```
import numpy as np
import pandas as pd
df=pd.read csv("KDDCup99.csv")
pd.set option("display.max columns", None)
df.columns
'num_failed_logins', 'logged_in', 'lnum_compromised',
'lroot shell',
       'lsu attempted', 'lnum root', 'lnum file creations',
'lnum shells',
       'lnum access files', 'lnum 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', 'label'],
      dtvpe='object')
df
        duration protocol type service flag src bytes
                                                           dst bytes
land
                0
                                                                 5450
0
                             tcp
                                    http
                                           SF
                                                      181
0
1
                0
                             tcp
                                    http
                                           SF
                                                      239
                                                                  486
0
2
                                    http
                                           SF
                                                      235
                                                                 1337
                             tcp
0
3
                0
                             tcp
                                    http
                                           SF
                                                      219
                                                                 1337
0
4
                0
                             tcp
                                    http
                                           SF
                                                      217
                                                                 2032
0
                                                                 1881
494015
                0
                                                      310
                             tcp
                                    http
                                           SF
494016
                0
                             tcp
                                    http
                                           SF
                                                      282
                                                                 2286
494017
                             tcp
                                    http
                                           SF
                                                      203
                                                                 1200
0
494018
                0
                             tcp
                                    http
                                           SF
                                                      291
                                                                 1200
```

| 494019<br>0      | (       | 9              | tcp                      | ht     | tp        | SF      | 219          | 1           | L234      |   |
|------------------|---------|----------------|--------------------------|--------|-----------|---------|--------------|-------------|-----------|---|
| U                |         |                |                          | h a ±  |           | £-:1-d  | 1            | 1           | مال ا     |   |
| 0                | wrong_f | 0              | urgent<br>0              | 0      | num_      | raiteo_ | _logins<br>0 | logged      | 1         | \ |
| 1<br>2<br>3      |         | 0<br>0         | 0<br>0                   | 0<br>0 |           |         | 0<br>0       |             | 1<br>1    |   |
| 3<br>4           |         | 0<br>0         | 0<br>0                   | 0<br>0 |           |         | 0<br>0       |             | 1<br>1    |   |
| <br>494015       |         |                |                          |        |           |         |              |             |           |   |
| 494016<br>494017 |         | 9<br>9         | 0<br>0                   | 0      |           |         | 0            |             | 1         |   |
| 494018           |         | 0              | 0                        | 0      |           |         | 0            |             | 1         |   |
| 494019           |         | 0              | 0                        | 0      |           |         | 0            |             | 1         |   |
| Θ                | lnum_co | mpromised<br>) | d lroo <sup>.</sup><br>9 | t_shel | l ls<br>0 | u_atter | npted l<br>0 | .num_roc    | ot \<br>0 |   |
| 1 2              |         |                | 9<br>9                   |        | 0<br>0    |         | 0<br>0       |             | 0         |   |
| 3                |         | (              | 9<br>9                   |        | 0<br>0    |         | 0            |             | 0         |   |
| <br>494015       |         |                | 9                        |        | 0         |         |              |             | 0         |   |
| 494016           |         | (              | 9                        |        | 0         |         | 0            |             | 0         |   |
| 494017<br>494018 |         | (              | 9<br>9                   |        | 0<br>0    |         | 0<br>0       |             | 0         |   |
| 494019           |         |                | 9                        |        | 0         |         | 0            |             | 0         |   |
| 0                | lnum_fi | le_creat:      | ions l<br>0              | num_sh | ells<br>0 | lnum_a  | access_f     | iles \<br>0 | ١         |   |
| 1 2              |         |                | 0<br>0                   |        | 0<br>0    |         |              | 0<br>0      |           |   |
| 3<br>4           |         |                | 0<br>0                   |        | 0<br>0    |         |              | 0<br>0      |           |   |
| 494015           |         |                |                          |        |           |         |              |             |           |   |
| 494016           |         |                | 0<br>0                   |        | 0         |         |              | 0<br>0      |           |   |
| 494017<br>494018 |         |                | 0<br>0                   |        | 0<br>0    |         |              | 0<br>0      |           |   |
| 494019           |         |                | 0                        |        | 0         |         |              | 0           |           |   |
| srv cou          |         | tbound_cr      | nds is                   | _host_ | login     | is_gu   | uest_log     | in coι      | ınt       |   |
| 0 _              |         |                | 0                        |        | 0         |         |              | 0           | 8         |   |
| 8<br>1           |         |                | 0                        |        | 0         |         |              | 0           | 8         |   |
| 8 2              |         |                | 0                        |        | 0         |         |              | 0           | 8         |   |
| 8                |         |                |                          |        |           |         |              |             |           |   |

| 3<br>6           |                     | Θ                 | 0       |                 | 0           | 6   |   |
|------------------|---------------------|-------------------|---------|-----------------|-------------|-----|---|
| 6<br>4           |                     | 0                 | 0       |                 | 0           | 6   |   |
| 6                |                     | U                 | U       |                 | U           | U   |   |
|                  |                     |                   |         |                 |             |     |   |
| <br>494015       |                     | 0                 | 0       |                 | 0           | 4   |   |
| 5                |                     | O                 | U       |                 | · ·         | -   |   |
| 494016           |                     | 0                 | 0       |                 | 0           | 6   |   |
| 6<br>494017      |                     | 0                 | 0       |                 | 0           | 6   |   |
| 18               |                     |                   |         |                 | Ū           | J   |   |
| 494018           |                     | 0                 | 0       |                 | 0           | 6   |   |
| 12<br>494019     |                     | Θ                 | Θ       |                 | 0           | 6   |   |
| 35               |                     | · ·               | V       |                 | Ü           | J   |   |
|                  |                     |                   |         |                 |             |     | ` |
| 0                | serror_rate<br>0.00 | srv_serror_r<br>ด | ate rer | ror_rate<br>0.0 | srv_rerror_ | 0.0 | \ |
| 1                | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
| 1<br>2<br>3<br>4 | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
| 3                | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
| 4                | 0.00                | 0                 | 0.00    | 0.0             |             | 0.0 |   |
| 494015           | 0.00                | 6                 | 0.00    | 0.0             |             | 0.0 |   |
| 494016           | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
| 494017           | 0.17                |                   | ).11    | 0.0             |             | 0.0 |   |
| 494018           | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
| 494019           | 0.00                |                   | 0.00    | 0.0             |             | 0.0 |   |
|                  | same_srv_rate       | diff_srv_r        | ate srv | diff host       | t rate      |     |   |
| dst_host         | _count \            |                   |         |                 | _           |     |   |
| 9                | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 1                | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 19               |                     |                   |         |                 |             |     |   |
| 2                | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 29<br>3          | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 39               | 2.0                 |                   |         |                 |             |     |   |
| 4                | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 49               |                     |                   |         |                 |             |     |   |
|                  |                     |                   |         |                 |             |     | • |
| 494015           | 1.0                 |                   | 0.0     |                 | 0.40        |     |   |
| 86               | 1 0                 |                   | 0.0     |                 | 0.00        |     |   |
| 494016<br>6      | 1.0                 |                   | 0.0     |                 | 0.00        |     |   |
| 494017           | 1.0                 |                   | 0.0     |                 | 0.17        |     |   |
|                  |                     |                   |         |                 |             |     |   |

```
16
494018
                   1.0
                                    0.0
                                                         0.17
26
                   1.0
                                    0.0
                                                         0.14
494019
        dst_host_srv_count dst_host_same_srv_rate
dst_host_diff_srv_rate
                           9
                                                   1.0
0.0
                          19
                                                   1.0
1
0.0
                          29
2
                                                   1.0
0.0
                          39
                                                   1.0
3
0.0
                          49
                                                   1.0
4
0.0
                                                   . . .
. . .
494015
                         255
                                                   1.0
0.0
                         255
                                                   1.0
494016
0.0
494017
                         255
                                                   1.0
0.0
                         255
                                                   1.0
494018
0.0
                         255
                                                   1.0
494019
0.0
        dst_host_same_src_port_rate
                                        dst_host_srv_diff_host_rate \
0
                                  0.11
                                                                 0.00
1
                                  0.05
                                                                 0.00
2
                                  0.03
                                                                 0.00
3
                                  0.03
                                                                 0.00
4
                                  0.02
                                                                 0.00
. . .
                                   . . .
494015
                                  0.01
                                                                 0.05
                                  0.17
                                                                 0.05
494016
494017
                                  0.06
                                                                 0.05
                                  0.04
                                                                 0.05
494018
494019
                                  0.17
                                                                 0.05
        dst_host_serror_rate dst_host_srv_serror_rate
dst host rerror rate \
                          0.00
                                                      0.00
0.0
                          0.00
1
                                                      0.00
0.0
```

