AnalysingDDoS

November 27, 2022

1 Analysing DDoS Attack Data and Comparison Traffic

This notebook contains the calculations described in Chapter 4 Results. The metrics described in Chapter 3 are being calculated for die files from the CIC-DDoS2019 Dataset from 2019 and the Comparison Traffic (One coming from the Stratosphere Laboratory Dataset, the others are recorded Skype traffic).

```
[1]: import numpy as np
  import pandas as pd
  import matplotlib.pyplot as plt
  from datetime import datetime, timedelta
  from nfstream import NFStreamer, NFPlugin

#global
  attacks_only = ['snmp', 'mssql', 'tftp','netBIOS']
  comp_only = ['comparison', 'skypecomparison', 'skype2comparison']
  data = attacks_only + comp_only
```

First, we define classes that calculate different values on packet-level and then add it to the dataframes below.

The class TimeDiff counts the number of packets whose delta-time falls below 1 ms.

The class PayloadSize calculates the payload-size for packets based on their direction, which is needed to calculate the amplification attack factor.

The class Delta_time returns a list of all data-time for each packet in the flow.

```
[2]: class TimeDiff(NFPlugin):
    def on_init(self, pkt, flow): # flow creation with the first packet
        if pkt.delta_time < 1:
            flow.udps.low_time_packets = 1
        else:
            flow.udps.low_time_packets = 0

    def on_update(self, pkt, flow): # flow update with each packet belonging touthe flow
    if pkt.delta_time < 1:
        flow.udps.low_time_packets += 1</pre>
```

```
class PayloadSize(NFPlugin):
    def on init(self, pkt, flow): # flow creation with the first packet
            if pkt.direction == 0:
                flow.udps.src2dst_size = pkt.payload_size
                flow.udps.dst2src_size = 0
            elif pkt.direction == 1:
                flow.udps.src2dst_size = 0
                flow.udps.dst2src_size = pkt.payload_size
    def on update(self, pkt, flow): # flow update with each packet belonging to,
 \hookrightarrow the flow
            if pkt.direction == 0:
                flow.udps.src2dst_size += pkt.payload_size
            elif pkt.direction == 1:
                flow.udps.dst2src_size += pkt.payload_size
class DeltaTime(NFPlugin):
    def on_init(self, pkt, flow):
        flow.udps.delta_time = [pkt.delta_time]
    def on_update(self, pkt, flow):
        pkt_dt_list = [pkt.delta_time]
        flow.udps.delta_time = flow.udps.delta_time + pkt_dt_list
#NetBIOS (SAT-01-12-2018_0475 - SAT-01-12-2018_0485)
for i in range(10):
    a = i + 75
```

```
[3]: # load data
         dat = NFStreamer(source="/home/student/BA/PCAP-01-12/PCAP-01-12_0250-0499/
      \RightarrowSAT-01-12-2018_04"+str(a)+".pcap",
                                   decode_tunnels=True,
                                   bpf_filter=None,
                                   promiscuous_mode=True,
                                   snapshot_length=1536,
                                   idle_timeout=120,
                                   active timeout=1800,
                                   accounting_mode=0,
                                   udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                                   n_dissections=20,
                                   statistical_analysis=True,
                                   splt_analysis=0,
                                   n_meters=0,
                                   performance_report=0,
```

```
system_visibility_mode=0,
                              system_visibility_poll_ms=100,
                              system_visibility_extension_port=28314).to_pandas()
    if i == 0:
        netBIOS = dat
    else:
        netBIOS = pd.concat([netBIOS, dat], ignore_index = True)
#SNMP
for i in range(10):
    if i < 10:
        dat = NFStreamer(source="/home/student/BA/PCAP-01-12/
 ⇔PCAP-01-12_0500-0749/SAT-01-12-2018_050"+str(i)+".pcap",
                                  decode_tunnels=True,
                                  bpf filter=None,
                                  promiscuous_mode=True,
                                  snapshot length=1536,
                                  idle_timeout=120,
                                  active_timeout=1800,
                                  accounting_mode=0,
                                  udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                                  n_dissections=20,
                                  statistical_analysis=True,
                                  splt_analysis=0,
                                  n_meters=0,
                                  performance_report=0,
                                  system_visibility_mode=0,
                                  system_visibility_poll_ms=100,
                                  system_visibility_extension_port=28314).
 ⇔to_pandas()
    else:
        dat = NFStreamer(source="/home/student/BA/PCAP-01-12/
 \hookrightarrow PCAP-01-12\_0500-0749/SAT-01-12-2018\_05"+str(i)+".pcap",
                                  decode tunnels=True,
                                  bpf_filter=None,
                                  promiscuous mode=True,
                                  snapshot_length=1536,
                                  idle_timeout=120,
                                  active_timeout=1800,
                                  accounting_mode=0,
                                  udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                                  n_dissections=20,
                                  statistical_analysis=True,
```

```
splt_analysis=0,
                                  n_meters=0,
                                 performance_report=0,
                                  system_visibility_mode=0,
                                  system_visibility_poll_ms=100,
                                  system_visibility_extension_port=28314).
 →to_pandas()
    if i == 0:
        snmp = dat
    else:
        snmp = pd.concat([snmp, dat], ignore_index = True)
#TFTP (SAT-01-12-2018_0750 - SAT-01-12-2018_075?)
for i in range(10):
    dat = NFStreamer(source="/home/student/BA/PCAP-01-12/PCAP-01-12_0750-0818/
 \rightarrowSAT-01-12-2018_075"+str(i)+".pcap",
                             decode_tunnels=True,
                             bpf_filter=None,
                             promiscuous_mode=True,
                             snapshot_length=1536,
                             idle_timeout=120,
                             active_timeout=1800,
                             accounting_mode=0,
                             udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                             n_dissections=20,
                             statistical_analysis=True,
                             splt_analysis=0,
                             n_meters=0,
                             performance_report=0,
                             system_visibility_mode=0,
                              system_visibility_poll_ms=100,
                              system_visibility_extension_port=28314).to_pandas()
    if i == 0:
        tftp = dat
    else:
        tftp = pd.concat([tftp, dat], ignore_index = True)
# MSSQL (SAT-01-12-2018 0444)
mssql = NFStreamer(source="/home/student/BA/PCAP-01-12/PCAP-01-12_0250-0499/
 →SAT-01-12-2018_0444.pcap",
```

```
decode_tunnels=True,
                         bpf_filter=None,
                         promiscuous_mode=True,
                         snapshot_length=1536,
                         idle_timeout=120,
                         active_timeout=1800,
                         accounting_mode=0,
                         udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                         n dissections=20,
                         statistical_analysis=True,
                         splt_analysis=0,
                         n_meters=0,
                         performance_report=0,
                         system_visibility_mode=0,
                         system_visibility_poll_ms=100,
                         system_visibility_extension_port=28314).to_pandas()
#2013-12-17_capture1
comparison = NFStreamer(source="/home/student/BA/Comparison-Traffic/

⇔2013-12-17_capture1.pcap",

                         decode_tunnels=True,
                         bpf_filter=None,
                         promiscuous_mode=True,
                         snapshot_length=1536,
                         idle_timeout=120,
                         active_timeout=1800,
                         accounting_mode=0,
                         udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                         n_dissections=20,
                         statistical analysis=True,
                         splt_analysis=0,
                         n meters=0,
                         performance_report=0,
                         system_visibility_mode=0,
                         system_visibility_poll_ms=100,
                         system_visibility_extension_port=28314).to_pandas()
skypecomparison = NFStreamer(source="/home/student/BA/Comparison-Traffic/test2.
 ⇔pcap",
                         decode_tunnels=True,
                         bpf_filter=None,
                         promiscuous_mode=True,
                         snapshot_length=1536,
                         idle_timeout=120,
```

```
active_timeout=1800,
                         accounting_mode=0,
                         udps=[TimeDiff(), PayloadSize(),DeltaTime()],
                         n_dissections=20,
                         statistical_analysis=True,
                         splt_analysis=0,
                         n meters=0,
                         performance_report=0,
                         system visibility mode=0,
                         system_visibility_poll_ms=100,
                         system_visibility_extension_port=28314).to_pandas()
skype2comparison = NFStreamer(source="/home/student/BA/Comparison-Traffic/
 ⇔skype2.pcap",
                         decode_tunnels=True,
                         bpf filter=None,
                         promiscuous_mode=True,
                         snapshot length=1536,
                         idle_timeout=120,
                         active timeout=1800,
                         accounting mode=0,
                         udps=[TimeDiff(), PayloadSize(), DeltaTime()],
                         n_dissections=20,
                         statistical_analysis=True,
                         splt_analysis=0,
                         n_meters=0,
                         performance_report=0,
                         system_visibility_mode=0,
                         system_visibility_poll_ms=100,
                         system_visibility_extension_port=28314).to_pandas()
```

```
/home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False.
    df = pd.read_csv(temp_file_path)
/home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
DtypeWarning: Columns (81,82,83,85) have mixed types. Specify dtype option on import or set low_memory=False.
    df = pd.read_csv(temp_file_path)
/home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False.
```

