# Filterbasedpredictors

#### March 17, 2023

```
[1]: 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
[103]: #read dataset
       data = pd.read_csv("/content/drive/MyDrive/CIND 820 Capstone Project/
        ⇔merged completedata.csv")
       data.shape
[103]: (78032, 28)
[104]: # filter dataframe to 2019 records
       data = data[data['Year'] >= 2019]
[105]: data.head()
[105]:
              RecordID
                                Х
                                           Y FID
                                                   BusinessID
       46689
                 46690 -79.665386 43.684736
                                                             7
                                                 1
       46690
                 46691 -79.642760
                                   43.593515
                                                 2
                                                          4246
       46691
                 46692 -79.667311
                                   43.682752
                                                 3
                                                            10
       46692
                 46693 -79.629235
                                   43.698932
                                                 4
                                                          4247
       46693
                 46694 -79.629235 43.698932
                                                 5
                                                          4250
                                     Name
                                                       Address
                                                              StreetNo \
       46689
                 Peel Car & Truck Rentals
                                             7050 Bramalea Rd
                                                                    7050
                    Real Fruit Bubble Tea 100 City Centre Dr
       46690
                                                                     100
       46691
                              Unifor 2002
                                             7015 Tranmere Dr
                                                                    7015
             Laura with Plus and Petites 100 City Centre Dr
       46692
                                                                     100
       46693
                                            100 City Centre Dr
                               Footlocker
                                                                     100
                  StreetName BldgNo ... Fax TollFree EMail WebAddress
                                                                         EmplRange
                 Bramalea Rd
                                Yes ...
                                        Yes
                                                  Yes
                                                        Yes
                                                                    Yes
       46689
                                                                                 1
```

```
46690 City Centre Dr
                         No ...
                                 No
                                          No
                                                No
                                                            Yes
                                                                         2
46691
         Tranmere Dr
                                Yes
                                                            Yes
                                                                         3
                                          Yes
                                                Yes
                          No
                                                                         2
                                                            Yes
46692
      City Centre Dr
                          No ...
                                 No
                                          No
                                                No
46693
      City Centre Dr
                                          No
                                                            No
                                                                         4
                          No ...
                                 No
                                                No
                          CENT_Y Year isnew Closed
           CENT_X
      607567.2334 4.837723e+06 2019
46689
                                         No
46690
      609556.5032 4.827621e+06 2019
                                        Yes
                                                No
46691
      607415.6044 4.837500e+06 2019
                                         No
                                                No
46692
      610454.8654 4.839347e+06 2019
                                         Yes
                                                No
46693 610454.8654 4.839347e+06 2019
                                         Yes
                                                No
```

[5 rows x 28 columns]

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

<class 'pandas.core.frame.DataFrame'>
Int64Index: 31343 entries, 46689 to 78031
Data columns (total 28 columns):