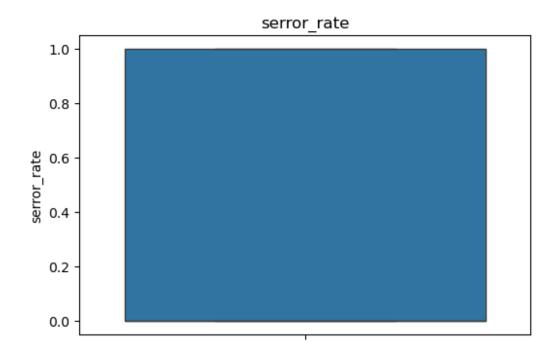
| 2                         | 0.00   |   | 0.00 |
|---------------------------|--|---|------|
| 0.0                       | 0.00   |   | 0.00 |
| 0.0                       |  |   |      |
| 4<br>0.0                  | 0.00   |   | 0.00 |
|                           |  |   |      |
| 494015                    | 0.00   |   | 0.01 |
| 0.0                       |  |   |      |
| 494016<br>0.0             | 0.00   |   | 0.01 |
| 494017                    | 0.06   |   | 0.01 |
| 0.0<br>494018             | 0.04   |   | 0.01 |
| 0.0                       | 0.04   |   | 0.01 |
| 494019                    | 0.00   |   | 0.01 |
| 0.0                       |  |   |      |
| dst_host_srv_re 0 1 2 3 4 | rror_rate<br>0.0<br>0.0<br>0.0<br>0.0<br>0.0 | label<br>normal<br>normal<br>normal<br>normal |      |
|                           |  |   |      |
| 494015<br>494016          | 0.0<br>0.0                                   | normal<br>normal                              |      |
| 494017                    | 0.0  | normal  |      |
| 494018<br>494019          | 0.0<br>0.0                                   | normal<br>normal                              |      |
| [494020 rows x 42 colum   | ns]  |   |      |
| df.shape                  |  |   |      |
| (494020, 42)              |  |   |      |
| df.isnull().sum()         |  |   |      |
| duration                  | 0  |   |      |
| protocol_type             | 0  |   |      |
| service<br>flag           | 0<br>0                                       |   |      |
| src_bytes                 | 0  |   |      |
| dst_bytes<br>land         | 0<br>0                                       |   |      |
| wrong_fragment            | Θ  |   |      |
| urgent<br>hot             | 0<br>0                                       |   |      |
| HOL                       | U  |   |      |

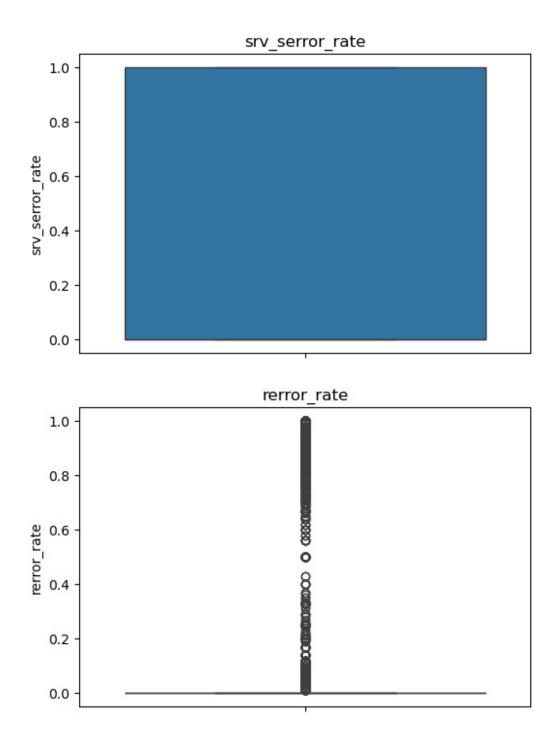
```
num failed logins
                                0
                                0
logged in
lnum_compromised
                                0
lroot shell
                                0
                                0
lsu attempted
lnum root
                                0
                                0
lnum file creations
lnum shells
                                0
lnum access files
                                0
lnum_outbound cmds
                                0
is_host_login
                                0
                                0
is_guest_login
                                0
count
                                0
srv_count
serror_rate
                                0
                                0
srv serror rate
rerror_rate
                                0
                                0
srv_rerror_rate
                                0
same srv rate
diff_srv_rate
                                0
                                0
srv diff host rate
dst host count
                                0
dst host srv count
                                0
                                0
dst host same srv rate
dst host diff srv rate
                                0
dst_host_same_src_port_rate
                                0
dst_host_srv_diff_host_rate
                                0
                                0
dst host serror rate
dst host srv serror rate
                                0
dst_host_rerror_rate
                                0
                                0
dst host srv rerror rate
                                0
label
dtype: int64
df.duplicated().sum()
348435
df.drop duplicates(keep="first", inplace=True)
df.shape
(145585, 42)
df.nunique()
# 4 features are binary
                                  2495
duration
protocol type
                                     3
service
                                    66
```

