

ICT607: Artificial Intelligence for Cybersecurity

Experiment 5

Lab 5: Preprocessing dataset – intrusion detection

Data preprocessing is the process of preparing raw data for analysis by applying various techniques to make the data more useful and meaningful. It involves transforming data into a format that can be easily analyzed by machine learning algorithms.

In this laboratory, we will preprocess the KDD Cup 1999 dataset, which is a widely used dataset for evaluating intrusion detection systems. It contains a sample of network traffic data from the DARPA 1998 Intrusion Detection System Evaluation, which aimed to evaluate the ability of intrusion detection systems to detect various types of network attacks.

The dataset includes network connections, each represented by 41 features. The connections are classified into one of five categories: normal, DoS, probe, R2L (unauthorized access from a remote machine), and U2R (unauthorized access to local superuser privileges).

The 41 features include basic features such as duration, protocol type, and service, as well as more detailed features such as number of failed login attempts, number of root accesses, and number of file creations. Some features are continuous, while others are categorical or binary.

1 Load and orgainse the dataset

Download the dataset from Kaggle. Unzip and upload $kddcup.data_10_percent.gz$ file into /content folder of your colab session.

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

```
[2]: df = pd.read_csv("kddcup.data_10_percent.gz")
    print(df.columns)
    df.head()
```



```
181
[2]:
        0 tcp http
                                5450 0.1
                                            0.2
                                                 0.3
                                                     0.4
                                                          ... 9.1
                                                                      1.00.1 0.00.6 \
                      SF
     0
        0
          tcp
               http
                      SF
                           239
                                 486
                                        0
                                              0
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                                                        0
                                                                  19
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                           235
                                                   0
                                                                  29
                                                                         1.0
                                                                                 0.0
     1
        0
          tcp
                http
                      SF
                                1337
                                        0
                                              0
                                                        0
                                                            . . .
     2
        0 tcp
                http
                      SF
                           219
                                                   0
                                                           . . .
                                                                         1.0
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                                1337
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                                              0
                                                        0
                                                                  39
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                                                                                 0.0
     3
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                      SF
                           217
                                2032
                                        0
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                                                        0
                                                                  49
        0 tcp http
                      SF
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                                                 0.00.11
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     1 0.03
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                          0.0
                                  0.0
                                            0.0
                                                     0.0
                                                          normal.
     2 0.03
                 0.0
                                  0.0
                                            0.0
                                                     0.0 normal.
                          0.0
     3 0.02
                 0.0
                                  0.0
                                            0.0
                                                     0.0 normal.
                          0.0
     4 0.02
                 0.0
                                  0.0
                                            0.0
                                                     0.0 normal.
                          0.0
     [5 rows x 42 columns]
[3]: df = pd.read_csv("kddcup.data_10_percent.gz", header=None)
     print(df.columns)
     df.head()
    Int64Index([ 0, 1, 2, 3, 4, 5, 6, 7, 8, 9, 10, 11, 12, 13, 14, 15, 16,
                 17, 18, 19, 20, 21, 22, 23, 24, 25, 26, 27, 28, 29, 30, 31, 32, 33,
                 34, 35, 36, 37, 38, 39, 40, 41],
                dtype='int64')
[3]:
        0
             1
                   2
                        3
                             4
                                   5
                                       6
                                            7
                                                8
                                                    9
                                                         . . .
                                                             32
                                                                   33
                                                                        34
                                                                              35
                                                                                   36
                                 5450
                                                     0
                                                               9
                                                                  1.0
                                                                            0.11
                 http
                        SF
                            181
                                        0
                                             0
                                                 0
                                                        . . .
                                                                       0.0
                                                                                  0.0
     0
            tcp
                            239
                                  486
                                             0
                                                 0
                                                                  1.0
                                                                      0.0
                                                                            0.05
     1
         0
            tcp
                 http
                        SF
                                        0
                                                     0
                                                             19
                                                                                  0.0
     2
            tcp
                 http
                        SF
                            235
                                 1337
                                             0
                                                 0
                                                             29
                                                                  1.0
                                                                       0.0
                                                                            0.03
                                                                                  0.0
     3
                            219
                                 1337
                                             0
                                                 0
                                                     0
                                                        . . .
                                                             39
                                                                  1.0