#	Column	Non-Null Count	Dtype
0	RecordID	31343 non-null	int64
1	X	31343 non-null	float64
2	Y	31343 non-null	float64
3	FID	31343 non-null	int64
4	${\tt BusinessID}$	31343 non-null	int64
5	Name	31343 non-null	object
6	Address	31343 non-null	object
7	StreetNo	31343 non-null	int64
8	${\tt StreetName}$	31343 non-null	object
9	BldgNo	31343 non-null	object
10	${\tt UnitNo}$	31343 non-null	object
11	PostalCode	31343 non-null	object
12	Location	31343 non-null	object
13	Ward	31343 non-null	int64
14	NAICSCode	31343 non-null	int64
15	NAICSCat	31343 non-null	object
16	NAICSDescr	31343 non-null	object
17	Phone	31343 non-null	object
18	Fax	31343 non-null	object
19	TollFree	31343 non-null	object
20	EMail	31343 non-null	object
21	WebAddress	31343 non-null	object
22	EmplRange	31343 non-null	int64
23	CENT_X	31343 non-null	float64
24	CENT_Y	31343 non-null	float64
25	Year	31343 non-null	int64

```
27 Closed
                       31343 non-null object
      dtypes: float64(4), int64(8), object(16)
      memory usage: 6.9+ MB
[107]: #NAICSCode back to object as it is nominal not ordinal
      data['NAICSCode'] = data['NAICSCode'].astype(str)
[108]: #drop unique fields
      data.drop(['RecordID','FID','BusinessID','Name','Address',__

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

[109]: data.info()
      <class 'pandas.core.frame.DataFrame'>
      Int64Index: 31343 entries, 46689 to 78031
      Data columns (total 19 columns):
           Column
                       Non-Null Count
                                       Dtype
           ----
                       _____
                                       ____
       0
           Х
                       31343 non-null float64
       1
           Υ
                       31343 non-null float64
       2
           BldgNo
                       31343 non-null
                                       object
       3
           UnitNo
                       31343 non-null
                                       object
       4
           PostalCode 31343 non-null
                                       object
       5
           Location
                       31343 non-null
                                       object
       6
           Ward
                       31343 non-null
                                       int64
       7
           NAICSCode
                       31343 non-null object
           NAICSCat
                       31343 non-null
                                       object
           Phone
                       31343 non-null
                                       object
       10 Fax
                       31343 non-null
                                       object
       11 TollFree
                       31343 non-null
                                       object
       12 EMail
                       31343 non-null
                                       object
          WebAddress 31343 non-null
       13
                                       object
           EmplRange
                       31343 non-null
                                       int64
       15
           CENT_X
                       31343 non-null
                                       float64
       16
           CENT Y
                       31343 non-null
                                       float64
       17
           isnew
                       31343 non-null
                                       object
       18 Closed
                       31343 non-null
                                       object
      dtypes: float64(4), int64(2), object(13)
      memory usage: 4.8+ MB
[110]: #decribe categorical data
      data.describe(include='0')
       #There is none if I get an error
```

31343 non-null object

26 isnew

「110**〕**:

count

BldgNo UnitNo PostalCode

31343

31343 31343

Location NAICSCode

31343

31343

NAICSCat \

31343

```
unique
                   2
                          2
                                    37
                                                                    24
                                                                                  19
       top
                  No
                        Yes
                                   L4W
                                        Northeast EA (West)
                                                                    81
                                                                        Retail Trade
       freq
               29769
                      20869
                                  5084
                                                        8325
                                                                  3576
                                                                                4377
               Phone
                        Fax TollFree EMail WebAddress isnew Closed
       count
               31343 31343
                               31343
                                      31343
                                                  31343 31343
                                                               31343
                   2
                          2
                                   2
                                          2
                                                     2
                                                             2
                                                                    2
       unique
       top
                 Yes
                        Yes
                                  No
                                        Yes
                                                   Yes
                                                            No
                                                                   Nο
               30965 19310
                               26636 19963
                                                  23174 28576 28629
       freq
[111]: #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]
[112]: #decribe categorical data
       data.describe(include='0')
       #There is none if I get an error
        ValueError
                                                  Traceback (most recent call last)
        <ipython-input-112-0c5d7d2ffda0> in <module>
              1 #decribe categorical data
        ---> 2 data.describe(include='0')
              3 #There is none if I get an error
        /usr/local/lib/python3.9/dist-packages/pandas/core/generic.py in describe(self,
         percentiles, include, exclude, datetime_is_numeric)
          10230
                        max
                                       NaN
          10231
                        return describe_ndframe(
        > 10232
          10233
                            obj=self,
          10234
                            include=include,
```

describe\_ndframe(obj, include, exclude, datetime\_is\_numeric, percentiles)