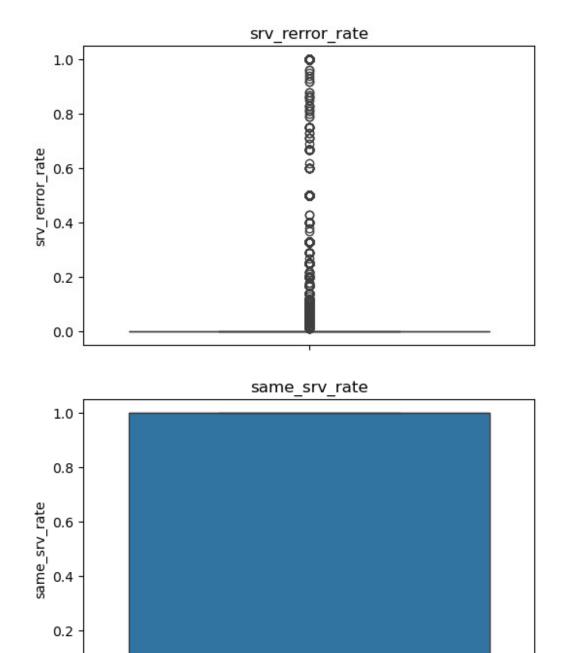
```
11
flag
                                 3300
src bytes
dst_bytes
                                10725
                                     2
land
                                     3
wrong fragment
                                     4
urgent
                                    22
hot
num failed logins
                                     6
                                     2
logged in
lnum compromised
                                   23
lroot shell
                                     2
                                    3
lsu_attempted
                                    20
lnum_root
                                    18
lnum file creations
lnum shells
                                     3
                                     7
lnum access files
                                     1
lnum outbound cmds
                                     1
is_host_login
                                     2
is guest login
                                  490
count
srv count
                                  470
serror rate
                                   92
                                    51
srv serror rate
rerror rate
                                   77
                                   51
srv rerror rate
                                   99
same_srv_rate
diff_srv_rate
                                   78
                                   64
srv diff host rate
dst host count
                                  256
dst_host_srv_count
                                  256
dst host same srv rate
                                  101
dst_host_diff_srv_rate
                                  101
                                  101
dst_host_same_src_port_rate
dst host srv diff host rate
                                   65
                                  100
dst host serror rate
dst host srv serror rate
                                   72
dst host rerror rate
                                  101
dst host srv rerror rate
                                  101
label
                                   23
dtype: int64
df.info()
# protocol type, service, flag are string
<class 'pandas.core.frame.DataFrame'>
Index: 145585 entries, 0 to 494019
Data columns (total 42 columns):
 #
     Column
                                    Non-Null Count
                                                     Dtype
```

```
0
    duration
                                  145585 non-null
                                                   int64
 1
                                  145585 non-null
                                                   object
    protocol type
 2
                                  145585 non-null
                                                   object
    service
 3
                                  145585 non-null
    flag
                                                   object
 4
    src bytes
                                  145585 non-null
                                                  int64
 5
    dst bytes
                                  145585 non-null
                                                  int64
 6
    land
                                  145585 non-null
                                                  int64
 7
                                  145585 non-null int64
    wrong fragment
 8
    urgent
                                  145585 non-null int64
 9
    hot
                                  145585 non-null int64
                                                  int64
 10
    num failed logins
                                  145585 non-null
 11
    logged in
                                  145585 non-null
                                                  int64
 12
                                  145585 non-null
    lnum compromised
                                                   int64
 13
                                  145585 non-null
                                                  int64
    lroot shell
 14 lsu attempted
                                  145585 non-null
                                                   int64
 15
                                  145585 non-null
    lnum root
                                                  int64
 16 lnum file creations
                                  145585 non-null
                                                  int64
 17
    lnum shells
                                  145585 non-null
                                                  int64
 18
    lnum_access_files
                                 145585 non-null
                                                  int64
19
    lnum_outbound_cmds
                                  145585 non-null
                                                  int64
 20 is host login
                                 145585 non-null
                                                  int64
21 is quest login
                                  145585 non-null int64
 22
                                  145585 non-null int64
   count
 23 srv_count
                                 145585 non-null int64
24 serror_rate
                                  145585 non-null
                                                  float64
 25 srv_serror_rate
                                 145585 non-null
                                                  float64
 26 rerror rate
                                  145585 non-null
                                                   float64
 27
    srv rerror rate
                                 145585 non-null
                                                  float64
 28 same srv rate
                                  145585 non-null
                                                  float64
    diff_srv_rate
 29
                                 145585 non-null
                                                  float64
 30 srv diff host rate
                                 145585 non-null
                                                  float64
 31 dst_host_count
                                 145585 non-null
                                                   int64
 32 dst_host_srv_count
                                 145585 non-null
                                                  int64
    dst host same srv rate
33
                                 145585 non-null
                                                  float64
 34 dst host diff srv rate
                                 145585 non-null
                                                  float64
    dst host same src port rate 145585 non-null
 35
                                                  float64
 36 dst host srv diff host rate
                                 145585 non-null
                                                  float64
 37
    dst host serror rate
                                  145585 non-null float64
38 dst_host_srv_serror_rate
                                  145585 non-null
                                                  float64
39
    dst host rerror rate
                                                  float64
                                 145585 non-null
40
    dst host srv rerror rate
                                  145585 non-null
                                                  float64
41
    label
                                  145585 non-null object
dtypes: float64(15), int64(23), object(4)
memory usage: 47.8+ MB
import matplotlib.pyplot as plt
import seaborn as sns
# Plot with subplots
# fig, axes = plt.subplots(5, 3, figsize=(12, 6), sharey=True)
```

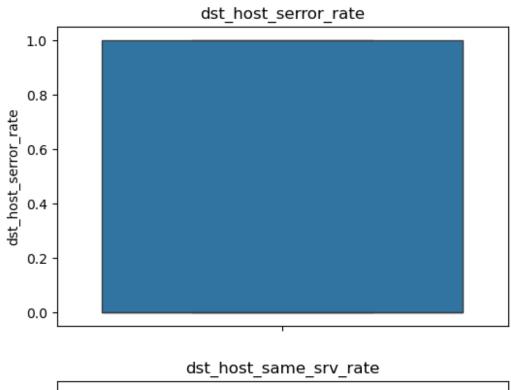
```
metrics = ["serror_rate", "srv_serror_rate", "rerror_rate",
"srv_rerror_rate", "same_srv_rate",
           "dst_host_serror_rate", "dst_host_same_srv_rate",
"diff_srv_rate", "srv_diff_host_rate",
          "dst_host_diff_srv_rate", "dst_host_same_src_port_rate",
"dst_host_srv_diff_host_rate",
          "dst host srv serror rate", "dst host rerror rate",
"dst_host_srv_rerror_rate"]
for metric in metrics:
    plt.figure(figsize=(6, 4))
    sns.boxplot(y=df[metric])
    plt.title(metric)
    plt.show()
plt.tight_layout()
plt.show()
# having outliers: rerror_rate, srv_rerror_rate, diff_srv_rate,
srv diff host rate, dst host diff srv rate,
dst_host_same_src_port_rate,
# dst_host_srv_diff_host_rate, dst_host_rerror_rate,
dst host srv rerror rate
# needs to deal with these outlier features
```