                                                                       0.0
                                                                            0.03
                                                                                  0.0
            tcp
                 http
                        SF
            tcp
                 http
                        SF
                            217
                                 2032
                                             0
                                                        . . .
                                                             49
                                                                  1.0
                                                                      0.0
                                                                            0.02
         37
              38
                   39
                         40
                                  41
     0
        0.0 0.0
                  0.0 0.0 normal.
            0.0
     1
        0.0
                  0.0
                       0.0 normal.
        0.0 0.0
                  0.0
                       0.0
                            normal.
        0.0
            0.0
                  0.0
                       0.0 normal.
     4 0.0 0.0
                  0.0 0.0 normal.
     [5 rows x 42 columns]
[4]: # feature_names found from https://www.kaggle.com/datasets/galaxyh/
      \rightarrow kdd-cup-1999-data?resource=download&select=kddcup.names
     feature_names=['duration', 'protocol_type', 'service',
      'flag', 'src_bytes', 'dst_bytes', 'land', 'wrong_fragment',
      'urgent', 'hot', 'num_failed_logins', 'logged_in', 'num_compromised',
      'root_shell', 'su_attempted', 'num_root', 'num_file_creations', 'num_shells',
```



```
'num_access_files', 'num_outbound_cmds', 'is_host_login',
      'is_guest_login', 'count', 'srv_count', 'serror_rate',
      'srv_serror_rate', 'rerror_rate', 'srv_rerror_rate', 'same_srv_rate',
      'diff_srv_rate', 'srv_diff_host_rate', 'dst_host_count',
      'dst_host_srv_count', 'dst_host_same_srv_rate',
      'dst_host_diff_srv_rate', 'dst_host_same_src_port_rate',
      'dst_host_srv_diff_host_rate', 'dst_host_serror_rate',
      'dst_host_srv_serror_rate', 'dst_host_rerror_rate',
      'dst_host_srv_rerror_rate', 'target']
[5]: # Load the dataset
     df = pd.read_csv("kddcup.data_10_percent.gz", names=feature_names)
[6]: df.head()
[6]:
        duration protocol_type service flag src_bytes dst_bytes
                                                                      land
                                                                5450
     0
               0
                            tcp
                                   http
                                           SF
                                                     181
                                                                         0
     1
               0
                            tcp
                                   http
                                           SF
                                                     239
                                                                 486
                                                                         0
     2
               0
                                           SF
                                                     235
                                                                1337
                            tcp
                                   http
                                                                1337
     3
               0
                            tcp
                                   http
                                           SF
                                                     219
                                                                         0
     4
               0
                            tcp
                                   http
                                           SF
                                                     217
                                                                2032
                                                                         0
                                      ... dst_host_srv_count
        wrong_fragment
                         urgent
                                 hot
     0
                      0
                              0
                                      . . .
                      0
                              0
                                                             19
     1
                                       . . .
     2
                      0
                              0
                                                             29
                                      . . .
     3
                      0
                              0
                                   0
                                                             39
                                      . . .
     4
                      0
                              0
                                                             49
                                    0
                                       . . .
        dst_host_same_srv_rate dst_host_diff_srv_rate
     0
                            1.0
                                                     0.0
                            1.0
                                                     0.0
     1
     2
                            1.0
                                                     0.0
     3
                            1.0
                                                     0.0
     4
                            1.0
                                                     0.0
        dst_host_same_src_port_rate dst_host_srv_diff_host_rate
     0
                                                                0.0
                                0.11
     1
                                0.05
                                                                0.0
     2
                                0.03
                                                                0.0
     3
                                0.03
                                                                0.0
     4
                                0.02
                                                                0.0
        dst_host_serror_rate dst_host_srv_serror_rate dst_host_rerror_rate \
     0
                                                                             0.0
                          0.0
                                                     0.0
     1
                          0.0
                                                     0.0
                                                                             0.0
     2
                          0.0
                                                     0.0
                                                                             0.0
```



0.0

```
4
                          0.0
                                                      0.0
                                                                             0.0
        dst_host_srv_rerror_rate
                                    target
     0
                              0.0 normal.
                              0.0 normal.
     1
     2
                              0.0 normal.
     3
                              0.0 normal.
     4
                              0.0 normal.
     [5 rows x 42 columns]
[7]: df['target'].value_counts()
[7]: smurf.
                          280790
     neptune.
                          107201
     normal.
                           97278
     back.
                            2203
     satan.
                            1589
     ipsweep.
                            1247
     portsweep.
                            1040
     warezclient.
                            1020
     teardrop.
                             979
                             264
     pod.
                             231
     nmap.
                              53
     guess_passwd.
     buffer_overflow.
                              30
     land.
                              21
     warezmaster.
                              20
                              12
     imap.
     rootkit.
                              10
     loadmodule.
                               9
     ftp_write.
                               8
                               7
     multihop.
                               4
     phf.
     perl.
                               3
     spy.
     Name: target, dtype: int64
[8]: # attack_types found from https://www.kaggle.com/datasets/galaxyh/
      \rightarrow kdd-cup-1999-data?resource=download&select=training_attack_types
     # dot (.) added with each type to match the dataset
     attack_types = {
         'normal.': 'normal',
         'back.': 'dos',
         'buffer_overflow.': 'u2r',
         'ftp_write.': 'r2l',
```

