### cs-binome-preproc

May 20, 2023

#### 1 Analyse et prétraitement des données

```
[1]: #pip install -U imbalanced-learn
    Requirement already satisfied: imbalanced-learn in
    c:\users\pappu\anaconda3\lib\site-packages (0.10.1)
    Requirement already satisfied: joblib>=1.1.1 in
    c:\users\pappu\anaconda3\lib\site-packages (from imbalanced-learn) (1.2.0)
    Requirement already satisfied: scipy>=1.3.2 in
    c:\users\pappu\anaconda3\lib\site-packages (from imbalanced-learn) (1.9.1)
    Requirement already satisfied: numpy>=1.17.3 in
    c:\users\pappu\anaconda3\lib\site-packages (from imbalanced-learn) (1.21.5)
    Requirement already satisfied: scikit-learn>=1.0.2 in
    c:\users\pappu\anaconda3\lib\site-packages (from imbalanced-learn) (1.0.2)
    Requirement already satisfied: threadpoolctl>=2.0.0 in
    c:\users\pappu\anaconda3\lib\site-packages (from imbalanced-learn) (2.2.0)
    Note: you may need to restart the kernel to use updated packages.
[2]: import pandas as pd
     from sklearn.model_selection import train_test_split
     from sklearn.preprocessing import StandardScaler
     from imblearn.over_sampling import SMOTE
[4]: # Load the dataset
     df = pd.read_csv("C:\LP-CIS\S6\Machine Learning &_
      GCyberSec\Devoir\CICIDS2017_Thursday-WorkingHours-Morning-WebAttacks.
      →pcap_ISCX.csv")
[5]: df.head()
[5]:
                          Flow Duration Total Fwd Packets
                                                             Total Backward Packets
        Destination Port
                     389
                                                                                 24
     0
                              113095465
                                                         48
     1
                     389
                              113473706
                                                         68
                                                                                 40
     2
                              119945515
                                                        150
                                                                                  0
                       0
     3
                     443
                               60261928
                                                          9
                                                                                  7
                      53
                                    269
                                                          2
```

```
Total Length of Fwd Packets Total Length of Bwd Packets \
     0
                                9668
                                                             10012
                               11364
     1
                                                             12718
     2
                                   0
                                                                 0
     3
                                2330
                                                              4221
     4
                                 102
                                                               322
        Fwd Packet Length Max Fwd Packet Length Min Fwd Packet Length Mean \
     0
                                                                    201.416667
                          403
                                                    0
     1
                          403
                                                    0
                                                                    167.117647
     2
                            0
                                                    0
                                                                      0.000000
     3
                          1093
                                                    0
                                                                    258.888889
     4
                           51
                                                   51
                                                                     51.000000
        Fwd Packet Length Std
                               ... min_seg_size_forward Active Mean \
                   203.548293
     0
                                                      32
                                                           203985.500
                   171.919413
                                                      32
     1
                                                           178326.875
     2
                     0.000000
                                                      0
                                                         6909777.333
     3
                   409.702161 ...
                                                      20
                                                                0.000
                     0.000000
                                                      32
                                                                0.000
          Active Std Active Max Active Min
                                                Idle Mean
                                                                Idle Std Idle Max
     0 5.758373e+05
                         1629110
                                          379 13800000.0 4.277541e+06
                                                                         16500000
     1 5.034269e+05
                                          325
                                               13800000.0 4.229413e+06
                         1424245
                                                                          16500000
     2 1.170000e+07
                        20400000
                                            6
                                               24400000.0 2.430000e+07
                                                                          60100000
     3 0.000000e+00
                                0
                                            0
                                                      0.0 0.000000e+00
     4 0.000000e+00
                                            0
                                                      0.0 0.000000e+00
                                0
                                                                                 0
        Idle Min
                  Label
         6737603 BENIGN
     0
         6945512 BENIGN
     1
     2
         5702188 BENIGN
     3
               0
                  BENIGN
               O BENIGN
     [5 rows x 79 columns]
[7]: # opimising the dataset's size
     import numpy as np
     df = df.copy()
     for column in df.columns:
         if df[column].dtype == np.int64:
             maxVal = df[column].max()
             if maxVal < 120:</pre>
                 df[column] = df[column].astype(np.int8)
             elif maxVal < 32767:</pre>
```

```
df[column] = df[column].astype(np.int16)
else:
    df[column] = df[column].astype(np.int32)

if df[column].dtype == np.float64:
    maxVal = df[column].max()
    minVal = df[df[column]>0][column]
    if maxVal < 120 and minVal>0.01 :
        df[column] = df[column].astype(np.float16)
else:
    df[column] = df[column].astype(np.float32)
```