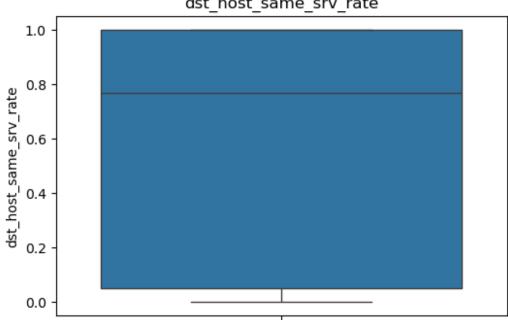


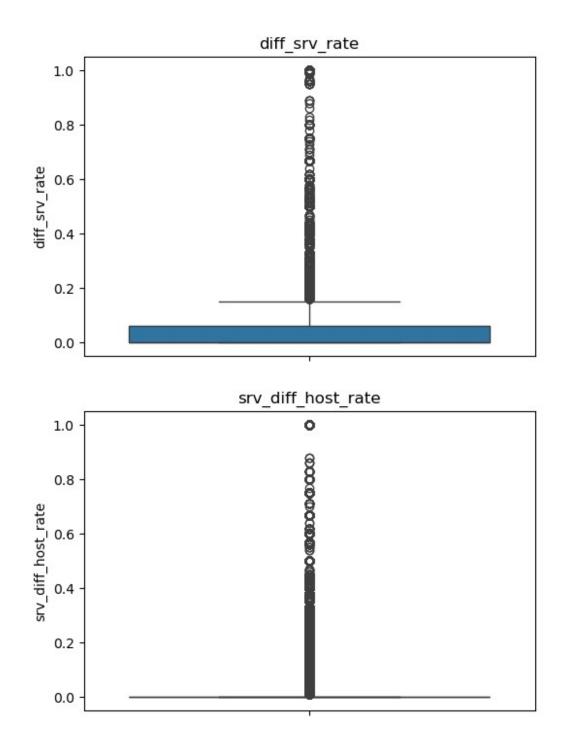


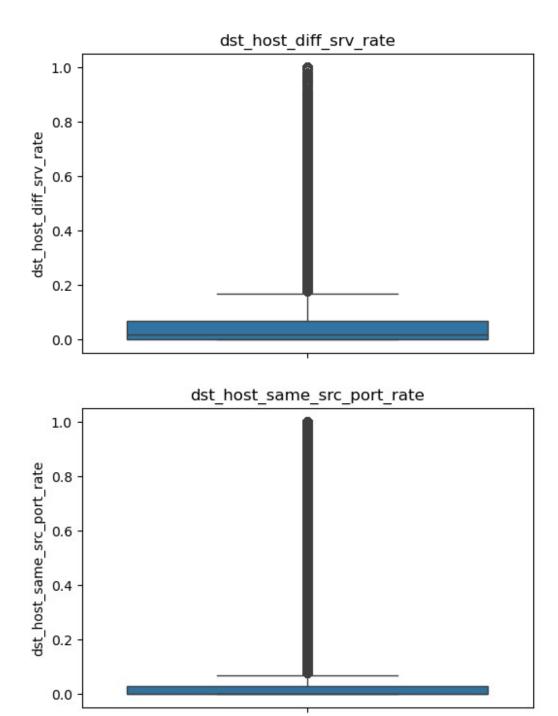


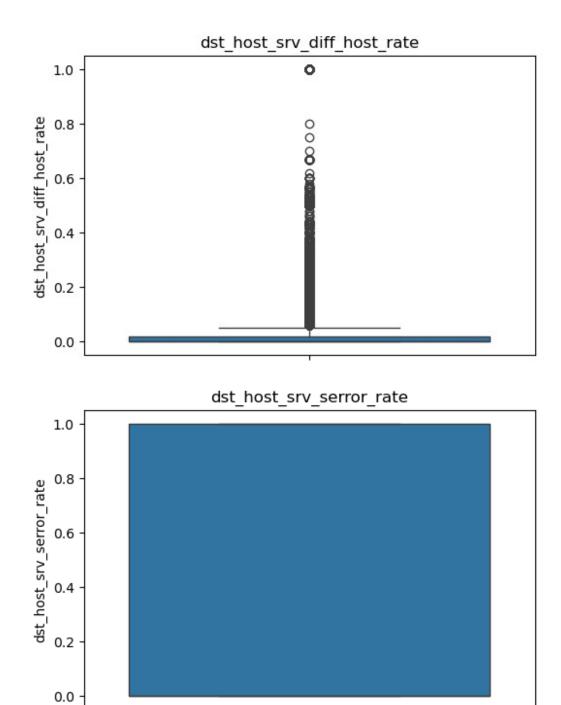
0.0

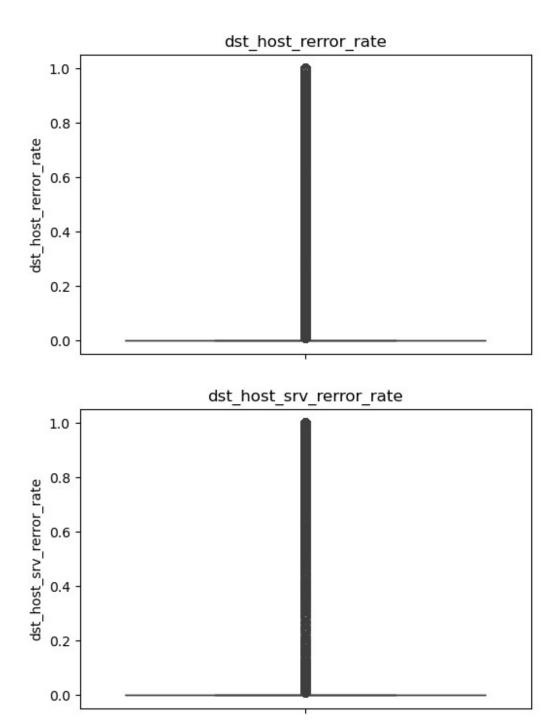






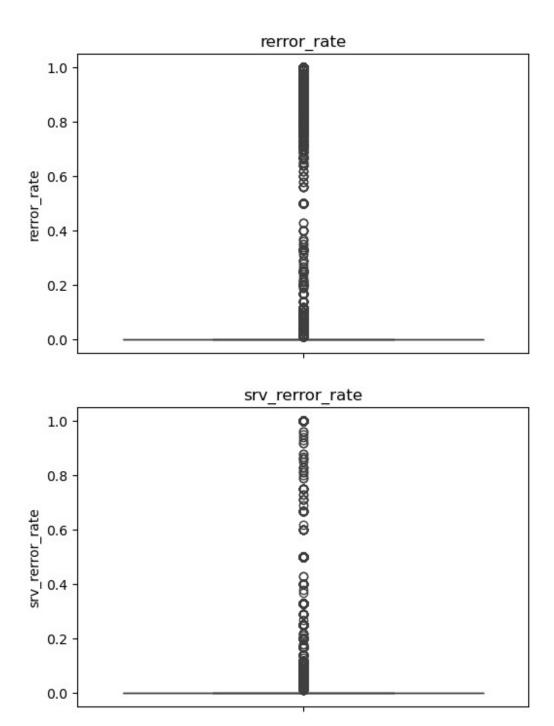