0.0

0.0

3

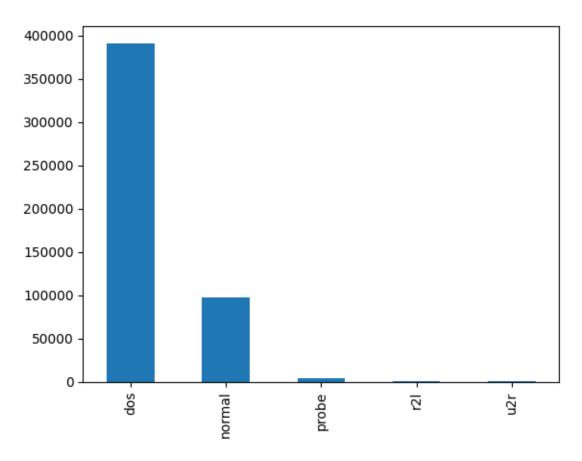


```
'guess_passwd.': 'r21',
          'imap.': 'r21',
          'ipsweep.': 'probe',
          'land.': 'dos',
          'loadmodule.': 'u2r',
          'multihop.': 'r21',
          'neptune.': 'dos',
          'nmap.': 'probe',
          'perl.': 'u2r',
          'phf.': 'r21',
          'pod.': 'dos',
          'portsweep.': 'probe',
          'rootkit.': 'u2r',
          'satan.': 'probe',
          'smurf.': 'dos',
          'spy.': 'r21',
          'teardrop.': 'dos',
          'warezclient.': 'r21',
          'warezmaster.': 'r21',
      }
 [9]: # adding attack_type column
      df['attack_type'] = df["target"].map(attack_types)
[10]: df.iloc[7600:7605, -2:]
[10]:
              target attack_type
      7600
           normal.
                          normal
      7601 neptune.
                             dos
      7602 neptune.
                             dos
      7603 normal.
                          normal
      7604
             normal.
                          normal
[11]: df.drop(['target'], axis=1, inplace=True)
[12]: df.head()
[12]:
         duration protocol_type service flag src_bytes dst_bytes land \
      0
                0
                            tcp
                                   http
                                          SF
                                                     181
                                                               5450
                                                                        0
      1
                0
                            tcp
                                   http
                                          SF
                                                     239
                                                                486
                                                                        0
      2
                0
                            tcp
                                   http
                                          SF
                                                     235
                                                               1337
                                                                        0
      3
                0
                            tcp
                                   http
                                           SF
                                                     219
                                                               1337
                                                                        0
      4
                                          SF
                                                     217
                                                               2032
                0
                            tcp
                                   http
                                                                        0
         wrong_fragment urgent hot ... dst_host_srv_count
      0
                      0
                              0
                                   0
                                      . . .
                      0
                              0
      1
                                                            19
                                   0 ...
```



```
2
                                                              29
                       0
                               0
                                    0
      3
                       0
                               0
                                                              39
      4
                       0
                               0
                                                              49
                                  dst_host_diff_srv_rate
         dst_host_same_srv_rate
      0
                             1.0
                                                       0.0
                                                       0.0
      1
                             1.0
      2
                                                       0.0
                             1.0
      3
                             1.0
                                                       0.0
      4
                             1.0
                                                       0.0
         dst_host_same_src_port_rate dst_host_srv_diff_host_rate \
      0
                                 0.11
                                 0.05
                                                                 0.0
      1
      2
                                 0.03
                                                                 0.0
      3
                                 0.03
                                                                 0.0
      4
                                  0.02
                                                                 0.0
         dst_host_serror_rate dst_host_srv_serror_rate dst_host_rerror_rate
      0
                           0.0
                                                       0.0
                                                                              0.0
                           0.0
                                                       0.0
                                                                              0.0
      1
      2
                           0.0
                                                       0.0
                                                                              0.0
      3
                           0.0
                                                       0.0
                                                                              0.0
      4
                                                                              0.0
                           0.0
                                                       0.0
         dst_host_srv_rerror_rate attack_type
                                          normal
      0
                               0.0
      1
                               0.0
                                          normal
      2
                               0.0
                                          normal
      3
                               0.0
                                          normal
      4
                               0.0
                                          normal
      [5 rows x 42 columns]
[13]: df['attack_type'].value_counts()
[13]: dos
                391458
                  97278
      normal
      probe
                   4107
      r21
                   1126
      u2r
                     52
      Name: attack_type, dtype: int64
[14]: # Visualisation
      df['attack_type'].value_counts().plot(kind="bar")
[14]: <Axes: >
```