df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read csv(temp file path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read csv(temp file path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import or set low_memory=False.

df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read csv(temp file path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,83) have mixed types. Specify dtype option on import or set low memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,83) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read csv(temp file path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82,83,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path) /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,84,85) have mixed types. Specify dtype option on import or set low_memory=False. df = pd.read_csv(temp_file_path)

/home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495: DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import

or set low_memory=False.

```
df = pd.read_csv(temp_file_path)
    /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
    DtypeWarning: Columns (81,82,84,85) have mixed types. Specify dtype option on
    import or set low_memory=False.
      df = pd.read csv(temp file path)
    /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
    DtypeWarning: Columns (81,82,84,85) have mixed types. Specify dtype option on
    import or set low_memory=False.
      df = pd.read_csv(temp_file_path)
    /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
    DtypeWarning: Columns (81,82) have mixed types. Specify dtype option on import
    or set low_memory=False.
      df = pd.read_csv(temp_file_path)
    /home/student/.local/lib/python3.10/site-packages/nfstream/streamer.py:495:
    DtypeWarning: Columns (81,82,83) have mixed types. Specify dtype option on
    import or set low_memory=False.
      df = pd.read_csv(temp_file_path)
[4]: # organising data
     for a in data:
         #add new columns with shorter name/in datetime/in seconds
         df = vars()[a]
         df['fs ms'] = df['src2dst first seen ms']
         df['fs_dt'] = pd.to_datetime(df['fs_ms'], unit = 'ms') - timedelta(hours=4,__
         df['fs_dt_s'] = df['fs_dt'].astype('datetime64[s]')
         #sort by first_seen
         df.sort_values(by=['fs_ms'], inplace=True)
         #name tables the correct name
         df.columns.name = a
         #add timestamp that gives time from first row (normed timestamp for
      ⇔comparison in same plot)
         df['time_norm'] = df.loc[:,'fs_dt'] - df.loc[0]['fs_dt']
         vars()[a] = df
     # New Dataframes to store results for different metrics
     metrics = ['time_diff_pkt',
                'time_diff_flow',
                'freq_pp',
                'freq_pf',
                'freq_pdf',
```

2 Calculating Metrics

2.1 1. Time difference

2.1.1 a. Time difference per flow

```
[5]: for i in data:
    df = vars()[i]
    #calculate difference
    df['timediff'] = df['fs_ms'].diff()
    vars()[i] = df
    results_time_diff_flow.loc['min'][i] = df['timediff'].min()
    results_time_diff_flow.loc['mean'][i] = df['timediff'].mean()
    results_time_diff_flow.loc['max'][i] = df['timediff'].max()
    results_time_diff_flow.loc['std_dev'][i] = df['timediff'].std()

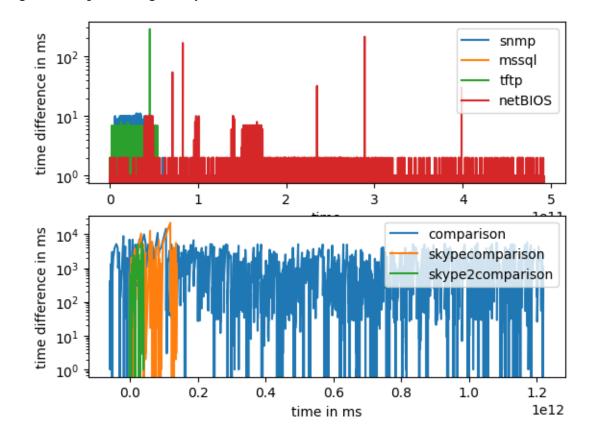
results_time_diff_flow
```

```
[5]:
                                                   comparison \
                            mssql
                                     tftp
                                          netBIOS
                    snmp
    time_diff_flow
   min
                     0.0
                             0.0
                                      0.0
                                              0.0
                                                         0.0
                                            213.0
    max
                    11.0
                             2.0
                                    285.0
                                                     14722.0
                 0.122806 0.123833 0.050004 0.141525
   mean
                                                   480.902329
    std_dev
                 skypecomparison skype2comparison
    time_diff_flow
```

min 0.0 0.0 max 22061.0 5556.0 mean 808.388235 456.678161 std_dev 2366.161029 1000.716424

```
[6]: fig, (ax1, ax2) = plt.subplots(2,1)
     for i in attacks_only:
         df = vars()[i]
         ax1.plot(df['time_norm'], df['timediff'], label = i)
         ax1.set_yscale('log')
     ax1.legend()
     ax1.set_xlabel("time")
     ax1.set_ylabel("time difference in ms")
     for i in comp_only:
         df = vars()[i]
         ax2.plot(df['time_norm'], df['timediff'], label = i)
     ax2.set_yscale('log')
     ax2.set_xlabel("time in ms")
     ax2.set_ylabel("time difference in ms")
     plt.legend()
    plt.show()
```