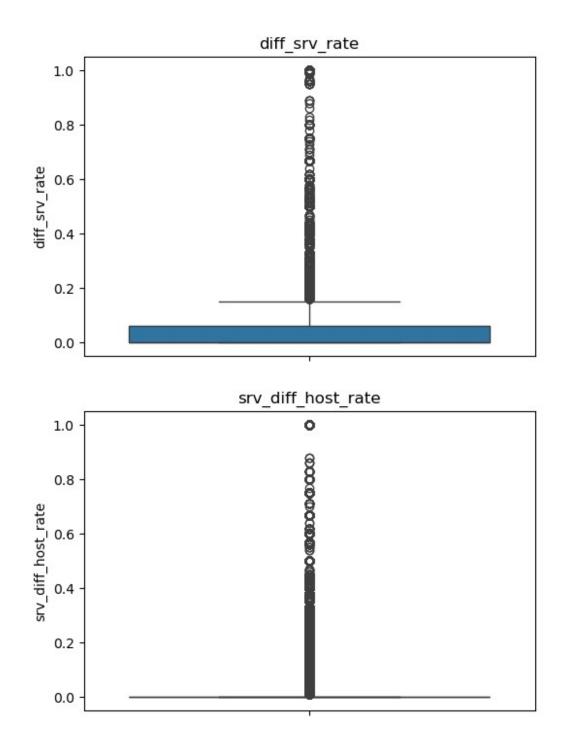


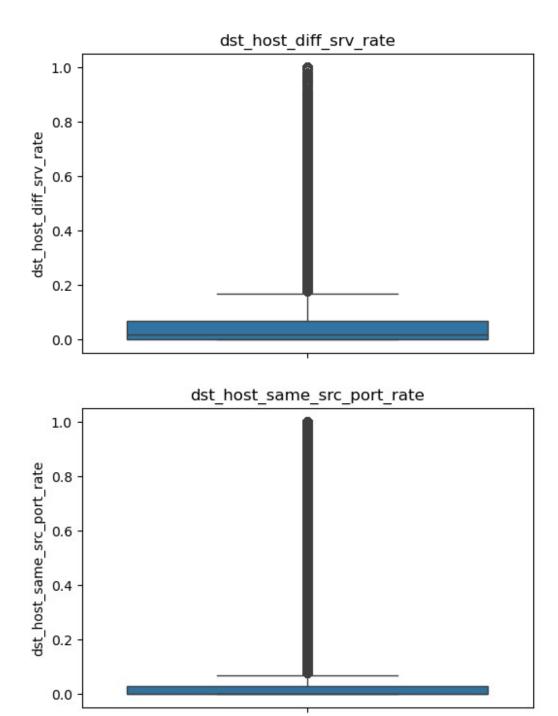


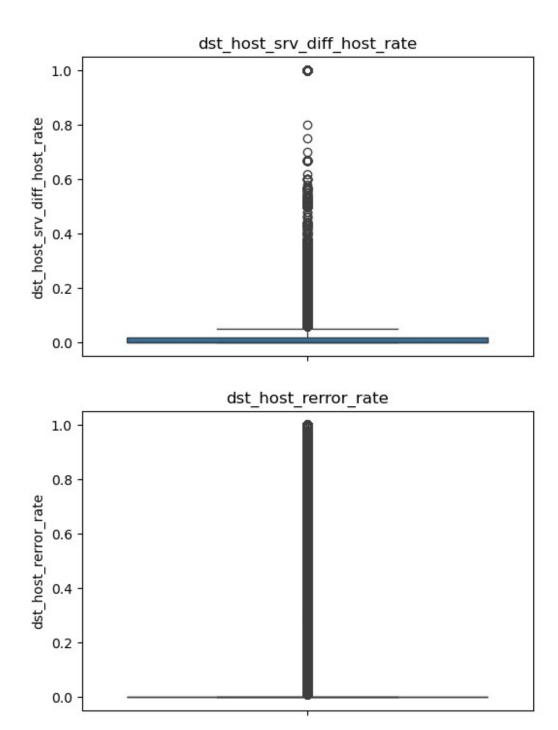
<Figure size 640x480 with 0 Axes>
from sklearn.preprocessing import RobustScaler
# robust scaler on the columns having outliers