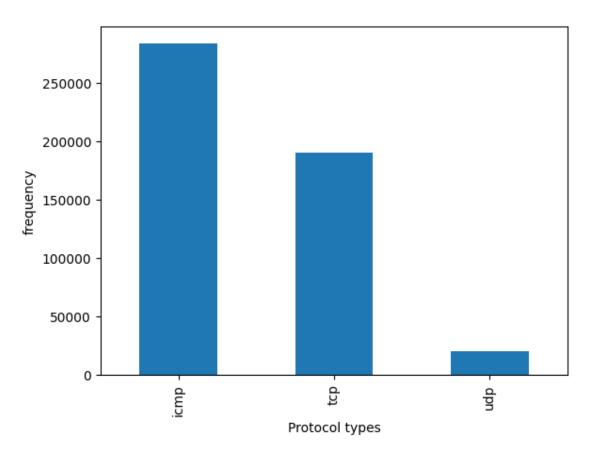


```
[15]: df['protocol_type'].value_counts().plot(kind="bar", xlabel="Protocol types",⊔

→ylabel="frequency")
```

[15]: <Axes: xlabel='Protocol types', ylabel='frequency'>





2 Removing NA values and constant features

```
[16]: df.isna().any().any() # checking NA values
[16]: False
[17]: df.isna().any()
[17]: duration
                                      False
                                      False
      protocol_type
      service
                                      False
      flag
                                      False
                                      False
      src_bytes
      dst_bytes
                                      False
      land
                                      False
      wrong_fragment
                                      False
      urgent
                                      False
      hot
                                      False
                                      False
      num_failed_logins
```



```
logged_in
                                      False
                                      False
      num_compromised
      root_shell
                                      False
                                      False
      su_attempted
                                      False
      num_root
      num_file_creations
                                      False
                                      False
      num_shells
      num_access_files
                                      False
                                      False
      num_outbound_cmds
                                      False
      is_host_login
      is_guest_login
                                      False
      count
                                      False
      srv_count
                                      False
      serror_rate
                                      False
                                      False
      srv_serror_rate
      rerror_rate
                                      False
                                      False
      srv_rerror_rate
      same_srv_rate
                                      False
      diff_srv_rate
                                      False
                                      False
      srv_diff_host_rate
                                      False
      dst_host_count
                                      False
      dst_host_srv_count
                                      False
      dst_host_same_srv_rate
                                      False
      dst_host_diff_srv_rate
      dst_host_same_src_port_rate
                                      False
      dst_host_srv_diff_host_rate
                                      False
      dst_host_serror_rate
                                      False
                                      False
      dst_host_srv_serror_rate
      dst_host_rerror_rate
                                      False
      dst_host_srv_rerror_rate
                                      False
                                      False
      attack_type
      dtype: bool
[18]: # df.dropna(...)
      # df.fillna(...)
[19]: keep_col = []
      for col in df:
          if df[col].nunique()>1:
            keep_col.append(col)
[20]: df = df[keep_col] # keep columns where there are more than 1 unique values
[21]: df.head()
[21]:
         duration protocol_type service flag src_bytes dst_bytes
                                                                      land \
      0
                            tcp
                                    http
                                           SF
                                                     181
                                                                5450
                                                                         0
```



```
239
                                                                 486
                                                                          0
1
           0
                         tcp
                                 http
                                         SF
2
           0
                                         SF
                                                    235
                                                                1337
                                                                          0
                         tcp
                                 http
3
                                                                          0
           0
                         tcp
                                 http
                                         SF
                                                    219
                                                                1337
4
           0
                                         SF
                                                    217
                                                                2032
                                                                          0
                         tcp
                                 http
   wrong_fragment
                     urgent
                                    ... dst_host_srv_count
                              hot
0
                  0
                           0
                                 0
                                     . . .
1
                  0
                           0
                                                             19
                                 0
                                    . . .
2
                  0
                           0
                                                             29
                                 0
3
                  0
                           0
                                 0
                                                             39
                                    . . .
4
                  0
                           0
                                                             49
                                     . . .
   dst_host_same_srv_rate dst_host_diff_srv_rate
0
                         1.0
                                                    0.0
1
                         1.0
                                                    0.0
2
                         1.0
                                                    0.0
3
                         1.0
                                                    0.0
4
                         1.0
                                                    0.0
   {\tt dst\_host\_same\_src\_port\_rate} \quad {\tt dst\_host\_srv\_diff\_host\_rate}
0
                             0.11
                                                                0.0
1
                             0.05
                                                                0.0
2
                             0.03
                                                                0.0
3
                             0.03
                                                                0.0
                             0.02
4
                                                                0.0
   dst_host_serror_rate dst_host_srv_serror_rate dst_host_rerror_rate \
0
                      0.0
                                                    0.0
                                                                              0.0
                      0.0
                                                    0.0
                                                                              0.0
1
2
                                                    0.0
                      0.0
                                                                              0.0
3
                      0.0
                                                    0.0
                                                                              0.0
4
                                                    0.0
                                                                              0.0
                      0.0
   dst_host_srv_rerror_rate
                                attack_type
0
                           0.0
                                      normal
1
                           0.0
                                       normal
2
                           0.0
                                      normal
3
                           0.0
                                      normal
4
                           0.0
                                      normal
```