# [8]: #after optimize of size df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 170366 entries, 0 to 170365
Data columns (total 79 columns):

#	Column	Non-Null Count	Dtype
0	Destination Port	170366 non-null	 int32
1	Flow Duration	170366 non-null	int32
2	Total Fwd Packets	170366 non-null	int32
3	Total Backward Packets	170366 non-null	int32
4	Total Length of Fwd Packets	170366 non-null	int32
5	Total Length of Bwd Packets	170366 non-null	int32
6	Fwd Packet Length Max		
7	Fwd Packet Length Min	170366 non-null	int16
8	Fwd Packet Length Mean	170366 non-null	float32
9	Fwd Packet Length Std	170366 non-null	float32
10	Bwd Packet Length Max	170366 non-null	int16
11	Bwd Packet Length Min	170366 non-null	int16
12	Bwd Packet Length Mean	170366 non-null	float32
13	Bwd Packet Length Std	170366 non-null	float32
14	Flow Bytes/s	170346 non-null	float32
15	Flow Packets/s	170366 non-null	float32
16	Flow IAT Mean	170366 non-null	float32
17	Flow IAT Std	170366 non-null	float32
18	Flow IAT Max	170366 non-null	int32
19	Flow IAT Min	170366 non-null	int32
20	Fwd IAT Total	170366 non-null	int32
21	Fwd IAT Mean	170366 non-null	float32
22	Fwd IAT Std	170366 non-null	float32
23	Fwd IAT Max	170366 non-null	int32
24	Fwd IAT Min	170366 non-null	int32
25	Bwd IAT Total	170366 non-null	int32
26	Bwd IAT Mean	170366 non-null	float32

27	Bwd IAT Std	170366 non-nul	l float32
28	Bwd IAT Max	170366 non-nul	l int32
29	Bwd IAT Min	170366 non-nul	l int32
30	Fwd PSH Flags	170366 non-nul	l int8
31	Bwd PSH Flags	170366 non-nul	l int8
32	Fwd URG Flags	170366 non-nul	l int8
33	Bwd URG Flags	170366 non-nul	l int8
34	Fwd Header Length	170366 non-nul	l int32
35	Bwd Header Length	170366 non-nul:	l int32
36	Fwd Packets/s	170366 non-nul:	l float32
37	Bwd Packets/s	170366 non-nul	l float32
38	Min Packet Length	170366 non-nul:	l int16
39	Max Packet Length	170366 non-nul:	l int16
40	Packet Length Mean	170366 non-nul	l float32
41	Packet Length Std	170366 non-nul:	l float32
42	Packet Length Variance	170366 non-nul:	l float32
43	FIN Flag Count	170366 non-nul:	l int8
44	SYN Flag Count	170366 non-nul:	l int8
45	RST Flag Count	170366 non-nul:	l int8
46	PSH Flag Count	170366 non-nul:	l int8
47	ACK Flag Count	170366 non-nul	l int8
48	URG Flag Count	170366 non-nul	l int8
49	CWE Flag Count	170366 non-nul:	l int8
50	ECE Flag Count	170366 non-nul:	l int8
51	Down/Up Ratio	170366 non-nul:	l int8
52	Average Packet Size	170366 non-nul	l float32
53	Avg Fwd Segment Size	170366 non-nul	l float32
54	Avg Bwd Segment Size	170366 non-nul	l float32
55	Fwd Header Length.1	170366 non-nul:	l int32
56	Fwd Avg Bytes/Bulk	170366 non-nul:	l int8
57	Fwd Avg Packets/Bulk	170366 non-nul	l int8
58	Fwd Avg Bulk Rate	170366 non-nul:	l int8
59	Bwd Avg Bytes/Bulk	170366 non-nul:	l int8
60	Bwd Avg Packets/Bulk	170366 non-nul	l int8
61	Bwd Avg Bulk Rate	170366 non-nul	l int8
62	Subflow Fwd Packets	170366 non-nul	l int32
63	Subflow Fwd Bytes	170366 non-nul	l int32
64	Subflow Bwd Packets	170366 non-nul	l int32
65	Subflow Bwd Bytes	170366 non-nul	l int32
66	<pre>Init_Win_bytes_forward</pre>	170366 non-nul	l int32
67	<pre>Init_Win_bytes_backward</pre>	170366 non-nul	l int32
68	act_data_pkt_fwd	170366 non-nul	l int32
69	min_seg_size_forward	170366 non-nul	l int8
70	Active Mean	170366 non-nul	l float32
71	Active Std	170366 non-nul	l float32
72	Active Max	170366 non-nul	l int32
73	Active Min	170366 non-nul	l int32
74	Idle Mean	170366 non-nul	l float32

```
75 Idle Std 170366 non-null float32
76 Idle Max 170366 non-null int32
77 Idle Min 170366 non-null int32
78 Label 170366 non-null object
dtypes: float32(24), int16(6), int32(28), int8(20), object(1)
memory usage: 40.3+ MB

# Feature selection
```

```
[9]: # Feature selection
     df = df[['Destination Port', 'Flow Duration', 'Total Fwd Packets', 'Total
      ⇔Backward Packets',
              'Total Length of Fwd Packets', 'Total Length of Bwd Packets', 'Fwd_{\sqcup}
      →Packet Length Max',
              'Fwd Packet Length Min', 'Fwd Packet Length Mean', 'Fwd Packet Length⊔
      ⇔Std',
              'Bwd Packet Length Max', 'Bwd Packet Length Min', 'Bwd Packet Length \sqcup
              'Bwd Packet Length Std', 'Flow Bytes/s', 'Flow Packets/s', 'Flow IAT_
      ⊸Mean',
              'Flow IAT Std', 'Flow IAT Max', 'Flow IAT Min', 'Fwd IAT Total', 'Fwd
      \hookrightarrowIAT Mean',
              'Fwd IAT Std', 'Fwd IAT Max', 'Fwd IAT Min', 'Bwd IAT Total', 'Bwd IAT
              'Bwd IAT Std', 'Bwd IAT Max', 'Bwd IAT Min', 'Fwd PSH Flags', 'Bwd PSH⊔

→Flags',
              'Fwd URG Flags', 'Bwd URG Flags', 'FIN Flag Count', 'SYN Flag Count',

¬'RST Flag Count',
              'PSH Flag Count', 'ACK Flag Count', 'URG Flag Count', 'Label']]
```