/usr/local/lib/python3.9/dist-packages/pandas/core/describe.py in\_

```
)
              92
              93
                                  result = describer.describe(percentiles=percentiles)
    --> 94
                                  return cast(NDFrameT, result)
              95
              96
/usr/local/lib/python3.9/dist-packages/pandas/core/describe.py in describe(self
    →percentiles)
           175
                                             col_names = reorder_columns(ldesc)
           176
--> 177
                                             d = concat(
           178
                                                         [x.reindex(col_names, copy=False) for x in ldesc],
           179
                                                         axis=1,
/usr/local/lib/python3.9/dist-packages/pandas/util/_decorators.py in_
    ⇔wrapper(*args, **kwargs)
           309
                                                                                stacklevel=stacklevel,
           310
 --> 311
                                                        return func(*args, **kwargs)
           312
           313
                                             return wrapper
/usr/local/lib/python3.9/dist-packages/pandas/core/reshape/concat.py in_
    aconcat(objs, axis, join, ignore_index, keys, levels, names, verify_integrity,
    ⇔sort, copy)
           345
                                  ValueError: Indexes have overlapping values: ['a']
           346
                                 op = Concatenator(
--> 347
           348
                                             objs,
           349
                                             axis=axis,
/usr/local/lib/python3.9/dist-packages/pandas/core/reshape/concat.py in in in in in in in its individual in its individu
    →__init__(self, objs, axis, join, keys, levels, names, ignore_index, u
    →verify_integrity, copy, sort)
           402
           403
                                             if len(objs) == 0:
 --> 404
                                                         raise ValueError("No objects to concatenate")
           405
           406
                                             if keys is None:
ValueError: No objects to concatenate
```

```
[113]: data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 31343 entries, 46689 to 78031
Data columns (total 19 columns):
```

#	Column	Non-Null Count	Dtype				
0	X	31343 non-null	float64				
1	Y	31343 non-null	float64				
2	BldgNo	31343 non-null	int64				
3	${\tt UnitNo}$	31343 non-null	int64				
4	PostalCode	31343 non-null	int64				
5	Location	31343 non-null	int64				
6	Ward	31343 non-null	int64				
7	NAICSCode	31343 non-null	int64				
8	NAICSCat	31343 non-null	int64				
9	Phone	31343 non-null	int64				
10	Fax	31343 non-null	int64				
11	TollFree	31343 non-null	int64				
12	EMail	31343 non-null	int64				
13	WebAddress	31343 non-null	int64				
14	EmplRange	31343 non-null	int64				
15	CENT_X	31343 non-null	float64				
16	CENT_Y	31343 non-null	float64				
17	isnew	31343 non-null	int64				
18	Closed	31343 non-null	int64				
d+:mag, floa+64(4) in+64(1E)							

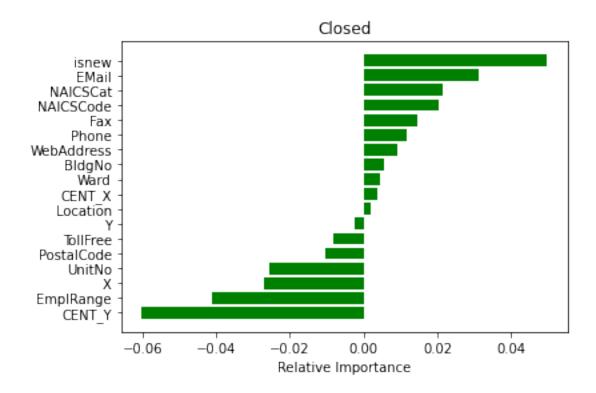
dtypes: float64(4), int64(15)