[5 rows x 40 columns]



3 Removing highly-correlated features

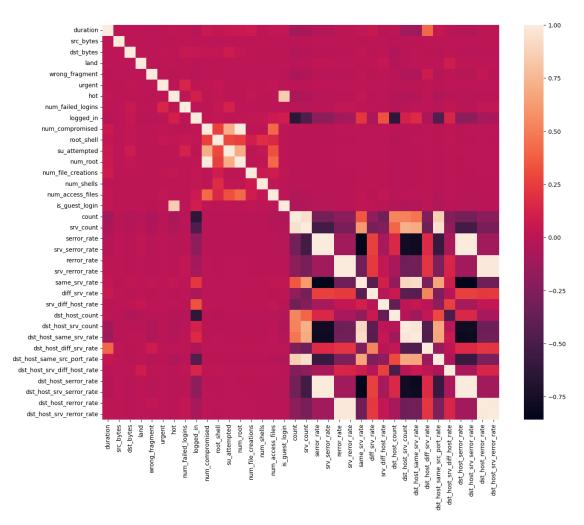
[22]: corr = df.corr(numeric_only=True) # Pearson correlation coefficient between the columns

plt.figure(figsize=(15, 12)) # creates a new figure with a specified size of 15□

inches by 12 inches.

sns.heatmap(corr) # creates a heatmap of the correlation matrix using seaborn

[22]: <Axes: >



[23]: df.corr(numeric_only=True).unstack().sort_values(ascending=False)

[23]: duration duration 1.000000
root_shell root_shell 1.000000
is_guest_login is_guest_login 1.000000
num_access_files num_access_files 1.000000



1.000000

```
dst_host_srv_serror_rate same_srv_rate
                                                        -0.857544
                                 dst_host_serror_rate -0.857835
      same_srv_rate
      dst_host_serror_rate
                                same_srv_rate
                                                        -0.857835
                                                         -0.858247
      same_srv_rate
                                 serror_rate
      serror_rate
                                 same_srv_rate
                                                         -0.858247
      Length: 1296, dtype: float64
[24]: # num_root is highly correlated with num_compromised and should be ignored for
      \hookrightarrow analysis.
      df.drop('num_root', axis = 1, inplace = True) # axis=1 specifies that we want to_
       \hookrightarrow drop the columns axis
      \# srv_serror_rate is highly correlated with serror_rate and should be ignored.
       \rightarrow for analysis.
      df.drop('srv_serror_rate', axis = 1, inplace = True)
      # srv_rerror_rate is highly correlated with rerror_rate and should be ignored_
       \rightarrow for analysis.
      df.drop('srv_rerror_rate', axis = 1, inplace=True)
      \# dst_host_srv_serror_rate is highly correlated with srv_serror_rate and should
      →be ignored for analysis.
      df.drop('dst_host_srv_serror_rate', axis = 1, inplace=True)
      # dst_host_serror_rate is highly correlated with rerror_rate and should be_
       \rightarrow ignored for analysis.
      df.drop('dst_host_serror_rate', axis = 1, inplace=True)
      # dst_host_rerror_rate is highly correlated with srv_rerror_rate and should be_
       \rightarrow ignored for analysis.
      df.drop('dst_host_rerror_rate', axis = 1, inplace=True)
      # dst_host_srv_rerror_rate is highly correlated with rerror_rate and should be_
       \rightarrow ignored for analysis.
      df.drop('dst_host_srv_rerror_rate', axis = 1, inplace=True)
      \# dst_host_same_srv_rate is highly correlated with dst_host_srv_count and should_\square
       →be ignored for analysis.
      df.drop('dst_host_same_srv_rate', axis = 1, inplace=True)
      # srv_count is highly correlated with count and should be ignored for analysis.
      df.drop('srv_count', axis = 1, inplace=True)
```