/home/student/.local/lib/python3.10/sitepackages/IPython/core/pylabtools.py:151: UserWarning: Creating legend with loc="best" can be slow with large amounts of data. fig.canvas.print_figure(bytes_io, **kw)



2.1.2 1b. Time difference per packet

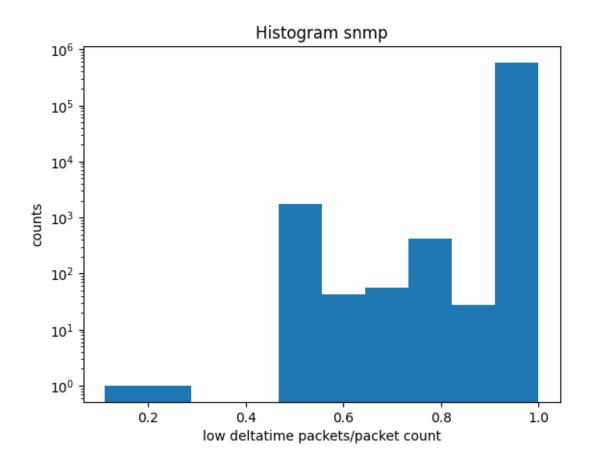
```
[7]: for i in data:
         df = vars()[i]
         vars()[i] = df
         #add lists of delta_time
         alist = df['udps.delta_time'].tolist()
         flat_list = [item for sublist in alist for item in sublist]
         flat_list = [int(x) for x in flat_list if x.lstrip('-').isdigit()]
         df2 = pd.DataFrame(flat_list, columns=['dt'])
         vars()['pkt_dt_'+i] = df2
         df = vars()[i]
         results_time_diff_pkt.loc['min'][i] = df2['dt'].min()
         results_time_diff_pkt.loc['mean'][i] = df2['dt'].mean()
         results_time_diff_pkt.loc['max'][i] = df2['dt'].max()
         results_time_diff_pkt.loc['std_dev'][i] = df2['dt'].std()
     results_time_diff_pkt
[7]:
                                                    netBIOS comparison \
                                 mssql
                                             tftp
                        snmp
     time_diff_pkt
    min
                           0
                                      0
                                                0
                                                          0
                                                                      0
                                                                      9
                           9
                                      9
                                                9
                                                          9
    max
    mean
                     0.00871
                                 0.0129
                                          1.18458
                                                   0.016764
                                                               1.755786
                    0.201748 0.260333 2.490309
                                                   0.280083
     std_dev
                                                              2.565096
                   skypecomparison skype2comparison
     time_diff_pkt
                                 0
                                                   0
    min
                                                   9
                                  9
     max
                          2.640506
                                            2.489322
     mean
     std_dev
                          2.598634
                                            2.753836
```

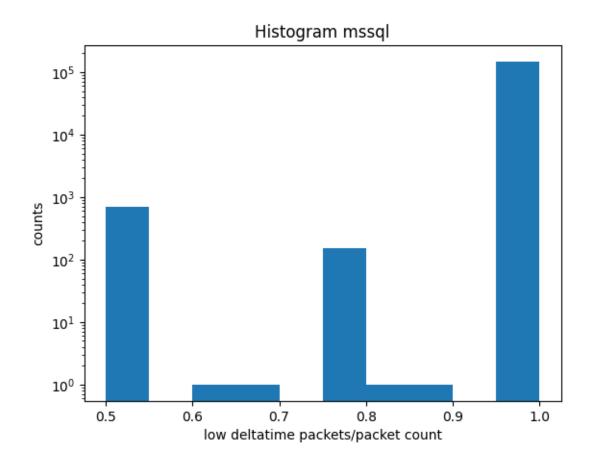
2.1.3 1c. packets with delta_time < 1 ms

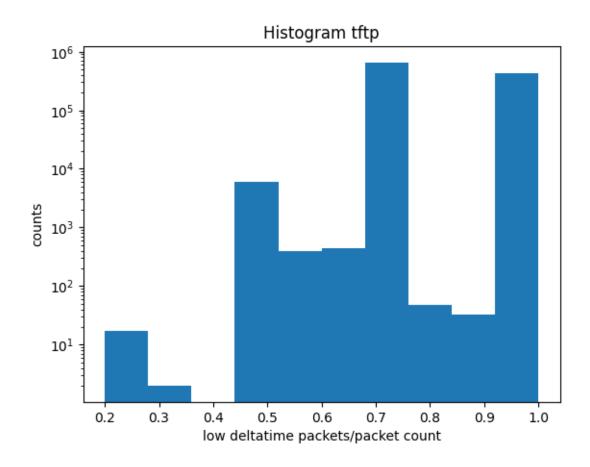
[]:

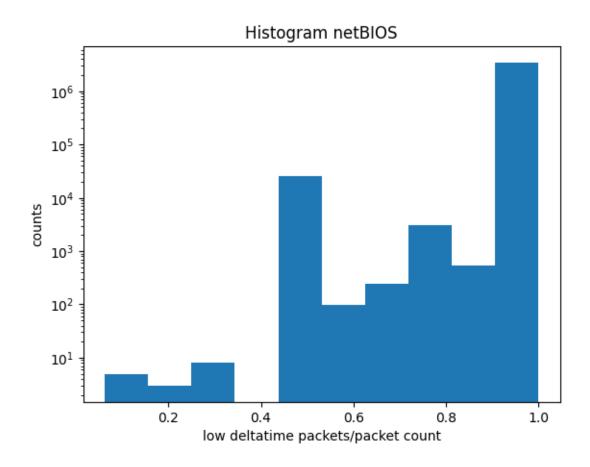
```
results_low_delta_time[i]['mean'] = df['lowtimediffcount/packetcount'].
 →mean()
   results_low_delta_time[i]['max'] = df['lowtimediffcount/packetcount'].max()
   results_low_delta_time[i]['std_dev'] = df['lowtimediffcount/packetcount'].
 ⇔std()
   #hist
   fig, ax = plt.subplots()
   plt.hist(df['lowtimediffcount/packetcount'])
   ax.set_yscale('log')
   ax.set_title('Histogram '+i)
   #ax.set_yscale('log')
   ax.set_xlabel("low deltatime packets/packet count")
   ax.set_ylabel("counts")
   plt.show
   vars()[i] = df
results_low_delta_time
```