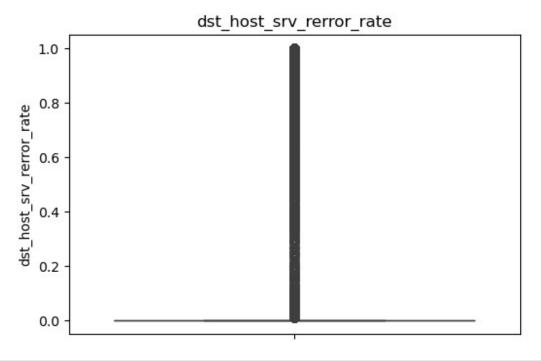
```
columns to_scale = ["rerror_rate", "srv_rerror_rate", "diff_srv_rate",
"srv diff host rate",
                    "dst_host_diff_srv_rate",
"dst host same src port rate",
                    "dst_host_srv_diff_host_rate",
"dst host_rerror_rate",
                    "dst host srv rerror rate"]
# Extract the columns for scaling
scaling = df[columns_to_scale]
# Initialize the scaler
scaler = RobustScaler()
# Perform the scaling
scaled data = scaler.fit transform(scaling)
# Convert the scaled data back to a DataFrame (optional, for better
interpretability)
scaled df = pd.DataFrame(scaled data, columns=columns to scale)
for metric in scaled df.columns:
    plt.figure(figsize=(6, 4))
    sns.boxplot(y=df[metric])
    plt.title(metric)
    plt.show()
plt.tight_layout()
plt.show()
```











```
<Figure size 640x480 with 0 Axes>
import scipy.stats as stats
numeric_features = df.select_dtypes(include=["number"])
for col in numeric features.columns:
print("min:",min(numeric_features[col]),"max:",max(numeric_features[col])
l]), numeric features[col].nunique())
    plt.figure(figsize=(15, 5))
    plt.subplot(121)
    sns.distplot(numeric features[col])
    plt.title(col)
    plt.subplot(122)
    stats.probplot(numeric features[col], dist="norm", plot=plt)
    plt.title(col)
    plt.show()
# need transformation
# src bytes: Yeo-Johnson (zero values)
# dst bytes: Yeo-Johnson (- and zero values), outliers bhi h
# land: Yeo-Johnson (- and zero values), outliers bhi h
# wrong fragment: Yeo-Johnson (- and zero values), outliers bhi h
# urgent: Yeo-Johnson (- and zero values), outliers bhi h
# host: Yeo-Johnson (- and zero values), outliers bhi h
```

```
# num failed logins: Yeo-Johnson (- and zero values), outliers bhi h
# num compromised: Yeo-Johnson (- and zero values), outliers bhi h
# root_shell: Yeo-Johnson (- and zero values), outliers bhi h
# lsu attempt: Yeo-Johnson (- and zero values), outliers bhi h
# lnum root: Yeo-Johnson (- and zero values), outliers bhi h
# lnum file creation: Yeo-Johnson (- and zero values), outliers bhi h
# lnum shells: Yeo-Johnson (- and zero values), outliers bhi h
# lnum access files: Yeo-Johnson (- and zero values), outliers bhi h
# is guest login: Yeo-Johnson (- and zero values), outliers bhi h
# count: Yeo-Johnson (- and zero values), outliers bhi h
# srv count: Yeo-Johnson (- and zero values), outliers bhi h
# serror_rate: Yeo-Johnson (- and zero values), outliers bhi h
# srv_serror_rate: Yeo-Johnson (- and zero values), outliers bhi h
# rerror rate: Yeo-Johnson (- and zero values), outliers bhi h
# srv rerror rate: Yeo-Johnson (- and zero values), outliers bhi h
# same srv rate: Yeo-Johnson (- and zero values), outliers bhi h
# diff srv rate: Yeo-Johnson (- and zero values), outliers bhi h
# srv_diff_host_rate: Yeo-Johnson (- and zero values), outliers bhi h
# dst host count: Yeo-Johnson (- and zero values), outliers bhi h
# dst host srv count: Yeo-Johnson (- and zero values), outliers bhi h
# dst host same srv rate: Yeo-Johnson (- and zero values), outliers
bhi h
# dst host diff srv rate: Yeo-Johnson (- and zero values), outliers
bhi h
# dst host same src port rate: Yeo-Johnson (- and zero values),
outliers bhi h
# dst_host_srv_diff_host_rate: Yeo-Johnson (- and zero values),
outliers bhi h
# dst host serror rate: Yeo-Johnson (- and zero values), outliers bhi
h
# dst host srv serror rate: Yeo-Johnson (- and zero values), outliers
bhi h
# dst host rerror rate: Yeo-Johnson (- and zero values), outliers bhi
# dst host srv rerror rate: Yeo-Johnson
min: 0 max: 58329 2495
NameError
                                          Traceback (most recent call
last)
Cell In[10], line 5
      3 for col in numeric features.columns:
print("min:",min(numeric features[col]),"max:",max(numeric features[col])
l]), numeric features[col].nunique())
---> 5
            plt.figure(figsize=(15, 5))
      6
            plt.subplot(121)
```

```
sns.distplot(numeric features[col])
NameError: name 'plt' is not defined
df["protocol_type"].value_counts()
# one hot encoding will work fine here
protocol type
        130912
tcp
         12267
udp
          2406
icmp
Name: count, dtype: int64
df["service"].value_counts()
# way more nuniques need to reduce then one hot encoding
service
            62053
http
private
            49057
             9721
smtp
domain u
             5425
other
             4769
X11
               11
tim i
                5
pm dump
                1
tftp_u
                1
                1
red i
Name: count, Length: 66, dtype: int64
df["flag"].value counts()
# one hot encoding
flag
SF
          87458
S0
          42278
          14712
REJ
            569
RST0
            425
RSTR
S1
             57
SH
             34
S2
             24
RST0S0
             11
             10
S3
0TH
              7
Name: count, dtype: int64
```

```
df["label"].value counts()
# 24 features
label
                   87831
normal
                   51820
neptune
back
                     968
teardrop
                     918
                     906
satan
warezclient
                     893
                     651
ipsweep
smurf
                     641
portsweep
                     416
pod
                     206
                     158
nmap
guess_passwd
                      53
buffer overflow
                      30
warezmaster
                      20
land
                      19
                      12
imap
rootkit
                      10
                       9
loadmodule
                       8
ftp write
multihop
                       7
                       4
phf
                       3
perl
spy
Name: count, dtype: int64
# Basic Features:
# duration: Length of connections (in seconds)
# protocol_type: Type of protocol(e.g. TCP, UDP, ICMP)
# service: Network service on the destination (e.g. HTTP, FTP, Telnet)
# flag: Status of connection (e.g. SF, REJ)
# sec bytes: Number of bytes sent from source to destination
# dst bytes: Number of bytes sent from destination to source
# land: Binary flag (1 if source and destination IP/port are the same,
otherwise 0)
# wrong fragment: Number of checksum fragment
# urgent: Number of packets in the connection marked as "urgent"
# Content Features:
# hot: no. of "indicators" (e.g. directory access, file creations)
# num failed logins: no. of failed login attempts
# logged in: Binary flag (1 if logged in successfully, otherwise 0)
# lnum compromised: no. of compromised conditions
# lroot shell: Binary flag (1 if a root shell is obtained, otherwise
# lsu attempted: no. of "su root" commands attempted
```

```
# lnum root: no. of root accesses
# lnum file creations: no. of file creation operations
# lnum shells: no. of shell prompts invoked
# lnum access files: number of file access operations
# lnum outbound cmds: no. of outbound commands in an FTP sessions
# is host login: Binary flag (1 if the login is from the host itself,
otherwise 0)
# is quest login: Binary flag (1 if the login is a quest login,
otherwise 0)
# Traffic features: Statistical features over a time window
# count: No of connections to the same host in the last 2 seconds
# srv count: No of connections to the same service in the last 2
seconds
# serror rate: percentage of connections that have SYN errors
# srv serror rate: percentage of connections to the same service with
SYN errors
# rerror rate: percentage of connections that have REJ errors
# srv rerror rate: percentage of connections to the same service with
REJ errors
# same srv rate: percentage of connections to the same service
# diff srv rate: percentage of connections to the different service
# srv diff host rate: percentage of connections to different hosts
# Host based traffic features:
# dst host count: No of connections to the same destination host
# dst host srv count: no of connections to the same service on the
destination host
# dst host same srv rate: percentage of connections to the same
service on the destination host
# dst host diff srv rate: percentage of connections to different
service on the s=destination host
# dst host same src port rate: percentage of connections from the same
source port
# dst host srv diff host rate: percentage of connections to different
hosts woth the same service
# dst_host_rerror_rate: percentage of connections to the destination
with REJ errors
# dst host srv rerror rate: percentage of connections to the same
service with REJ errors
# target labels:
# label: indicates whether the connections is "normal" or belongs to
one of the attack categories (e.g. DoS, Probe, U2R, R2L)
attacks types = {
    'normal': 'normal',
'back': 'dos',
'buffer overflow': 'u2r',
'ftp write': 'r2l',
```

```
'guess passwd': 'r2l',
'imap': 'r2l',
'ipsweep': 'probe',
'land': 'dos',
'loadmodule': 'u2r',
'multihop': 'r2l',
'neptune': 'dos',
'nmap': 'probe',
'perl': 'u2r',
'phf': 'r2l',
'pod': 'dos',
'portsweep': 'probe',
'rootkit': 'u2r',
'satan': 'probe',
'smurf': 'dos',
'spy': 'r2l',
'teardrop': 'dos',
'warezclient': 'r2l',
'warezmaster': 'r2l',
}
df["attacks_type"]=df["label"].map(attacks_types)
df["attacks type"].value counts()
attacks type
normal 87831
dos
          54572
probe
           2131
            999
r2l
u2r
             52
Name: count, dtype: int64
df.shape
(145585, 43)
from ydata profiling import ProfileReport
profile = ProfileReport(df.sample(494), title="Profiling Report")
profile.to_notebook_iframe()
{"model id": "4cab3110d7fb41348a4d75731fb1e418", "version major": 2, "vers
ion minor":0}
{"model id": "a19d8b6b796a4e6480cd014396880911", "version major": 2, "vers
ion minor":0}
{"model id": "89e2530f69f444d39e36826a701bb117", "version major": 2, "vers
ion minor":0}
```