num_shells

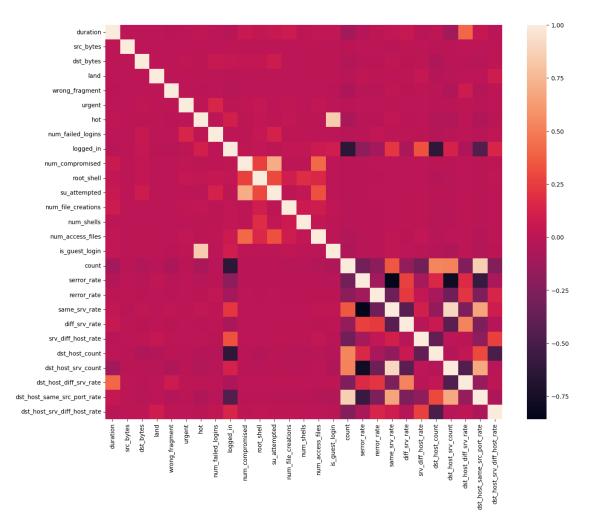
num_shells



[25]: corr = df.corr(numeric_only=True) # Pearson correlation coefficient between the columns

plt.figure(figsize=(15, 12)) # creates a new figure with a specified size of 15 correlation between the correlation matrix using seaborn

[25]: <Axes: >



[26]: df.head()

[26	6]:	duration	<pre>protocol_type</pre>	service	flag	<pre>src_bytes</pre>	dst_bytes	land	\
	0	0	tcp	http	SF	181	5450	0	
	1	0	tcp	http	SF	239	486	0	
	2	0	tcp	http	SF	235	1337	0	
	3	0	tcp	http	SF	219	1337	0	
	4	0	tcp	http	SF	217	2032	0	



```
wrong_fragment
                    urgent
                             hot
                                        rerror_rate same_srv_rate \
                                   . . .
0
                 0
                          0
                                   . . .
                                                 0.0
                                                                  1.0
                 0
                          0
                                                 0.0
                                                                  1.0
1
                                   . . .
2
                 0
                          0
                                0
                                                 0.0
                                                                  1.0
                                   . . .
3
                 0
                          0
                                                 0.0
                                0
                                                                  1.0
                                   . . .
4
                 0
                          0
                                0
                                                 0.0
                                                                  1.0
   diff_srv_rate srv_diff_host_rate
                                        dst_host_count
                                                          dst_host_srv_count
0
              0.0
                                    0.0
              0.0
1
                                    0.0
                                                       19
                                                                             19
2
              0.0
                                    0.0
                                                       29
                                                                             29
3
              0.0
                                    0.0
                                                       39
                                                                             39
4
              0.0
                                    0.0
                                                       49
                                                                             49
   dst_host_diff_srv_rate
                             dst_host_same_src_port_rate
0
                        0.0
                                                       0.11
1
                        0.0
                                                       0.05
2
                        0.0
                                                       0.03
3
                        0.0
                                                       0.03
4
                        0.0
                                                       0.02
   dst_host_srv_diff_host_rate attack_type
0
                             0.0
                                        normal
1
                             0.0
                                        normal
2
                             0.0
                                        normal
3
                             0.0
                                        normal
4
                             0.0
                                        normal
```

[5 rows x 31 columns]