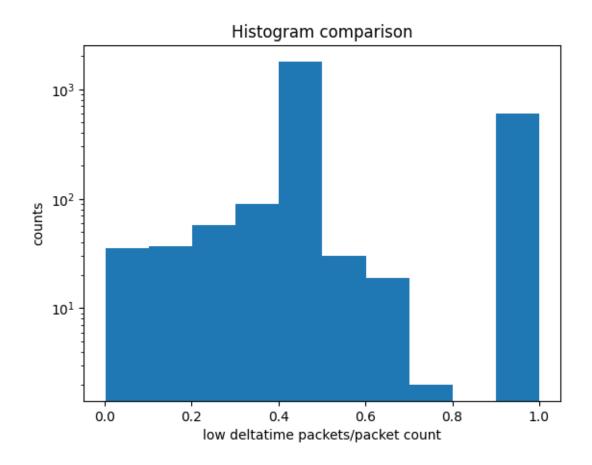
| [8]: | | snmp | mssql | tftp | netBIOS | comparison | \ |
|------|---------------------------|------------|------------|------------|----------|------------|---|
| | low_delta_time | | | | | | |
| | min | 0.111111 | 0.5 | 0.2 | 0.0625 | 0.002075 | |
| | max | 1.0 | 1.0 | 1.0 | 1.0 | 1.0 | |
| | mean | 0.998273 | 0.997379 | 0.84645 | 0.996103 | 0.59256 | |
| | std_dev | 0.028379 | 0.035175 | 0.124718 | 0.04321 | 0.234294 | |
| | | | | | | | |
| | | skypecompa | rison skyp | e2comparis | on | | |
| | <pre>low_delta_time</pre> | | | | | | |
| | min | 0. | 00627 | 0.0441 | 18 | | |
| | max | | 1.0 | 1 | .0 | | |
| | mean | 0.4 | 70765 | 0.5153 | 28 | | |
| | std_dev | 0.2 | 28087 | 0.1872 | 05 | | |

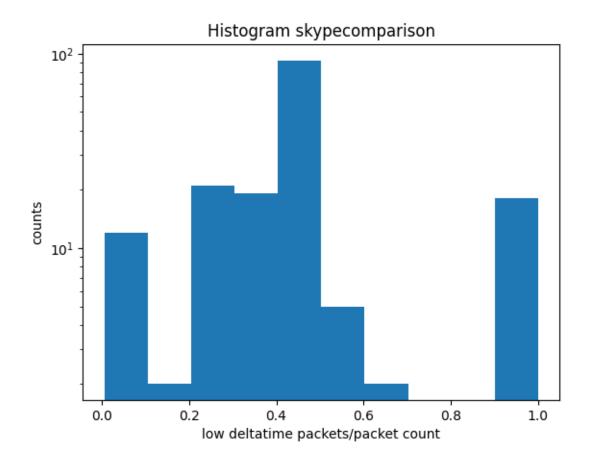


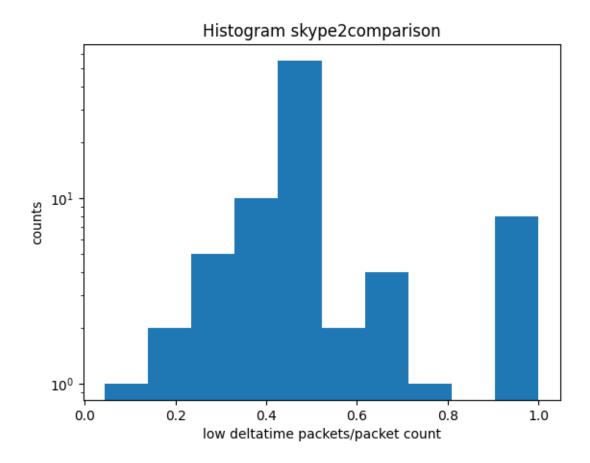




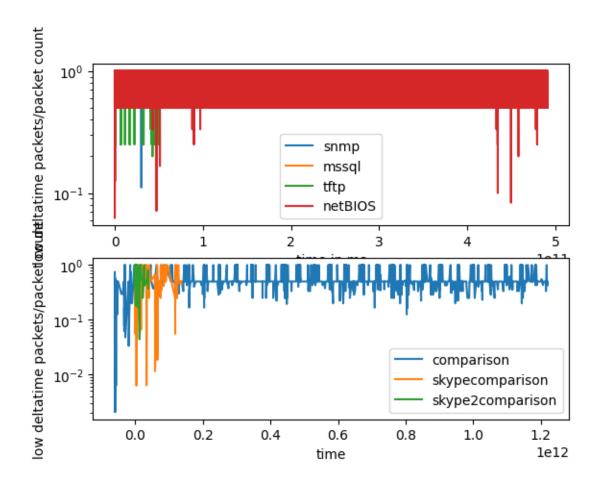








```
[9]: fig, (ax1, ax2) = plt.subplots(2,1)
     for i in attacks_only:
         df = vars()[i]
         ax1.plot(df['time_norm'], df['lowtimediffcount/packetcount'], label = i)
         ax1.set_yscale('log')
     ax1.legend()
     ax1.set_xlabel("time in ms")
     ax1.set_ylabel("low deltatime packets/packet count")
     for i in comp_only:
         df = vars()[i]
         ax2.plot(df['time_norm'], df['lowtimediffcount/packetcount'], label = i)
         ax2.set_yscale('log')
         ax2.set_xlabel("time")
         ax2.set_ylabel("low deltatime packets/packet count")
     plt.legend()
     plt.show()
```