| df  |           |  |                                 |   |        |                                     |   |   |
|---|-----------|--|---------------------------------|---|--------|-------------------------------------|---|---|
| land \  |           | protoco                                    | l_type                          | service                                   | flag   | src_bytes                           | dst_bytes                                       |   |
| 0   | Θ         |  | tcp                             | http                                      | SF     | 181                                 | 5450  |   |
| 0   | 0         |  | tcp                             | http                                      | SF     | 239                                 | 486   |   |
| 0 2   | 0         |  | tcp                             | http                                      | SF     | 235                                 | 1337  |   |
| 0 3   | 0         |  | tcp                             | http                                      | SF     | 219                                 | 1337  |   |
| 0<br>4  | 0         |  | tcp                             | http                                      | SF     | 217                                 | 2032  |   |
| 0   |           |  |                                 |   |        |                                     |   |   |
| 494015  | 0         |  | tcp                             | http                                      | SF     | 310                                 | 1881  |   |
| 0<br>494016   | 0         |  | tcp                             | http                                      | SF     | 282                                 | 2286  |   |
| 0<br>494017   | 0         |  | tcp                             | http                                      | SF     | 203                                 | 1200  |   |
| 0<br>494018<br>0  | 0         |  | tcp                             | http                                      | SF     | 291                                 | 1200  |   |
| 494019<br>0   | 0         |  | tcp                             | http                                      | SF     | 219                                 | 1234  |   |
| 0<br>1<br>2<br>3<br>4                                   | wrong_fra | agment<br>0<br>0<br>0<br>0<br>0            | urgent<br>0<br>0<br>0<br>0<br>0 | hot n<br>0<br>0<br>0<br>0<br>0            | um_fai | led_logins<br>0<br>0<br>0<br>0<br>0 | logged_in<br>1<br>1<br>1<br>1<br>1              | \ |
| 494015<br>494016<br>494017<br>494018<br>494019          |           | 0<br>0<br>0<br>0<br>0                      | 0<br>0<br>0<br>0                | 0<br>0<br>0<br>0<br>0                     |        | 0<br>0<br>0<br>0                    | 1<br>1<br>1<br>1<br>1                           |   |
| 0<br>1<br>2<br>3<br>4<br><br>494015<br>494016<br>494017 | lnum_comp | oromised<br>0<br>0<br>0<br>0<br>0<br><br>0 |                                 | a_shell<br>0<br>0<br>0<br>0<br>0<br><br>0 | lsu_a  | 0<br>0<br>0<br>0<br>0<br>0<br><br>0 | lnum_root \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ 0 \\ |   |

| 494018<br>494019           |                               | 0<br>0            | 0<br>0       |                     | 0<br>0               | 0<br>0 |   |
|----------------------------|-------------------------------|-------------------|--------------|---------------------|----------------------|--------|---|
| 0                          | lnum_file_cre                 | eations<br>0<br>0 | lnum_shell   | s lnum_ac<br>0<br>0 | cess_files<br>0<br>0 | \      |   |
| 1<br>2<br>3<br>4           |                               | 0<br>0<br>0       |              | 0<br>0<br>0         | 0<br>0<br>0          |        |   |
| 494015<br>494016<br>494017 |                               | 0<br>0<br>0       | •••          | 0<br>0              | 0<br>0<br>0          |        |   |
| 494018<br>494019           |                               | 0                 |              | 0                   | 0                    |        |   |
| srv cou                    | <pre>lnum_outbound nt \</pre> | d_cmds i          | .s_host_log  | jin is_gue          | st_login (           | count  |   |
| 0 _                        | iic (                         | 0                 |              | 0                   | 0                    | 8      |   |
| 8<br>1                     |                               | 0                 |              | 0                   | 0                    | 0      |   |
|                            |                               | 0                 |              | 0                   | 0                    | 8      |   |
| 8<br>2<br>8<br>3<br>6      |                               | 0                 |              | 0                   | 0                    | 8      |   |
| 8                          |                               | 0                 |              | 0                   | 0                    | 6      |   |
| 6                          |                               | U                 |              | U                   | U                    | O      |   |
| 4                          |                               | 0                 |              | 0                   | 0                    | 6      |   |
| 6                          |                               |                   |              |                     |                      |        |   |
|                            |                               |                   | •            | • •                 |                      |        |   |
| 494015                     |                               | 0                 |              | 0                   | 0                    | 4      |   |
| 5<br>494016                |                               | Θ                 |              | 0                   | 0                    | 6      |   |
| 6                          |                               | U                 |              | U                   | U                    | U      |   |
| 494017                     |                               | 0                 |              | 0                   | 0                    | 6      |   |
| 18<br>494018               |                               | 0                 |              | 0                   | 0                    | 6      |   |
| 12<br>494019               |                               | 0                 |              | 0                   | 0                    | 6      |   |
| 35                         |                               | ŭ                 |              |                     | v                    | J      |   |
|                            | serror_rate                   | srv_serr          | <b>—</b>     | error_rate          |                      |        | \ |
| 0                          | 0.00<br>0.00                  |                   | 0.00<br>0.00 | 0.0<br>0.0          |                      | 0.0    |   |
| 2                          | 0.00                          |                   | 0.00         | 0.0                 |                      | 0.0    |   |
| 0<br>1<br>2<br>3<br>4      | 0.00                          |                   | 0.00         | 0.0                 |                      | 0.0    |   |
| 4                          | 0.00                          |                   | 0.00         | 0.0                 |                      | 0.0    |   |
| 494015                     | 0.00                          |                   | 0.00         | 0.0                 |                      | 0.0    |   |
| 494016                     | 0.00                          |                   | 0.00         | 0.0                 |                      | 0.0    |   |