4 Label encoding the features

[27]: df.dtypes [27]: duration int64 object protocol_type service object object flag int64 src_bytes dst_bytes int64 int64 land wrong_fragment int64 urgent int64 hot int64 num_failed_logins int64



```
logged_in
                                   int64
     num_compromised
                                   int64
     root_shell
                                   int64
     su_attempted
                                   int64
     num_file_creations
                                   int64
     num_shells
                                   int64
                                   int64
     num_access_files
     is_guest_login
                                   int64
     count
                                   int64
                                 float64
     serror_rate
                                 float64
     rerror_rate
                                 float64
     same_srv_rate
     diff_srv_rate
                                 float64
     srv_diff_host_rate
                                 float64
     dst_host_count
                                   int64
     dst_host_srv_count
                                   int64
     dst_host_diff_srv_rate
                                 float64
                                 float64
     dst_host_same_src_port_rate
     dst_host_srv_diff_host_rate
                                 float64
     attack_type
                                  object
     dtype: object
[28]: df['protocol_type'].value_counts()
[28]: icmp
            283602
     tcp
            190065
     udp
             20354
     Name: protocol_type, dtype: int64
[29]: pmap = {"icmp":0, "tcp":1, "udp":2}
     df['protocol_type'] = df['protocol_type'].map(pmap)
[30]: df['protocol_type'].value_counts()
[30]: 0
          283602
     1
          190065
           20354
     Name: protocol_type, dtype: int64
[31]: #flag feature mapping
     df['flag'] = df['flag'].map(fmap)
[32]: #attack type feature mapping
     amap = {'dos':0, 'normal':1, 'probe':2, 'r21':3, 'u2r':4}
     df['attack_type'] = df['attack_type'].map(amap)
```



```
[33]: df["service"].value_counts()
[33]: ecr_i
                 281400
      private
                 110893
      http
                  64293
      smtp
                    9723
      other
                   7237
      X11
                      11
      tim_i
                       7
      pm_dump
                       1
      tftp_u
                       1
      red_i
                       1
      Name: service, Length: 66, dtype: int64
[34]: df.drop('service', axis = 1, inplace= True)
[35]: df.dtypes
[35]: duration
                                        int64
      protocol_type
                                        int64
      flag
                                        int64
      src_bytes
                                        int64
                                        int64
      dst_bytes
      land
                                        int64
                                        int64
      wrong_fragment
      urgent
                                        int64
                                        int64
      hot
      num_failed_logins
                                        int64
      logged_in
                                        int64
      num_compromised
                                        int64
      root_shell
                                        int64
      su_attempted
                                        int64
      num_file_creations
                                        int64
      num_shells
                                        int64
      num_access_files
                                        int64
      is_guest_login
                                        int64
      count
                                        int64
                                      float64
      serror_rate
                                      float64
      rerror_rate
                                      float64
      same_srv_rate
                                      float64
      diff_srv_rate
      srv_diff_host_rate
                                      float64
      dst_host_count
                                        int64
      dst_host_srv_count
                                        int64
      dst_host_diff_srv_rate
                                      float64
      dst_host_same_src_port_rate
                                      float64
```



dtype: object

5 Scaling

[36]:	<pre>df.describe()</pre>									
[36]:		duration	protocol_type	flag	g src_byt	ces \				
	count	494021.000000	494021.000000	494021.00000	-					
	mean	47.979302	0.467132	0.297730		-03				
	std	707.746472	0.575606	0.597424	4 9.882181e+	-05				
	min	0.000000	0.000000	0.000000	0.00000e+	-00				
	25%	0.000000	0.000000	0.000000	0 4.500000e+	-01				
	50%	0.000000	0.000000	0.000000	5.200000e+	-02				
	75%	0.000000	1.000000	0.000000	0 1.032000e+	-03				
	max	58329.000000	2.000000	10.000000	0 6.933756e+	-08				
		dst_bytes	land	wrong_fragment	t urg	gent \				
	count	4.940210e+05	494021.000000	494021.000000						
	mean	8.685324e+02	0.000045	0.006433	0.000	0014				
	std	3.304000e+04	0.006673	0.134809	0.005	5510				
	min	0.000000e+00	0.000000	0.000000	0.000	0000				
	25%	0.000000e+00	0.000000	0.000000	0.000	0000				
	50%	0.000000e+00	0.000000	0.000000	0.000	0000				
	75%	0.000000e+00	0.000000	0.000000	0.000	0000				
	max	5.155468e+06	1.000000	3.000000	3.000	0000				
		hot	num_failed_log	gins re	error_rate s	same_srv_rate \				
	count	494021.000000	494021.000	000 4940	021.000000 4	194021.000000				
	mean	0.034519	0.000	152	0.057433	0.791547				
	std	0.782103	0.015	5520	0.231623	0.388189				
	min	0.000000	0.000	0000	0.000000	0.000000				
	25%	0.000000	0.000	0000	0.000000	1.000000				
	50%	0.000000	0.000	0000	0.000000	1.000000				
	75%	0.000000	0.000	0000	0.000000	1.000000				
	max	30.000000	5.000	0000	1.000000	1.000000				
		diff_srv_rate	srv_diff_host_	rate dst_host	t_count dst_	host_srv_count	\			
	count	494021.000000	494021.00	00000 494021	.000000	494021.000000				
	mean	0.020982	0.02	232	. 470778	188.665670				
	std	0.082205	0.14	2397 64	.745380	106.040437				
	min	0.000000	0.00	00000	.000000	0.000000				
	25%	0.000000	0.00	00000 255	.000000	46.000000				
	50%	0.000000			.000000	255.000000				
	75%	0.000000	0.00	00000 255	.000000	255.000000				