2.2 2. Frequency

2.2.1 2a. Frequency per packet

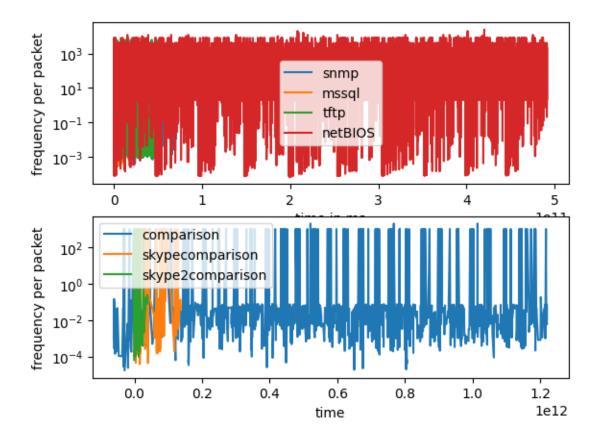
```
for i in data:
    df = vars()[i]
    df['timediff_nn'] = df['timediff']
    #df.loc[(df.timediff == 0), 'timediff_nn'] = 0.00001
    df['bidir_dur'] = df['bidirectional_duration_ms']
    df.loc[(df.bidirectional_duration_ms == 0), 'bidir_dur'] = 0.001

df['frequency_nn'] = df['bidirectional_packets']/df['bidir_dur']
    df['frequency'] = df['bidirectional_packets']/
    df['bidirectional_duration_ms']
    results_freq_pp.loc['min'][i] = df['frequency_nn'].min()
    results_freq_pp.loc['mean'][i] = df['frequency_nn'].mean()
    results_freq_pp.loc['max'][i] = df['frequency_nn'].max()
    results_freq_pp.loc['std_dev'][i] = df['frequency_nn'].std()
```

```
vars()[i] = df
display(results_freq_pp)
```

```
snmp
                                 mssql
                                              tftp
                                                        netBIOS comparison \
     freq_pp
     min
                0.000422
                             0.000244
                                           0.00075
                                                       0.000074
                                                                   0.000017
                  6000.0
                                6000.0
                                            6000.0
                                                        24000.0
                                                                     2000.0
     max
     mean
              1992.43252 1988.680047 783.805995 1985.746537
                                                                  227.95735
     std_dev 127.091629
                           153.319547 976.784733
                                                     214.724791 422.248642
             skypecomparison skype2comparison
     freq_pp
     min
                    0.000039
                                      0.000067
     max
                      1000.0
                                        1000.0
     mean
                  105.308529
                                     90.955433
     std dev
                  307.777902
                                    289.112516
[11]: fig, (ax1, ax2) = plt.subplots(2,1)
      for i in attacks_only:
          df = vars()[i]
          ax1.plot(df['time_norm'], df['frequency_nn'], label = i)
          ax1.set_yscale('log')
          ax1.set_xlabel("time in ms")
          ax1.set_ylabel("frequency per packet")
      ax1.legend()
      for i in comp_only:
          df = vars()[i]
          ax2.plot(df['time_norm'], df['frequency_nn'], label = i)
          ax2.set_yscale('log')
          ax2.set xlabel("time")
          ax2.set_ylabel("frequency per packet")
      plt.legend()
      plt.show()
```

/home/student/.local/lib/python3.10/sitepackages/IPython/core/pylabtools.py:151: UserWarning: Creating legend with loc="best" can be slow with large amounts of data. fig.canvas.print_figure(bytes_io, **kw)



2.2.2 2b. Frequency per flow

freq_pf

```
for i in data:
    df = vars()[i]
    df['bidir_dur'] = df['bidirectional_duration_ms']
    df.loc[(df.bidirectional_duration_ms == 0), 'bidir_dur'] = 0.001

df['freq_pf'] = 1/df['bidir_dur']

results_freq_pf.loc['min'][i] = df['freq_pf'].min()
    results_freq_pf.loc['mean'][i] = df['freq_pf'].mean()
    results_freq_pf.loc['max'][i] = df['freq_pf'].max()
    results_freq_pf.loc['std_dev'][i] = df['freq_pf'].std()

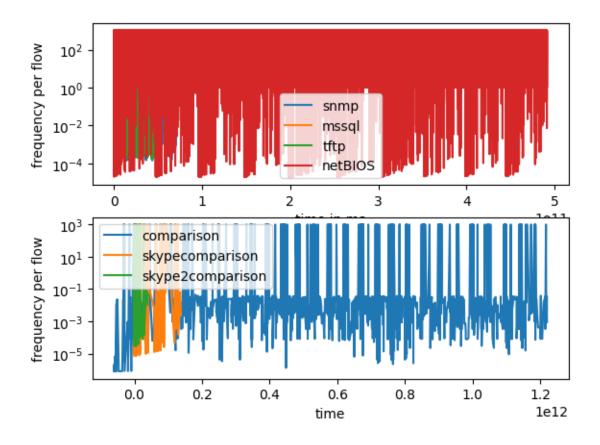
vars()[i] = df

display(results_freq_pf)

snmp    mssql    tftp    netBIOS comparison \
```

```
0.000143
                            0.000056
                                         0.000175
                                                     0.000018
                                                                 0.000001
     min
                  1000.0
                              1000.0
                                           1000.0
                                                       1000.0
                                                                   1000.0
     max
                                       391.806666 991.627808 226.821109
              996.101417 994.229158
     mean
     std_dev
               62.292027
                           75.715607
                                       488.152241
                                                    91.075167 418.843561
             skypecomparison skype2comparison
     freq pf
     min
                    0.000007
                                      0.000028
                      1000.0
                                        1000.0
     max
                  105.284259
                                     90.926309
     mean
     std_dev
                  307.786248
                                    289.121775
[13]: fig, (ax1, ax2) = plt.subplots(2,1)
      for i in attacks_only:
          df = vars()[i]
          ax1.plot(df['time_norm'], df['freq_pf'], label = i)
          ax1.set_yscale('log')
          ax1.set_xlabel("time in ms")
          ax1.set_ylabel("frequency per flow")
      ax1.legend()
      for i in comp_only:
          df = vars()[i]
          ax2.plot(df['time_norm'], df['freq_pf'], label = i)
          ax2.set yscale('log')
          ax2.set_xlabel("time")
          ax2.set_ylabel("frequency per flow")
      plt.legend()
      plt.show()
```

```
/home/student/.local/lib/python3.10/site-
packages/IPython/core/pylabtools.py:151: UserWarning: Creating legend with
loc="best" can be slow with large amounts of data.
  fig.canvas.print_figure(bytes_io, **kw)
```



2.2.3 2c. Mean Packet Frequency

snmp

Mean pkt freq

tftp

netBIOS comparison \

mssql

```
mean 16.333533 16.179457 64.401301 14.199128 0.367612

skypecomparison skype2comparison

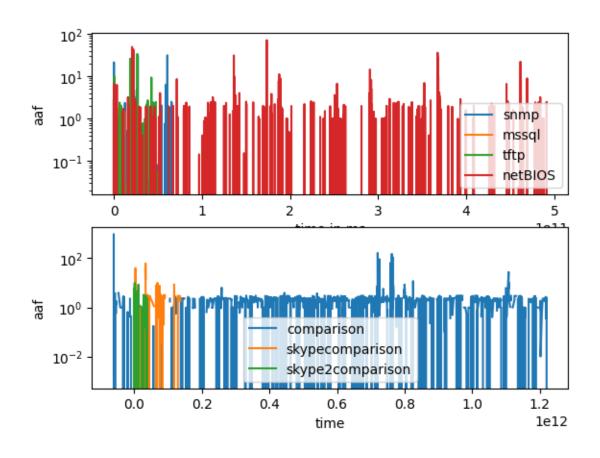
Mean pkt freq

mean 0.095193 0.139792
```

