X.

columns[i])

      Fax is not correlated with UnitNo
      Fax is not correlated with CENT_X
      Fax is not correlated with NAICSCat
      Fax is not correlated with
                                   TollFree
      Fax is not correlated with WebAddress
```

Fax is not correlated with PostalCode

Fax is not correlated with CENT_Y Fax is not correlated with Ward UnitNo is not correlated with Fax UnitNo is not correlated with CENT_X UnitNo is not correlated with Phone UnitNo is not correlated with NAICSCat UnitNo is not correlated with TollFree UnitNo is not correlated with WebAddress UnitNo is not correlated with PostalCode UnitNo is not correlated with CENT Y UnitNo is not correlated with Ward CENT_X is not correlated with Fax CENT_X is not correlated with UnitNo CENT X is not correlated with Phone CENT_X is not correlated with NAICSCat CENT_X is not correlated with TollFree CENT_X is not correlated with WebAddress CENT_X is not correlated with PostalCode CENT_X is not correlated with CENT_Y CENT X is highly correlated with Ward Phone is not correlated with UnitNo Phone is not correlated with CENT X Phone is not correlated with NAICSCat Phone is not correlated with TollFree Phone is not correlated with WebAddress Phone is not correlated with PostalCode Phone is not correlated with CENT Y Phone is not correlated with Ward NAICSCat is not correlated with Fax NAICSCat is not correlated with UnitNo NAICSCat is not correlated with CENT_X NAICSCat is not correlated with Phone NAICSCat is not correlated with TollFree NAICSCat is not correlated with WebAddress NAICSCat is not correlated with PostalCode NAICSCat is not correlated with CENT Y NAICSCat is not correlated with Ward TollFree is not correlated with Fax TollFree is not correlated with UnitNo TollFree is not correlated with CENT X TollFree is not correlated with Phone TollFree is not correlated with NAICSCat TollFree is not correlated with WebAddress TollFree is not correlated with PostalCode TollFree is not correlated with $CENT_Y$ TollFree is not correlated with Ward WebAddress is not correlated with Fax WebAddress is not correlated with UnitNo

```
WebAddress is not correlated with CENT_X
    WebAddress is not correlated with Phone
    WebAddress is not correlated with NAICSCat
    WebAddress is not correlated with TollFree
    WebAddress is not correlated with PostalCode
    WebAddress is not correlated with CENT Y
    WebAddress is not correlated with Ward
    PostalCode is not correlated with Fax
    PostalCode is not correlated with UnitNo
    PostalCode is not correlated with CENT_X
    PostalCode is not correlated with Phone
    PostalCode is not correlated with NAICSCat
    PostalCode is not correlated with TollFree
    PostalCode is not correlated with WebAddress
    PostalCode is not correlated with Ward
    CENT_Y is not correlated with Fax
    CENT_Y is not correlated with UnitNo
    CENT_Y is not correlated with CENT_X
    CENT_Y is not correlated with Phone
    CENT Y is not correlated with NAICSCat
    CENT Y is not correlated with
                                  TollFree
    CENT_Y is not correlated with WebAddress
    CENT_Y is not correlated with Ward
    Ward is not correlated with Fax
    Ward is not correlated with UnitNo
    Ward is highly correlated with CENT_X
    Ward is not correlated with Phone
    Ward is not correlated with NAICSCat
    Ward is not correlated with TollFree
    Ward is not correlated with WebAddress
    Ward is not correlated with PostalCode
    Ward is not correlated with CENT_Y
[]: X= dataset[['NAICSCat', 'acceleration', 'model year']]
```