| 494017<br>494018<br>494019 | 0.17<br>0.00<br>0.00 | 0.11<br>0.00<br>0.00 | 0.0<br>0.0<br>0.0 | 0.0<br>0.0<br>0.0 |
|----------------------------|----------------------|----------------------|-------------------|-------------------|
| same<br>dst host cou       |                      | srv_rate srv_        | _diff_host_rate   |                   |
| 0                          | 1.0                  | 0.0                  | 0.00              |                   |
| 9<br>1<br>19               | 1.0                  | 0.0                  | 0.00              |                   |
| 2 29                       | 1.0                  | 0.0                  | 0.00              |                   |
| 3                          | 1.0                  | 0.0                  | 0.00              |                   |
| 39<br>4<br>49              | 1.0                  | 0.0                  | 0.00              |                   |
|                            |                      |                      |                   |                   |
| 494015<br>86               | 1.0                  | 0.0                  | 0.40              |                   |
| 494016                     | 1.0                  | 0.0                  | 0.00              |                   |
| 6<br>494017<br>16          | 1.0                  | 0.0                  | 0.17              |                   |
| 494018<br>26               | 1.0                  | 0.0                  | 0.17              |                   |
| 494019<br>6                | 1.0                  | 0.0                  | 0.14              |                   |
| dst_host_dif               | f_srv_rate \         | dst_host_same_       |                   |                   |
| 0<br>0.0                   | 9                    |                      | 1.0               |                   |
| 1                          | 19                   |                      | 1.0               |                   |
| 0.0<br>2                   | 29                   |                      | 1.0               |                   |
| 0.0                        | 39                   |                      | 1.0               |                   |
| 0.0                        |                      |                      | 1.0               |                   |
| 4<br>0.0                   | 49                   |                      | 1.0               |                   |
|                            |                      |                      |                   |                   |
| <br>494015                 | 255                  |                      | 1.0               |                   |
| 0.0                        | 233                  |                      | 1.0               |                   |
| 494016<br>0.0              | 255                  |                      | 1.0               |                   |
| 494017<br>0.0              | 255                  |                      | 1.0               |                   |

```
494018
                         255
                                                   1.0
0.0
494019
                         255
                                                   1.0
0.0
        dst_host_same_src_port_rate
                                        dst_host_srv_diff_host_rate \
0
                                  0.11
                                                                 0.00
1
                                  0.05
                                                                 0.00
2
                                  0.03
                                                                 0.00
3
                                  0.03
                                                                 0.00
4
                                  0.02
                                                                 0.00
494015
                                  0.01
                                                                 0.05
494016
                                  0.17
                                                                 0.05
494017
                                  0.06
                                                                 0.05
494018
                                  0.04
                                                                 0.05
494019
                                  0.17
                                                                 0.05
        dst_host_serror_rate
                                dst_host_srv_serror_rate
dst host rerror rate
                          0.00
                                                      0.00
0.0
1
                          0.00
                                                      0.00
0.0
2
                          0.00
                                                      0.00
0.0
3
                          0.00
                                                      0.00
0.0
4
                          0.00
                                                      0.00
0.0
. . .
494015
                          0.00
                                                      0.01
0.0
494016
                          0.00
                                                      0.01
0.0
494017
                          0.06
                                                      0.01
0.0
494018
                          0.04
                                                      0.01
0.0
494019
                          0.00
                                                      0.01
0.0
                                      label
        dst_host_srv_rerror_rate
0
                                     normal
                               0.0
1
                               0.0
                                     normal
2
                               0.0
                                     normal
3
                               0.0
                                     normal
4
                               0.0
                                     normal
```

```
494015
                             0.0
                                 normal
494016
                             0.0
                                 normal
494017
                             0.0
                                 normal
494018
                             0.0
                                  normal
494019
                             0.0 normal
[145585 rows x 42 columns]
X = df.drop(columns=["attacks type", "label"]) # Drop target and
label from features
y = df["attacks type"]
from sklearn.preprocessing import OneHotEncoder
categorical columns = ["protocol type", "flag", "service"]
ohe = OneHotEncoder(sparse output=False, handle unknown="ignore")
X categorical = ohe.fit transform(X[categorical columns])
X remaining = X.drop(columns=categorical columns)
X transformed = np.concatenate((X remaining.values, X categorical),
axis=1)
from sklearn.model selection import train test split
X_train, X_test, y_train, y_test = train_test_split(X_transformed, y,
test size=0.2, random state=42)
print(X train.shape)
print(X test.shape)
print(y train.shape)
(116468, 118)
(29117, 118)
(116468,)
from sklearn.ensemble import RandomForestClassifier
from sklearn.tree import DecisionTreeClassifier
from sklearn.naive bayes import GaussianNB
from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import classification report, accuracy score
DT = DecisionTreeClassifier(random state=42)
DT.fit(X train, y train)
DecisionTreeClassifier(random state=42)
y pred1 = DT.predict(X test)
print("Accuracy:", accuracy_score(y_test, y_pred1))
print("\nClassification Report:\n", classification report(y test,
y pred1))
```

```
Accuracy: 0.9990727066662087
Classification Report:
                             recall f1-score
               precision
                                                 support
                              1.00
                                                  10929
         dos
                   1.00
                                        1.00
                   1.00
                              1.00
                                        1.00
                                                  17584
      normal
                   0.99
                              0.98
                                        0.99
                                                    439
       probe
         r2l
                   0.96
                              0.96
                                        0.96
                                                    161
                   0.33
                              0.75
         u2r
                                        0.46
                                        1.00
                                                  29117
    accuracy
                   0.86
                              0.94
                                        0.88
                                                  29117
   macro avq
                                                  29117
weighted avg
                   1.00
                              1.00
                                        1.00
from sklearn.metrics import fl score
f1 = f1_score(y_test, y_pred1, average=None)
print("F1 Score:", f1)
F1 Score: [0.99995425 0.99937436 0.98742857 0.95975232 0.46153846]
NB=GaussianNB()
NB.fit(X train, y train)
GaussianNB()
y pred2=NB.predict(X test)
print("Accuracy:", accuracy_score(y_test, y_pred2))
print("\nClassification Report:\n", classification_report(y_test,
y pred2))
Accuracy: 0.6816979771267644
Classification Report:
               precision
                             recall f1-score
                                                 support
                   0.55
                              0.98
                                        0.71
                                                  10929
         dos
      normal
                   0.97
                              0.52
                                        0.68
                                                  17584
                   0.07
                              0.04
                                        0.05
                                                    439
       probe
         r2l
                   0.22
                              0.05
                                        0.08
                                                    161
                   0.02
         u2r
                              0.75
                                        0.05
                                        0.68
                                                  29117
    accuracy
                              0.47
   macro avg
                   0.37
                                        0.31
                                                  29117
weighted avg
                   0.80
                              0.68
                                        0.67
                                                  29117
f1 = f1_score(y_test, y_pred2, average=None)
```

print("F1 Score:", f1)

```
F1 Score: [0.70811186 0.67535167 0.04769001 0.08080808 0.04511278]
KNN = KNeighborsClassifier(n neighbors=5)
KNN.fit(X train, y train)
KNeighborsClassifier()
y pred3=KNN.predict(X test)
print("Accuracy:", accuracy score(y test, y pred3))
print("\nClassification Report:\n", classification_report(y_test,
y pred3))
Accuracy: 0.9962908266648349
Classification Report:
               precision
                            recall f1-score
                                                support
                   1.00
                             1.00
                                        1.00
                                                 10929
         dos
                   1.00
                              1.00
                                        1.00
                                                 17584
      normal
                                        0.92
                                                   439
       probe
                   0.97
                             0.86
                   0.96
                             0.97
                                        0.96
                                                   161
         r2l
         u2r
                   1.00
                             0.25
                                        0.40
                                        1.00
                                                 29117
    accuracy
   macro avq
                   0.98
                              0.82
                                        0.85
                                                 29117
weighted avg
                   1.00
                              1.00
                                        1.00
                                                 29117
f1 = f1_score(y_test, y_pred3, average=None)
print("F1 Score:", f1)
F1 Score: [0.99721245 0.99801102 0.91545894 0.96296296 0.4
RF = RandomForestClassifier(random state=42)
RF.fit(X train, y train)
RandomForestClassifier(random state=42)
y pred4 = RF.predict(X test)
print("Accuracy:", accuracy score(y test, y pred4))
print("\nClassification Report:\n", classification_report(y_test,
y pred4))
Accuracy: 0.9995535254318783
Classification Report:
               precision
                             recall f1-score
                                                support
         dos
                   1.00
                             1.00
                                        1.00
                                                 10929
                   1.00
                              1.00
                                        1.00
                                                 17584
      normal
```

| probe<br>r2l<br>u2r | 1.00<br>0.99<br>1.00 | 0.99<br>0.98<br>0.75 | 0.99<br>0.98<br>0.86 | 439<br>161<br>4 |
|---------------------|----------------------|----------------------|----------------------|-----------------|
|                     |                      |                      |                      |                 |
| accuracy            |                      |                      | 1.00                 | 29117           |
| macro avg           | 1.00                 | 0.94                 | 0.97                 | 29117           |
| weighted avg        | 1.00                 | 1.00                 | 1.00                 | 29117           |
|                     |                      |                      |                      |                 |

f1 = f1\_score(y\_test, y\_pred4, average=None)
print("F1 Score:", f1)

F1 Score: [1. 0.9996304 0.992 0.98442368 0.85714286]