2.3 Amplification Attack Factor

```
[15]: for i in data:
          df = vars()[i]
          df['aaf'] = df['udps.dst2src_size']/df['udps.src2dst_size']
          results_aaf.loc['min'][i] = df['aaf'].min()
          results_aaf.loc['mean'][i] = df['aaf'].mean()
          results_aaf.loc['max'][i] = df['aaf'].max()
          results_aaf.loc['std_dev'][i] = df['aaf'].std()
          vars()[i] = df
          #plot
      fig, (ax1, ax2) = plt.subplots(2,1)
      for i in attacks_only:
          df = vars()[i]
          ax1.plot(df['time_norm'], df['aaf'], label = i)
          ax1.set_yscale('log')
          ax1.set_xlabel("time in ms")
          ax1.set_ylabel("aaf")
      ax1.legend()
      for i in comp_only:
          df = vars()[i]
          ax2.plot(df['time_norm'], df['aaf'], label = i)
          ax2.set_yscale('log')
          ax2.set xlabel("time")
          ax2.set_ylabel("aaf")
      plt.legend()
      plt.show()
      results_aaf
```

```
/home/student/.local/lib/python3.10/site-
packages/IPython/core/pylabtools.py:151: UserWarning: Creating legend with
loc="best" can be slow with large amounts of data.
fig.canvas.print_figure(bytes_io, **kw)
```

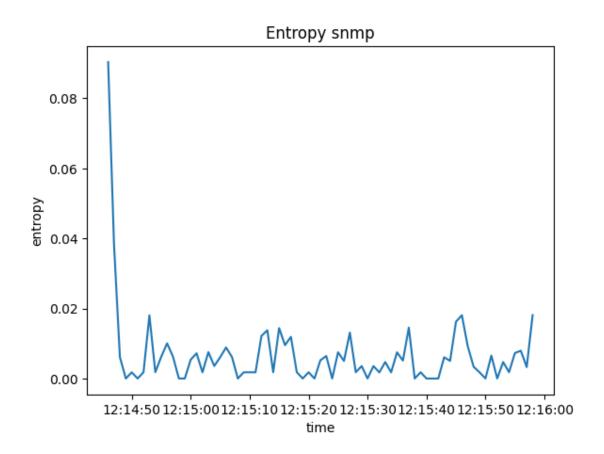


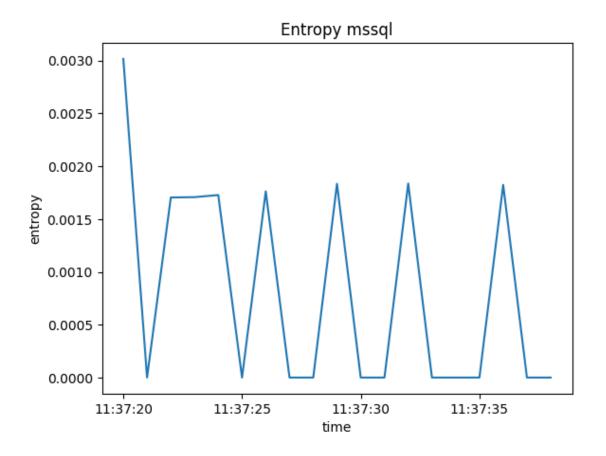
| [15]: | | snmp | mssql | tftp | netBIOS | comparison | skypecomparison | \ |
|-------|---------|------------|----------|-----------|---------|------------|-----------------|---|
| | aaf | | | | | | | |
| | min | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | 0.0 | |
| | max | 31.0 | 1.740364 | 36.113322 | inf | 952.664285 | inf | |
| | mean | 0.000613 | 0.000022 | 0.000335 | inf | 2.380391 | inf | |
| | std_dev | 0.076589 | 0.005908 | 0.0672 | NaN | 20.128849 | NaN | |
| | | -1 0 | | | | | | |
| | | skype2comp | arison | | | | | |
| | aaf | | | | | | | |
| | min | | 0.0 | | | | | |
| | max | 9. | 936937 | | | | | |
| | mean | 2. | 252601 | | | | | |
| | std_dev | 2. | 018147 | | | | | |
| г л | | | | | | | | |
| []: | | | | | | | | |
| []: | | | | | | | | |
| 2 3 . | | | | | | | | |