memory usage: 4.8 MB

## [114]: data.head()

aava.i	icaa()										
	Х	Y	BldgN	o Un	itNo	Posta	alCode	Location	Ward	\	
46689	-79.665386	43.684736		0	0		0	0	5		
46690	-79.642760	43.593515		1	0		1	1	4		
46691	-79.667311	43.682752		1	0		0	0	5		
46692	-79.629235	43.698932		1	0		1	2	4		
46693	-79.629235	43.698932		1	0		1	2	4		
	NAICSCode	NAICSCat	Phone	Fax	Toll	Free	EMail	WebAddres	s \		
46689	0	0	0	0		0	0		0		
46690	1	1	1	1		1	1		0		
46691	2	2	0	0		0	0		0		
46692	0	0	0	1		1	1		0		
46693	0	0	0	1		1	1		1		
	EmplRange	_	_	CE	NT_Y	isnev	7 Clos	ed			
46689	1	607567.233	34 4.8	37723	e+06	(	)	0			
46690	2	609556.503	32 4.8	27621	e+06	1	L	0			
46691	3	607415.604	44 4.8	37500	e+06	C	)	0			
46692	2	610454.865	54 4.8	39347	e+06	1	L	0			
46693	4	610454.865	54 4.8	39347	e+06	1	L	0			
	46689 46690 46691 46693 46690 46691 46689 46690 46691 46692	46689 -79.665386 46690 -79.642760 46691 -79.667311 46692 -79.629235  NAICSCode 46689 0 46690 1 46691 2 46692 0 46693 0  EmplRange 46689 1 46690 2 46690 2 46691 3 46690 2	X Y 46689 -79.665386 43.684736 46690 -79.642760 43.593515 46691 -79.667311 43.682752 46692 -79.629235 43.698932  NAICSCode NAICSCat 46689 0 0 46690 1 1 46691 2 2 46692 0 0 46693 0 0  EmplRange CENT 46689 1 607567.233 46690 2 609556.503 46691 3 607415.604 46692 2 610454.868	X Y BldgN 46689 -79.665386 43.684736 46690 -79.642760 43.593515 46691 -79.667311 43.682752 46692 -79.629235 43.698932 46693 -79.629235 43.698932 NAICSCode NAICSCat Phone 46689 0 0 0 0 46690 1 1 1 1 46691 2 2 0 46692 0 0 0 0 46693 0 0 0 0 EmplRange CENT_X 46689 1 607567.2334 4.8 46690 2 609556.5032 4.8 46691 3 607415.6044 4.8 46692 2 610454.8654 4.8	X Y BldgNo Un 46689 -79.665386 43.684736 0 46690 -79.642760 43.593515 1 46691 -79.667311 43.682752 1 46692 -79.629235 43.698932 1  NAICSCode NAICSCat Phone Fax 46689 0 0 0 0 0 46690 1 1 1 1 1 46691 2 2 0 0 46692 0 0 0 1 46693 0 0 0 1  EmplRange CENT_X CE 46689 1 607567.2334 4.837723 46690 2 609556.5032 4.827621 46691 3 607415.6044 4.837500 46692 2 610454.8654 4.839347	X Y BldgNo UnitNo 46689 -79.665386 43.684736 0 0 46690 -79.642760 43.593515 1 0 46691 -79.667311 43.682752 1 0 46692 -79.629235 43.698932 1 0 46693 -79.629235 43.698932 1 0  NAICSCode NAICSCat Phone Fax Toll 46689 0 0 0 0 0 46690 1 1 1 1 1 1 46691 2 2 0 0 46692 0 0 0 1 46693 0 0 0 1  EmplRange CENT_X CENT_Y 46689 1 607567.2334 4.837723e+06 46690 2 609556.5032 4.827621e+06 46691 3 607415.6044 4.837500e+06 46692 2 610454.8654 4.839347e+06	X Y BldgNo UnitNo Posta 46689 -79.665386 43.684736 0 0 46690 -79.642760 43.593515 1 0 46691 -79.667311 43.682752 1 0 46692 -79.629235 43.698932 1 0 46693 -79.629235 43.698932 1 0  NAICSCode NAICSCat Phone Fax TollFree 46689 0 0 0 0 0 0 46690 1 1 1 1 1 1 1 46691 2 2 0 0 0 0 46692 0 0 0 1 1 46693 0 0 0 1 1 46693 0 0 0 1 1 46693 0 0 0 1 1 46693 0 0 0 0 1 1 46693 0 0 0 0 1 1 46693 0 0 0 0 1 1 46693 0 0 0 0 1 1 46690 0 0 0 0 0 1 1 46690 0 0 0 0 0 1 1 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0 0	X Y BldgNo UnitNo PostalCode 46689 -79.665386 43.684736 0 0 0 0 46690 -79.642760 43.593515 1 0 1 46691 -79.667311 43.682752 1 0 0 0 46692 -79.629235 43.698932 1 0 1 46693 -79.629235 43.698932 1 0 1  NAICSCode NAICSCat Phone Fax TollFree EMail 46689 0 0 0 0 0 0 0 0 46690 1 1 1 1 1 1 1 1 1 46691 2 2 2 0 0 0 0 0 46692 0 0 0 1 1 1 1 46693 0 0 0 1 1 1 1  EmplRange CENT_X CENT_Y isnew Closs 46689 1 607567.2334 4.837723e+06 0 46690 2 609556.5032 4.827621e+06 1 46691 3 