## [10]: #selecting the necessary columns : remaining 40 df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 170366 entries, 0 to 170365
Data columns (total 41 columns):

#	Column	Non-Null Count	Dtype
0	Destination Port	170366 non-null	int32
1	Flow Duration	170366 non-null	int32
2	Total Fwd Packets	170366 non-null	int32
3	Total Backward Packets	170366 non-null	int32
4	Total Length of Fwd Packets	170366 non-null	int32
5	Total Length of Bwd Packets	170366 non-null	int32
6	Fwd Packet Length Max	170366 non-null	int16
7	Fwd Packet Length Min	170366 non-null	int16
8	Fwd Packet Length Mean	170366 non-null	float32
9	Fwd Packet Length Std	170366 non-null	float32
10	Bwd Packet Length Max	170366 non-null	int16

```
12 Bwd Packet Length Mean
                                       170366 non-null
                                                       float32
      13
         Bwd Packet Length Std
                                       170366 non-null
                                                        float32
      14 Flow Bytes/s
                                                        float32
                                       170346 non-null
      15 Flow Packets/s
                                       170366 non-null float32
      16 Flow IAT Mean
                                       170366 non-null float32
         Flow IAT Std
                                       170366 non-null float32
      18 Flow IAT Max
                                       170366 non-null
                                                        int32
      19 Flow IAT Min
                                       170366 non-null int32
         Fwd IAT Total
                                       170366 non-null int32
      21 Fwd IAT Mean
                                       170366 non-null float32
      22 Fwd IAT Std
                                       170366 non-null float32
      23
         Fwd IAT Max
                                       170366 non-null int32
      24
         Fwd IAT Min
                                       170366 non-null
                                                       int32
         Bwd IAT Total
                                       170366 non-null
                                                        int32
                                       170366 non-null float32
         Bwd IAT Mean
      27
          Bwd IAT Std
                                       170366 non-null
                                                       float32
      28
         Bwd IAT Max
                                       170366 non-null
                                                       int32
      29
         Bwd IAT Min
                                       170366 non-null int32
      30
         Fwd PSH Flags
                                       170366 non-null int8
         Bwd PSH Flags
                                       170366 non-null
                                                       int8
      32 Fwd URG Flags
                                       170366 non-null int8
      33 Bwd URG Flags
                                       170366 non-null int8
      34 FIN Flag Count
                                       170366 non-null int8
      35
         SYN Flag Count
                                       170366 non-null int8
      36 RST Flag Count
                                       170366 non-null int8
      37
         PSH Flag Count
                                       170366 non-null int8
          ACK Flag Count
                                       170366 non-null
                                                       int8
      39
         URG Flag Count
                                       170366 non-null
                                                        int8
      40 Label
                                       170366 non-null object
     dtypes: float32(12), int16(4), int32(14), int8(10), object(1)
     memory usage: 21.1+ MB
[18]: df['Label'].value_counts()
[18]: BENIGN
                                    168186
                  Brute Force
                                     1507
      Web Attack
      Web Attack
                  XSS
                                      652
      Web Attack
                  Sql Injection
                                       21
      Name: Label, dtype: int64
[19]: from sklearn. preprocessing import LabelEncoder
      #from categorical data to numerical format
      label = LabelEncoder()
      df['Label'] = label.fit_transform(df['Label'])
      df['Label'].unique()
```