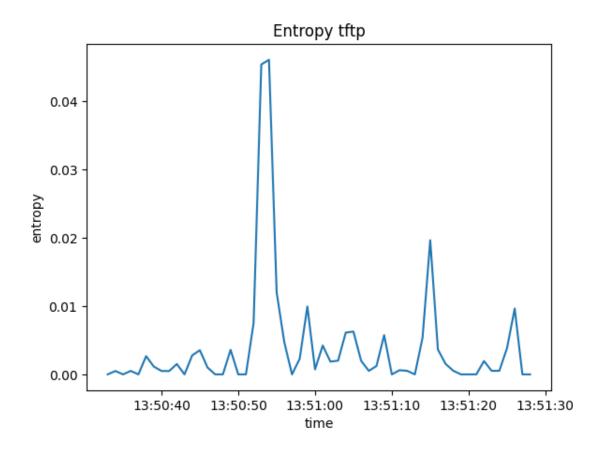
2.4 4. Entropy per second

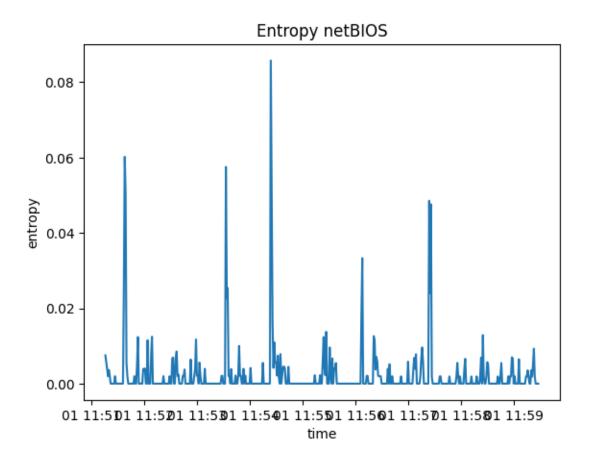
```
[16]: for i in data:
          df = vars()[i]
          ms_split = {n: g for n, g in df.groupby(pd.Grouper(key='fs_dt_s',__

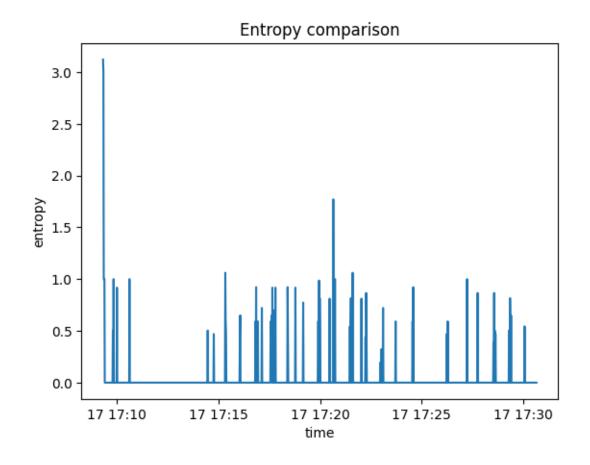
¬freq='1s'))}
          ms split = {k.to pydatetime():v for k,v in ms split.items()}
          entropy_time = {}
          for k,v in ms_split.items():
              #group by src_ip and get count
              value, counts = np.unique(v['src_ip'], return_counts = True)
              df1 = pd.DataFrame({'src_ip': value, 'ip_counts': counts})
              #display(df1)
              #calculate entropy
              df1['p_i'] = df1['ip_counts']/df1['ip_counts'].sum()
              entropy = - (df1['p_i'] * np.log2(df1['p_i'])).sum()
              #print(entropy)
              entropy_time[k] = entropy
              #entropy_time['entropy'] = entropy
          #display(entropy_time)
          entropy_time = pd.DataFrame.from_dict(entropy_time, orient='index',__
       ⇔columns=['entropy'])
          entropy_time.columns.name = i
          vars()["entropy_time_"+i] = entropy_time
           #plot
          fig, ax = plt.subplots()
          ax.plot(vars()["entropy_time_"+i])
          ax.set_title("Entropy "+i)
          ax.set xlabel("time")
          ax.set_ylabel("entropy")
          #plt.hist(stat)
          plt.show
          vars()[i] = df
```

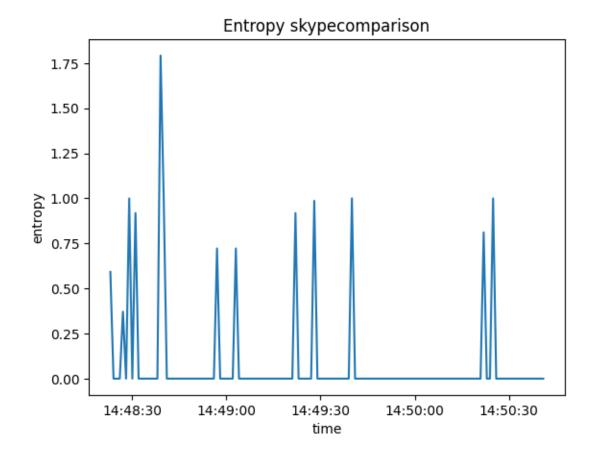


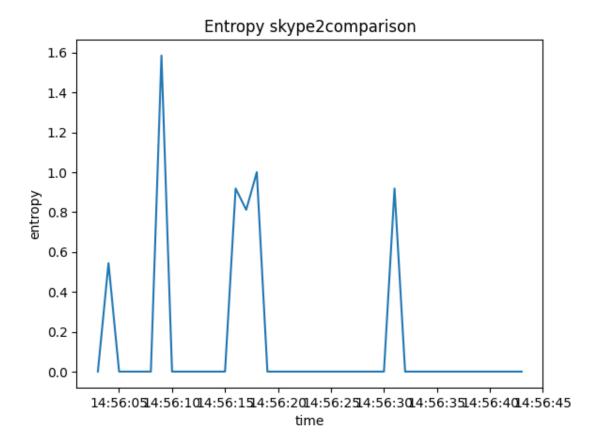












2.5 5. packet count

```
for i in data:
    df = vars()[i]
    results_packet_count_pf.loc['min'][i] = df['bidirectional_packets'].min()
    results_packet_count_pf.loc['mean'][i] = df['bidirectional_packets'].mean()
    results_packet_count_pf.loc['max'][i] = df['bidirectional_packets'].max()
    results_packet_count_pf.loc['std_dev'][i] = df['bidirectional_packets'].

std()

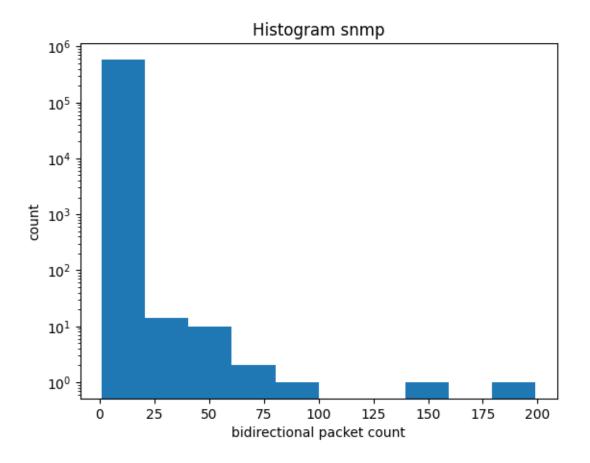
#hist
fig, ax = plt.subplots()
plt.hist(df['bidirectional_packets'])
ax.set_title('Histogram '+i)
ax.set_yscale('log')
ax.set_yscale('log')
ax.set_ylabel("count")
plt.show
```

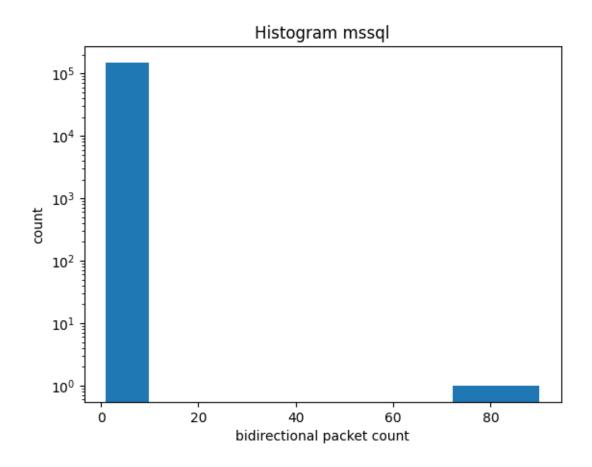
```
vars()[i] = df
results_packet_count_pf
```