607415.6044 4.837500e+06 0 46692 2 610454.8654 4.839347e+06 1	X Y BldgNo UnitNo PostalCode Location 46689 -79.665386 43.684736 0 0 0 0 0 46690 -79.642760 43.593515 1 0 1 1 46691 -79.667311 43.682752 1 0 0 0 46692 -79.629235 43.698932 1 0 1 2 46693 -79.629235 43.698932 1 0 1 2  NAICSCode NAICSCat Phone Fax TollFree EMail WebAddres 46689 0 0 0 0 0 0 0 0 46690 1 1 1 1 1 1 1 1 1 46691 2 2 2 0 0 0 0 0 46692 0 0 0 1 1 1 1 46693 0 0 0 0 1 1 1 1 46693 0 0 0 0 1 1 1 1 46693 0 0 0 0 0 0 0 0 46690 1 0 0 0 0 0 0 46690 0 0 0 0 0 0 0 46692 0 0 0 0 1 1 1 0 46693 0 0 0 0 0 0 0 0 46694 0 0 0 0 0 0 0 0 46699 1 607567.2334 4.837723e+06 0 0 46690 2 609556.5032 4.827621e+06 1 0 46691 3 607415.6044 4.837500e+06 0 0 46692 2 610454.8654 4.839347e+06 1 0	X Y BldgNo UnitNo PostalCode Location Ward 46689 -79.665386 43.684736 0 0 0 0 0 0 5 46690 -79.642760 43.593515 1 0 1 1 1 4 46691 -79.667311 43.682752 1 0 0 0 0 0 5 46692 -79.629235 43.698932 1 0 1 2 4 46693 -79.629235 43.698932 1 0 1 2 4  NAICSCode NAICSCat Phone Fax TollFree EMail WebAddress \ 46689 0 0 0 0 0 0 0 0 0 0 0 46690 1 1 1 1 1 1 1 1 1 0 46691 2 2 2 0 0 0 0 0 0 0 46692 0 0 0 0 1 1 1 0 1 0 46693 0 0 0 0 1 1 1 1 1 1 0 46693 0 0 0 0 0 0 0 0 0 46690 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1	X

```
[115]: importances = data.drop('Closed', axis=1).apply(lambda x: x.corr(data.Closed))
       indices = np.argsort(importances)
       print(importances[indices])
      CENT_Y
                   -0.060260
      EmplRange
                   -0.041116
                   -0.026877
      UnitNo
                   -0.025721
      PostalCode
                   -0.010325
      TollFree
                   -0.008072
      γ
                   -0.002403
      Location
                   0.001719
      CENT X
                    0.003526
      Ward
                    0.004591
      BldgNo
                    0.005347
      WebAddress
                    0.009212
      Phone
                    0.011712
      Fax
                    0.014476
      NAICSCode
                    0.020264
      NAICSCat
                    0.021286
      EMail
                    0.031282
      isnew
                    0.049747
      dtype: float64
[116]: names=['X','Y','BldgNo','UnitNo','PostalCode','Location','Ward','NAICSCode','NAICSCat','Phone
       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')
       plt.show()
```



```
[136]: for i in range(0, len(indices)):
           if np.abs(importances[i])>0.04:
               print(names[i])
           #nothing is greater than .4 only 0.04! So nothing is correlated to Closed.
        →So all the code after this will yield nothing of significance.
      EmplRange
      CENT_Y
      isnew
[118]: X= data[ ['EmplRange', 'CENT_Y', 'isnew']]
[119]: 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:</pre>
                       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[j])
```

EmplRange is not correlated with CENT\_Y
EmplRange is not correlated with isnew

```
CENT_Y is not correlated with EmplRange CENT_Y is not correlated with isnew isnew is not correlated with EmplRange isnew is not correlated with CENT_Y
```

```
[132]: X = data[ ['EmplRange']]
[133]: y = data['Closed']

[134]: mi = mutual_info_regression(X, y)

[135]: mi = pd.Series(mi)
    mi.index = X.columns
    mi.sort_values(ascending=False)
    mi.sort_values(ascending=False).plot.bar(figsize=(10, 4))
```

#### [135]: <Axes: >