170366 non-null

int16

11 Bwd Packet Length Min

### [19]: array([0, 1, 3, 2])

```
[20]: #show missing data df.isnull().sum()
```

[20]:	Destination Port	0
	Flow Duration	0
	Total Fwd Packets	0
	Total Backward Packets	0
	Total Length of Fwd Packets	0
	Total Length of Bwd Packets	0
	Fwd Packet Length Max	0
	Fwd Packet Length Min	0
	Fwd Packet Length Mean	0
	Fwd Packet Length Std	0
	Bwd Packet Length Max	0
	Bwd Packet Length Min	0
	Bwd Packet Length Mean	0
	Bwd Packet Length Std	0
	Flow Bytes/s	20
	Flow Packets/s	0
	Flow IAT Mean	0
	Flow IAT Std	0
	Flow IAT Max	0
	Flow IAT Min	0
	Fwd IAT Total	0
	Fwd IAT Mean	0
	Fwd IAT Std	0
	Fwd IAT Max	0
	Fwd IAT Min	0
	Bwd IAT Total	0
	Bwd IAT Mean	0
	Bwd IAT Std	0
	Bwd IAT Max	0
	Bwd IAT Min	0
	Fwd PSH Flags	0
	Bwd PSH Flags	0
	Fwd URG Flags	0
	Bwd URG Flags	0
	FIN Flag Count	0
	SYN Flag Count	0
	RST Flag Count	0
	PSH Flag Count	0
	ACK Flag Count	0
	URG Flag Count	0
	Label	0
	dtype: int64	

```
[21]: # Handle missing data
      df['Flow Bytes/s'].fillna(df['Flow Bytes/s'].mean(),inplace=True)
[22]: #handle infinite values and NaN values
      df = df.replace([np.inf, -np.inf], np.nan)
      df = df.dropna()
[23]: df.isnull().sum()
[23]: Destination Port
                                      0
                                      0
      Flow Duration
      Total Fwd Packets
                                      0
      Total Backward Packets
                                      0
      Total Length of Fwd Packets
                                      0
     Total Length of Bwd Packets
                                      0
     Fwd Packet Length Max
                                      0
     Fwd Packet Length Min
                                      0
     Fwd Packet Length Mean
                                      0
     Fwd Packet Length Std
                                      0
     Bwd Packet Length Max
                                      0
     Bwd Packet Length Min
                                      0
     Bwd Packet Length Mean
                                      0
     Bwd Packet Length Std
                                      0
     Flow Bytes/s
                                      0
     Flow Packets/s
                                      0
      Flow IAT Mean
                                      0
      Flow IAT Std
                                      0
      Flow IAT Max
                                      0
      Flow IAT Min
                                      0
     Fwd IAT Total
                                      0
     Fwd IAT Mean
                                      0
     Fwd IAT Std
                                      0
     Fwd IAT Max
                                      0
     Fwd IAT Min
                                      0
      Bwd IAT Total
                                      0
      Bwd IAT Mean
                                      0
      Bwd IAT Std
                                      0
      Bwd IAT Max
                                      0
      Bwd IAT Min
                                      0
      Fwd PSH Flags
                                      0
      Bwd PSH Flags
                                      0
     Fwd URG Flags
                                      0
      Bwd URG Flags
                                      0
     FIN Flag Count
                                      0
      SYN Flag Count
                                      0
     RST Flag Count
                                      0
     PSH Flag Count
                                      0
```

```
ACK Flag Count
                                      0
      URG Flag Count
                                      0
                                      0
      Label
      dtype: int64
[24]: # find duplicated rows
      dup_rows = df.duplicated()
      df = df.drop_duplicates()
      print(dup_rows)
     0
               False
     1
               False
     2
               False
     3
               False
     4
               False
     170361
               False
     170362
               False
     170363
               False
     170364
                True
               False
     170365
     Length: 170231, dtype: bool
[25]: # check for duplicated columns
      duplicated_cols = df.T.duplicated()
      # get duplicated column names
      duplicated_col_names = df.columns[duplicated_cols].tolist()
      print("Duplicated column names:", duplicated_col_names)
     Duplicated column names: ['Fwd URG Flags', 'Bwd URG Flags', 'SYN Flag Count']
[31]: # drop duplicated columns and keep only one column
      df = df.drop(['Fwd URG Flags', 'Bwd URG Flags'], axis=1)
             Destination Port Flow Duration Total Fwd Packets \
     0
                           389
                                    113095465
                                                               48
     1
                           389
                                    113473706
                                                               68
     2
                             0
                                    119945515
                                                              150
     3
                           443
                                     60261928
                                                                9
                                                                2
     4
                            53
                                          269
                                                                3
     170360
                           443
                                          181
     170361
                         55641
                                           49
                                                                1
     170362
                         45337
                                          217
                                                                2
                                      1387547
     170363
                            22
                                                               41
     170365
                         60146
                                           50
                                                                1
```

```
Total Backward Packets \ Total Length of Fwd Packets \
0
                                                            9668
                              24
1
                              40
                                                           11364
2
                               0
                                                               0
3
                               7
                                                            2330
4
                               2
                                                             102
170360
                               1
                                                              18
170361
                               3
                                                               6
170362
                               1
                                                              31
170363
                              46
                                                            2728
                               2
                                                               0
170365
        Total Length of Bwd Packets
                                       Fwd Packet Length Max
0
                                10012
1
                                12718
                                                            403
2
                                                              0
                                     0
3
                                 4221
                                                           1093
                                   322
4
                                                             51
170360