255.000000

dst_host_diff_srv_rate dst_host_same_src_port_rate 494021.000000 494021.000000 count 0.030906 0.601935 mean std 0.109259 0.481309 min 0.00000 0.00000 25% 0.00000 0.00000 50% 0.00000 1.000000 75% 0.040000 1.000000 1.000000 max1.000000 dst_host_srv_diff_host_rate attack_type 494021.000000 count 494021.000000 0.006684 0.220796 mean std 0.042133 0.451233 \min 0.000000 0.00000 25% 0.000000 0.00000 50% 0.000000 0.00000 75% 0.000000 0.00000 1.000000 4.000000 max[8 rows x 30 columns] [37]: from sklearn.preprocessing import MinMaxScaler [38]: y = df[['attack_type']] X = df.drop(['attack_type'], axis=1) y.head() [39]: [39]: attack_type 0 1 1 1 2 1 3 1 4 1 X.head() [40]: [40]: duration protocol_type flag src_bytes dst_bytes land wrong_fragment 0 0 1 0 5450 0 0 181 0 1 0 1 239 486 0 0 2 0 1 0 235 1337 0 0 3 1 0 0 0 219 1337 0 4 0 1 0 217 2032 0 0

1.000000

255.000000

1.000000

max



```
0
              0
                                                      0.0
                                                                   0.0
                                                                   0.0
      1
              0
                                      0
                                         . . .
                                                      0.0
      2
              0
                                                                   0.0
                   0
                                      0
                                                      0.0
                                         . . .
      3
              0
                   0
                                      0
                                                      0.0
                                                                   0.0
                                        . . .
                                                      0.0
                                                                   0.0
              0
                   0
         same_srv_rate diff_srv_rate srv_diff_host_rate dst_host_count \
      0
                   1.0
                                  0.0
                                                      0.0
      1
                   1.0
                                  0.0
                                                      0.0
                                                                       19
      2
                   1.0
                                  0.0
                                                      0.0
                                                                       29
      3
                   1.0
                                  0.0
                                                      0.0
                                                                       39
                   1.0
                                  0.0
                                                      0.0
                                                                       49
         dst_host_srv_count dst_host_diff_srv_rate dst_host_same_src_port_rate \
      0
                                                0.0
                                                                            0.11
                         19
                                                0.0
                                                                            0.05
      1
      2
                         29
                                                0.0
                                                                            0.03
      3
                                                0.0
                                                                            0.03
                         39
      4
                         49
                                                0.0
                                                                            0.02
         dst_host_srv_diff_host_rate
      0
                                 0.0
                                 0.0
      1
      2
                                 0.0
      3
                                 0.0
                                 0.0
      [5 rows x 29 columns]
[41]: scaler = MinMaxScaler() # MinMaxScaler scales the data to a fixed range (by
      →default, between 0 and 1) by subtracting the minimum value and dividing by the
      \rightarrow range of the data.
      X = scaler.fit_transform(X)
[42]: X
[42]: array([[0., 0.5, 0., ..., 0., 0.11, 0.],
             [0., 0.5, 0., ..., 0., 0.05, 0.],
             [0., 0.5, 0., ..., 0., 0.03, 0.],
             . . . ,
             [0., 0.5, 0., ..., 0., 0.06, 0.05],
             [0., 0.5, 0., ..., 0., 0.04, 0.05],
             [0., 0.5, 0., ..., 0., 0.17, 0.05]])
```

... serror_rate rerror_rate \

hot

num_failed_logins



6 Train-test split

[45]: 29

NB: Parts of this program is taken and improved from https://www.kaggle.com/code/iamyajat/intrusion-detection-system-using-neural-networks, which has been released under the Apache 2.0 open source license

7 Practice task

Visulalise at least 10 features of the KDD Cup dataset using different types of plots (such as bar, histogram, line, etc.).