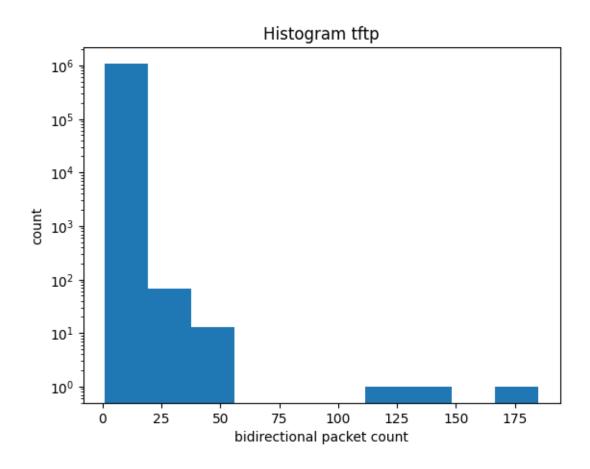
| [17]: | | snmp | mssql | tftp | netBIOS | comparison | \ |
|-------|-----------------|----------|----------|----------|----------|-------------|---|
| | packet_count_pf | | | | | | |
| | min | 1 | 1 | 1 | 1 | 1 | |
| | max | 199 | 90 | 185 | 510 | 184518 | |
| | mean | 2.00586 | 2.003539 | 3.220306 | 2.009533 | 176.957191 | |
| | std_dev | 0.454566 | 0.313122 | 1.054226 | 0.723176 | 4831.180902 | |
| | | | | | | | |

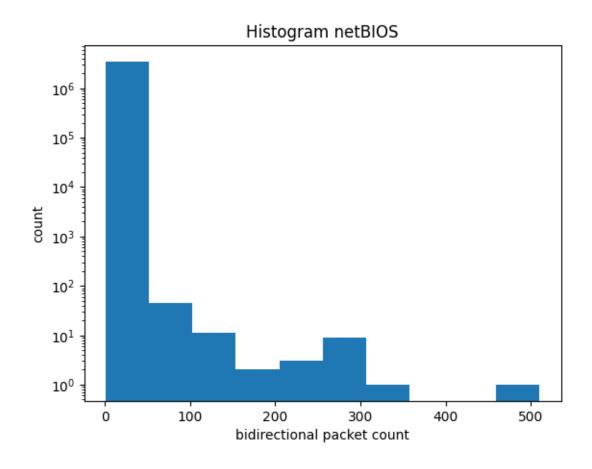
skypecomparison skype2comparison

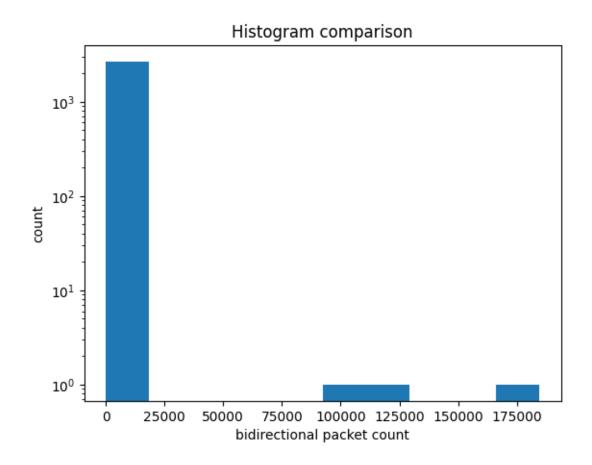
| packet_count_pf | | |
|-----------------|------------|-----------|
| min | 1 | 1 |
| max | 6265 | 4775 |
| mean | 78.035088 | 63.295455 |
| std_dev | 574.254318 | 508.48832 |

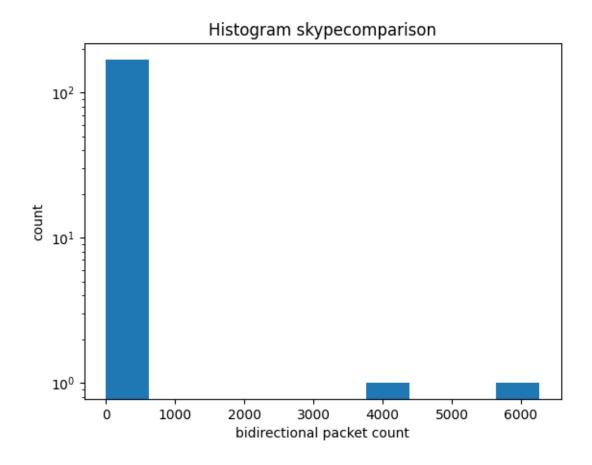


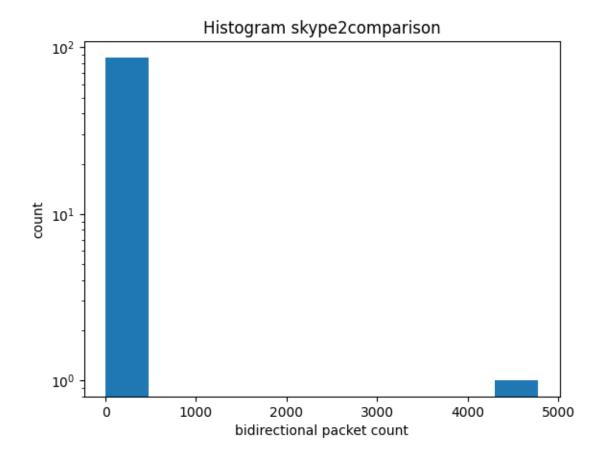










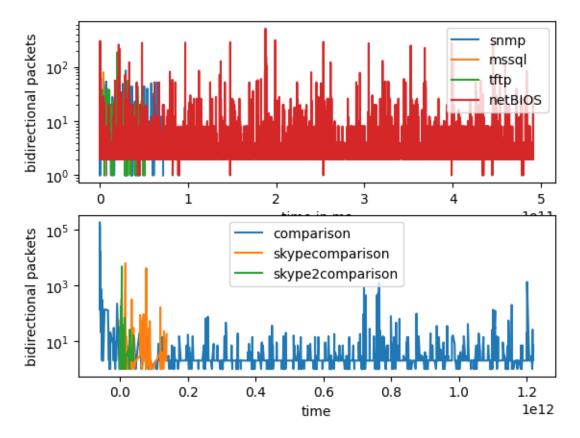


```
[18]: fig, (ax1, ax2) = plt.subplots(2,1)
      for i in attacks_only:
          df = vars()[i]
          ax1.plot(df['time_norm'], df['bidirectional_packets'], label = i)
          ax1.set_yscale('log')
          ax1.set_xlabel("time in ms")
          ax1.set_ylabel("bidirectional packets")
      ax1.legend()
      for i in comp_only:
          df = vars()[i]
          ax2.plot(df['time_norm'], df['bidirectional_packets'], label = i)
          ax2.set_yscale('log')
          ax2.set_xlabel("time")
          ax2.set_ylabel("bidirectional packets")
      plt.legend()
      plt.show()
```

/home/student/.local/lib/python3.10/site-

packages/IPython/core/pylabtools.py:151: UserWarning: Creating legend with loc="best" can be slow with large amounts of data.

fig.canvas.print_figure(bytes_io, **kw)



| []: | |
|-----|--|
| []: | |