                                     6
                                                              6
                                                              6
170361
                                    18
170362
                                     6
                                                             31
170363
                                 6634
                                                            456
170365
                                     0
                                                              0
                                 Fwd Packet Length Mean
                                                           Fwd Packet Length Std \
        Fwd Packet Length Min
0
                              0
                                               201.416672
                                                                        203.548294
1
                              0
                                               167.117645
                                                                        171.919418
2
                              0
                                                 0.00000
                                                                          0.000000
3
                              0
                                               258.888885
                                                                        409.702148
4
                             51
                                                                          0.000000
                                                51.000000
170360
                              6
                                                 6.000000
                                                                          0.000000
                              6
170361
                                                 6.000000
                                                                          0.000000
                              0
170362
                                                15.500000
                                                                         21.920311
170363
                              0
                                                66.536583
                                                                        110.129944
                              0
170365
                                                 0.00000
                                                                          0.000000
            Bwd IAT Min Fwd PSH Flags
                                          Bwd PSH Flags
                                                          FIN Flag Count
                       3
                                                       0
                                                                         0
0
                                       1
1
                       3
                                       1
                                                       0
                                                                         0
2
                       0
                                                       0
                                       0
                                                                         0
3
                                                                         0
                     48
                                       0
                       4
                                       0
                                                                         0
170360 ...
                       0
                                       0
                                                       0
                                                                         1
```

```
170361 ...
                                             0
                                                             0
                            1
                                                                               1
     170362
                            0
                                             1
                                                             0
                                                                               0
     170363
                            1
                                             0
                                                             0
                                                                               0
     170365
                            1
                                             0
                                                             0
                                                                               0
                               RST Flag Count PSH Flag Count
                                                                  ACK Flag Count
              SYN Flag Count
     0
                                              0
     1
                                                               0
                                                                                 1
     2
                            0
                                              0
                                                               0
                                                                                 0
     3
                            0
                                              0
                                                               1
                                                                                 0
     4
                            0
                                              0
                                                               0
                                                                                 0
     170360
                            0
                                              0
                                                               0
                                                                                 0
     170361
                            0
                                              0
                                                               0
                                                                                 0
     170362
                            1
                                              0
                                                               0
                                                                                 1
     170363
                            0
                                              0
                                                                                 0
                                                               1
     170365
                            0
                                                               0
                                                                                 1
              URG Flag Count Label
     0
                            0
                                    0
     1
                            0
                                    0
     2
                            0
                                    0
     3
                            0
                                    0
     4
                            0
                                    0
     170360
                                    0
                            0
     170361
                            0
                                    0
                            0
                                    0
     170362
     170363
                            0
                                    0
     170365
                                    0
      [159742 rows x 39 columns]
[33]: df.shape
[33]: (159742, 39)
[40]: #End of preprocessing step
      # Save the preprocessed dataset
      df.to_csv('preprocessed_dataset.csv', index=False)
```

[]: