# SMBLoris Attack Data Analysis

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**Abstract**—SMBLoris is a type of denial of service(DOS) attack which attempts to utilize the victim's memory space by sending it several TCP connection requests. The data interpretation and analysis has been conducted in order to extract this type of attack's patterns and unique characteristics that can be utilized in order to predict future similar attacks in the network.

**Keywords**— SMBLoris Attack, Denial of Service, Data Analytics

# I. Introduction

The focus of conducted research is on the SMBLoris attack which is an application-level denial of service that lies where SMB packets are processed and by initiation of several TCP connections targeting the critical services of victim, it attempts to consume all its available memory and cause an operating system to freeze and finally crash. It was discovered by two RiskSense security researchers Sean Dillon and Jenna Magius and took its name from Slowloris attack on Webserver back in 2009.[4] It is considerable that SMBLoris functions same as SlowLoris except that unlike its counterpart which targets the web services, it is performed via SMB and functions based on NetBios Session Service (NBSS) filling. Since each connection to NBSS allocates 128KB of memory that is released only when the connection is closed(after 30 seconds of no activity), in case the attacker uses its 65535 available TCP ports, more than 8GB is filled up and the NBSS memory saturation occurs and a manual server reboot would be required. Not only after having the connection opened for 30 seconds, the kernel gives up, but also during the 30 seconds, the allocated percentage of memory is useless for every other connection attempt. It is considerable that the allocated memory can not be swapped with that of the disk due to the fact that it's in the physical RAM. The NetBIOS service on port 139 is also exploitable but below report is based on port 445 which can be expanded to port 139 as well.

The scope of this project is to simulate the SMBLoris attack scenario by the help of a range of tools such as Kali Linux and Wireshark in order to generate the raw dataset. In addition, we use a variety of tools for data interpretation(i.e, CICFlowMeter) and data analysis(i.e, Jupyter Notebook) of the conducted attack.

Regarding the encountered limitations, it is noticeable that the represented data in the wireshark output's format is not useful in the analysis as all the data is presented in the Info column which is not distinct. Hence, in order to mitigate that issue, CICFlowMeter is used instead. However, it also does not present the clean data set. Although it is tried to clean the data, it can not be as efficient as that of the prepared data sets.

#### II. Discussion

In order to simulate the SMBLoris attack, two machines were set up in Kali Linux, one performing as attacker and the other one as victim. Also, we have used a windows machine in order to generate normal Samba traffic before the attack starts, including browsing the shared files. The number of supported TCP connections on the victim has been increased to 65535 and the respective victim's port on which the attack is employed is 445. Before initiating the attack, Wireshark has been employed to capture the pre-attack packets which gives the ability to compare the normal traffic packets and that of the attack traffic. The generated Wireshark output lacks the proper formatting which is replaced by the output of the CICFlowMeter tool that attempts to organize data in a more proper format for data interpretation and analysis. Next, the data interpretation and analysis has been commenced by the help of CICFlowMeter output and Jupyter Notebook, respectively and the results are presented in the data analytics section.

#### A. Security/Privacy Data Collection

As discussed before, SMBLoris is a remote, unauthenticated application-level denial of service (DoS) attack against Microsoft Windows operating systems which is caused by a very old memory-handling bug in the Server Message Block (SMB) network protocol implementation. The vulnerability lies in the way SMB packets are processed and memory is allocated. The attack is simulated to gather the dataset required for the analysis. In the attack scenario, the windows IP used to generate the normal pre-attack traffic is 192.168.254.1, attacker IP is 192.168.254.3 and that of the victim is 192.168.254.4. Pre-attack traffic has also been logged in order to have a glimpse of the normal traffic data and be able to later extract the attack traffic pattern from the raw dataset. Normal pre-attack traffic generation was done using the ping and browsing the samba server shared files from the windows and was captured by the Wireshark as depicted in figures 1 and 2.

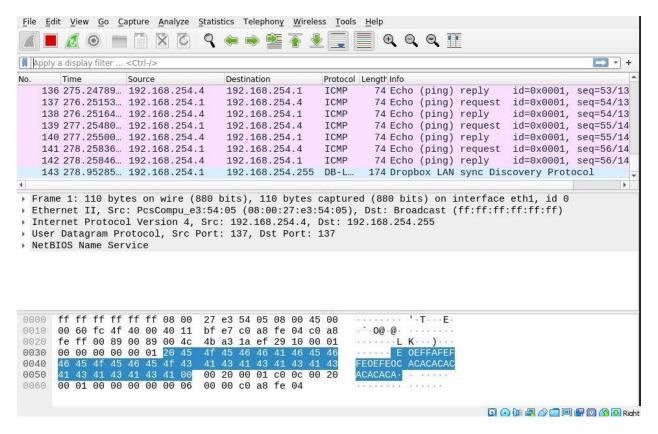


Fig.1.Pre-attack traffic generation by Ping

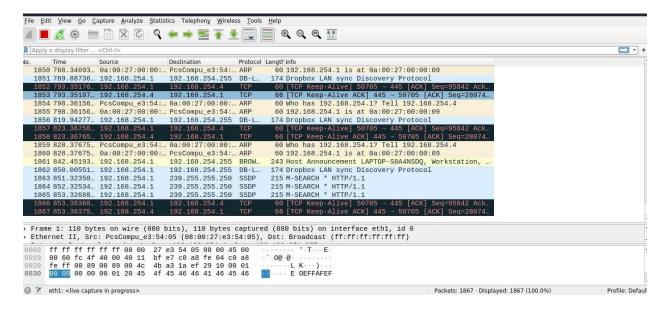


Fig.2. Pre-attack traffic generation by browsing

In order to simulate the SMBLoris attack, the Metasploit module in Kali linux was used on the attacker machine to set the victim's settings. Figure 3 represents the metasploit module settings on the target machine in Kali Linux. The settings include the remote host IP and remote host port. In addition, the number of open sockets has increased to 65535 to be able to compare the effect.

```
msf5 auxiliary(
                                           ) > options
Module options (auxiliary/dos/smb/smb_loris):
   Name
             Current Setting Required Description
    rhost 192.168.254.4
                                                  The target address
                                    ves
    rport 445
                                    yes
                                                 SMB port on the target
msf5 auxiliary(
    Starting server ...
    192.168.254.4:445 - 100 socket(s) open
    192.168.254.4:445 - 200 socket(s) open
    192.168.254.4:445 - 300 socket(s) open 192.168.254.4:445 - 400 socket(s) open
    192.168.254.4:445 - 500 socket(s) open
192.168.254.4:445 - 600 socket(s) open
    192.168.254.4:445 - 700 socket(s) open
192.168.254.4:445 - 800 socket(s) open
192.168.254.4:445 - 900 socket(s) open
    192.168.254.4:445 - 1000 socket(s) open
    192.168.254.4:445 - At open socket limit with 1017 sockets open. Try increasing your system limits.
    192.168.254.4:445 - 1019 socket(s) open
    Auxiliary aborted due to failure: unknown: Module exited abnormally
    Auxiliary module execution completed
msf5 auxiliary(
```

Fig.3. SMBLoris parameter settings in Kali

We have also logged the alarms showing up in the victim's machine during the attack with open sockets default value(i.e 1024) and 65535 which is the maximum number of open sockets. As can be observed in figure 5, with the initial settings, the victim computer has encountered no issue and has enough memory to operate but as the number of open sockets are increased to 65535(figure 6), the victim's memory is used up and it no longer has enough memory to accept new TCP connections and as a result it becomes unresponsive and the victim's system needs a reboot before becoming operational again.

Tasks: 1225 total, 10 running, 1215 sleeping, O stopped, O zombie 0.5 us, 95.2 sy, 0.0 ni, %Cpu(s): 0.0 id, 0.7 wa, 0.0 hi, 3.6 si, 0.0 st 968312 used, (iB Mem: 1017640 total, 49328 free, 96 buffers KiB Swap: 1048572 total, 336124 used, 992 cached Mem 712448 free. PID USER PR **VIRT** RES SHR S %CPU %MEM TIME+ COMMAND NI Ō 0 R 49.8 28 root 20 0 0.0 0:03.77 kswapd0 315344 60 R 14.5 761 root 20 0 60 0.0 0:03.24 smbd 9.5 623968 0 S 0:00.56 mysqld 1160 mysql 20 0 0.0 20 315344 8 8 R 5.6 0:00.20 smbd 2744 root 0 0.0 2743 root 20 0 315424 0 0 R 4.7 0.0 0:00.17 smbd 4.2 2748 root 20 0 315344 192 136 R 0.0 0:00.15 smbd 20 25796 252 156 R 3.3 0:00.34 top 1611 jpesci 0 0.0 2742 root 20 O 315344 88 44 R 3.3 0.0 0:00.12 smbd 20 0 0 0 S 2.5 0:00.27 rcu\_sched 7 root 0 0.0 20 4 S 2.5 2745 root 0 315424 4 0:00.09 smbd 0.0 32 S 2.2 0:00.08 smbd 2746 root 20 0 315424 32 0.0 20 0 0 S 0.8 3 root 0 0 0.0 0:00.11 ksoftirad/0 1532 root 0 20 Ō 0 S 0.6 0.0 0:00.06 kworker/u2:2 2750 root 20 0 315344 104 R 0.6 0.0 0:00.02 smbd 116 0 0.3 8 root 20 Û Ô 0 S 0.0 0:00.06 rcuos/0 2741 root 20 0 315424 0 S 0.3 0.0 0:00.01 smbd 20 0 315344 0:00.01 smbd 2747 root 0 0 R 0.3 0.0315344 2749 root 20 0 20 20 R 0.3 0.0 0:00.01 smbd 12 0:00.92 init 20 0 33644 12 0.0 1 root 0.00 0 S 0:00.00 kthreadd 2 root 20 0 0.0 0.0 20 0 0 0 0 S 0.0 0.00:00.00 kworker/0:0 4 root 5 root 0 - 200 0 S 0.0 0.0 0:00.00 kworker/0:0H 6 root 20 0 0 0 S 0.0 0.0 0:00.11 kworker/u2:0

Fig.5. Victim processes during the attack with 1024 open sockets

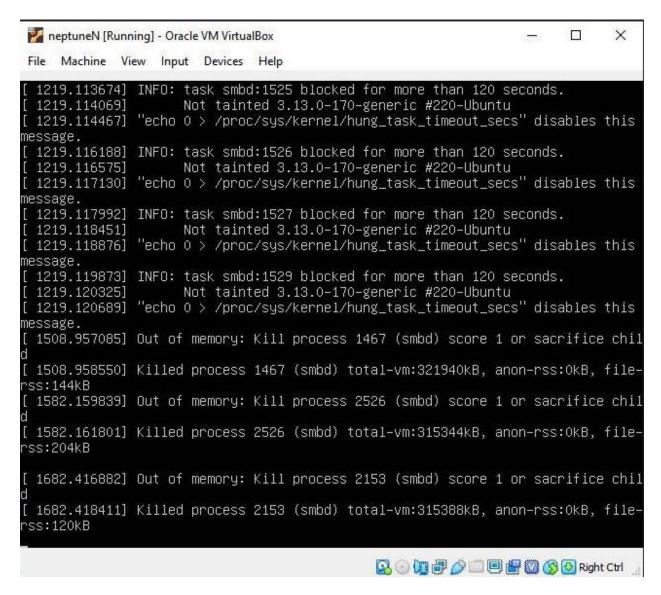


Fig.6. Victim processes during the attack with 65535 open sockets

### B. Security/Privacy Data Interpretation

In order to extract the relevant pattern to the conducted attack from the wireshark logs, below analysis is done. Based on the captured Wireshark log, the normal and attack traffic have been compared to get a glimpse of the attack patterns. It is known that the TCP port 445 is used for direct TCP/IP networking access without the need for the NETBIOS layer. As the SMBLoris is a form of DOS attack, it operates based on the number of TCP connections on port 445. As per figure 7, a normal TCP Connection is where we get the Push/Ack where the Push flag means the target network push the data directly to the receiving socket and not wait for any more packets and Fin/Ack where the Fin flag means that the sender finished talking to receiver but it will also listen to anything it has to say until it is done which is waiting for an ACK. This is when the number of concurrent open sockets is low and attack is not initiated. However, after running the exploit, the TCP flow changes to what is shown in figure 8 where there is a packet named as RST where the receiver states that there is no conversation and it is resetting the connection which depends on the number of open sockets and initiated TCP connections. Figure 9 is another capture from the transmitted packets during attack. The high number of retransmissions happens when the SYN packet is not acknowledged by the receiver, and the Kali/sender sends a TCP Retransmission. On the other hand, it confirms the attack scenario that the victim does not have enough memory resources to handle new TCP connections and hence do not respond to the already sent SYN packets. Hence, there will be TCP Retransmission packets sent from the attacker to the victim's machine. According to the general pattern of SMBLoris DOS attack, where there are many, say 200 for instance, SYN/ACK or FIN/ACK packets sent from a computer to a destination in a short period of time, say for instance, 10 seconds, there is a suspicious activity going on.



Fig.7. Wireshark capture of the transmitted packets before attack



Fig.8. Wireshark capture of the transmitted packets during attack

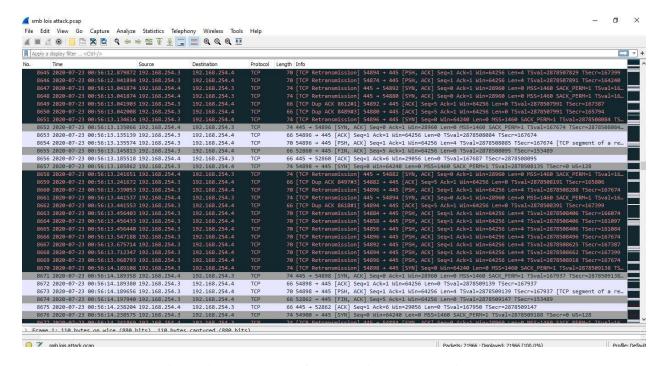


Fig.9. Wireshark capture of the transmitted packets during attack

Hence, so far we have interpreted the patterns of the wireshark log before and after the attack. Next, the outputs of the conducted attack in the Kali linux machine which was captured by the Wireshark and were in the form of .pcap and .csv, were analyzed. As can be observed in figure 10, .csv log, we have detailed information regarding the time(in nanoseconds), source/destination IP address and the transmitted signaling and data per connection.

lo.		Time	Source	Destinatic Protocol	Length	Info																
	1	0	192.168.56	192.168.5€TCP	74	59916	> 445 [S	YN] Se	q=0 Win	=64240 Le	n=0 MS	S=146	0 SAC	_PERN	/I=1 TSv	/al=34	778000	5 TSecr=	0 WS	=128		
	2	0.000424	192.168.56	192.168.5€ TCP	74	445 >	59916 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0005 W	S=128
	3	0.00045	192.168.56	192.168.5€TCP	66	59916	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	6 TSec	r=7175	53					
	4	0.000716	192.168.56	192.168.56 TCP	70	59916	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780006	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	5	0.000776	192.168.56	192.168.5€TCP	74	59918	> 445 [S	YN] Se	q=0 Win	64240 Le	n=0 MS	S=146	0 SAC	_PERN	/=1 TSv	/al=34	778000	6 TSecr=	0 WS	=128		
	6	0.000974	192.168.56	192.168.5€TCP	66	445 >	59916 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	06					
	7	0.000974	192.168.56	192.168.5€TCP	74	445 >	59918 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0006 W	S=128
	8	0.000996	192.168.56	192.168.5€TCP	66	59918	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	6 TSec	r=7175	53					
	9	0.001148	192.168.56	192.168.5€TCP	70	59918	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780006	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	10	0.001228	192.168.56	192.168.5€TCP	74	59920	> 445 [S	YN] Se	q=0 Win	64240 Le	n=0 MS	SS=146	0 SAC	_PERN	/=1 TSv	/al=34	778000	6 TSecr=	0 WS	=128		
	11	0.001485	192.168.56	192.168.5€TCP	66	445 >	59918 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	06					
	12	0.001485	192.168.56	192.168.5€ TCP	74	445 >	59920 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0006 W	S=128
	13	0.001507	192.168.56	192.168.5€TCP	66	59920	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	7 TSec	r=7175	53					
	14	0.001673	192.168.56	192.168.56 TCP	70	59920	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780007	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	15	0.001726	192.168.56	192.168.5€TCP	74	59922	> 445 [S	YN] Se	q=0 Win	64240 Le	n=0 MS	S=146	0 SAC	_PERN	Λ=1 TSv	/al=34	778000	7 TSecr=	0 WS	=128		
	16	0.002011	192.168.56	192.168.5€TCP	66	445 >	59920 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	07					
	17	0.002011	192.168.56	192.168.5€TCP	74	445 >	59922 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0007 W	S=128
	18	0.002035	192.168.56	192.168.5€TCP	66	59922	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	7 TSec	r=7175	53					
	19	0.002227	192.168.56	192.168.5€TCP	70	59922	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780007	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	20	0.00228	192.168.56	192.168.5€ TCP	74	59924	> 445 [S	YN] Se	q=0 Win:	=64240 Le	n=0 MS	SS=146	0 SAC	_PERN	/I=1 TSv	/al=34	778000	7 TSecr=	0 WS	=128		
	21	0.002586	192.168.56	192.168.5€TCP	66	445 >	59922 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	07					
	22	0.002586	192.168.56	192.168.5€ TCP	74	445 >	59924 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0007 W	S=128
	23	0.002612	192.168.56	192.168.5€TCP	66	59924	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	8 TSec	r=7175	53					
	24	0.00278	192.168.56	192.168.56 TCP	70	59924	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780008	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	25	0.002832	192.168.56	192.168.5€TCP	74	59926	> 445 [S	YN] Se	q=0 Win:	=64240 Le	n=0 MS	S=146	0 SAC	_PERN	/I=1 TSv	/al=34	778000	8 TSecr=	0 WS	=128		
	26	0.003085	192.168.56	192.168.5€TCP	66	445 >	59924 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	08					
	27	0.003085	192.168.56	192.168.5€TCP	74	445 >	59926 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0008 W	S=128
	28	0.003108	192.168.56	192.168.5€TCP	66	59926	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	8 TSec	r=7175	53					
	29	0.003247	192.168.56	192.168.5€TCP	70	59926	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780008	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	30	0.003304	192.168.56	192.168.5€ TCP	74	59928	> 445 [S	YN] Se	q=0 Win	-64240 Le	n=0 MS	S=146	0 SAC	_PERM	/I=1 TSv	/al=34	778000	9 TSecr=	0 WS	=128		
	31	0.003513	192.168.56	192.168.5€TCP	66	445 >	59926 [A	CK] Se	q=1 Ack=	5 Win=29	9056 Le	n=0 TS	val=71	753 TS	ecr=347	778000	08					
	32	0.003514	192.168.56	192.168.5€ TCP	74	445 >	59928 [S	YN, AC	K] Seq=0	Ack=1 W	/in=289	60 Len	=0 MS	S=1460	SACK_	PERM	=1 TSva	al=71753	TSec	r=34778	0009 W	S=128
	33	0.003549	192.168.56	192.168.5€TCP	66	59928	> 445 [A	CK] Se	q=1 Ack=	1 Win=64	1256 Le	n=0 TS	val=34	778000	9 TSec	r=7175	53					
	34	0.003759	192.168.56	192.168.5€TCP	70	59928	> 445 [P	SH, AC	K] Seq=1	Ack=1 W	/in=642	56 Len	=4 TSv	al=347	780009	TSecr	=71753	[TCP se	gmen	t of a re	eassem	bled PDU
	35	0.003816	192.168.56	192.168.5€TCP	74	59930	> 445 [S	YN] Se	q=0 Win	64240 Le	n=0 MS	S=146	0 SACH	PERM	A=1 TSV	/al=34	778000	9 TSecr=	0 WS	=128		

Fig.10. Output of wireshark from attack in .csv format

One of the drawbacks of the Wireshark .csv output is that it is not useful in either data interpretation or analysis, since the fields such as timestamp and info are not recognizable for analysis tools and it is rather difficult to separate data in each field. Therefore, as a remedy to this issue, another tool called CICFlowMeter[2] is used which reads a .pcap file as input and outputs a .csv file. In addition, it can also identify the TCP sessions and hence can output data such as the average size of the transmitted packets in each session, standard deviation of the packet size, etc.

In the next step, we try to utilize this tool in order to perform the data interpretation/analysis. As can be observed in figure 11, the CICFlowMeter has two modes, realtime and offline, respectively. In the realtime mode, it will scan the network card for the ongoing connections and in the offline mode, it will need a .pcap file as input. Since, we have already extracted the .pcap file from the Wireshark tool, we will use the offline option.

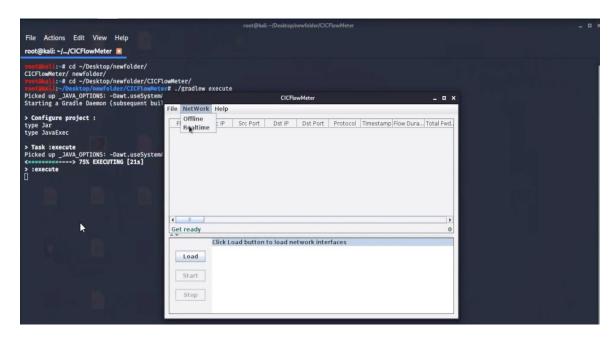


Fig.11. CICFlowMeter Operating Modes

Figure 12 depicts the output we got from the CICFlowMeter. Unlike the .csv output of the Wireshark, there are Src/Dest ports distinctively and the Timestamp is no longer in the form of nanoseconds. Flow Duration specifies the duration of each TCP connection. It is noticeable that the columns Src/Dest IP, Src/Dest port, Timestamp and Flow duration are used in our analysis which will be reviewed in the next section.

Д	A	В	C	D	E	F	G	Н	1	J	K
	Flow ID	Src IP	Src Port I	Dst IP	Dst Port	Protocol	Timestamp	Flow Duration	Total Fwd Packet	Total Bwd packets	Total Length of Fwd Packet
		192.168.254.4	137	192.168.254.255	137	17	22/07/2020 08:40:28 PM	21038032	26	0	1714
	192.168.254.4-192.168.254.255-138-138-17	192.168.254.4	138	192.168.254.255	138	17	22/07/2020 08:40:33 PM	16028427	8	0	1575
	192.168.254.1-192.168.254.255-17500-17500-17	192.168.254.1	17500	192.168.254.255	17500	17	22/07/2020 08:40:36 PM	90161875	4	0	528
	192.168.254.1-239.255.255.250-61370-1900-17	192.168.254.1	61370	239.255.255.250	1900	17	22/07/2020 08:40:39 PM	3004677	4	0	692
	192.168.254.1-239.255.255.250-61375-1900-17	192.168.254.1	61375	239.255.255.250	1900	17	22/07/2020 08:40:48 PM	3002491	4	0	692
	192.168.254.1-192.168.254.255-17500-17500-17	192.168.254.1	17500	192.168.254.255	17500	17	22/07/2020 08:42:37 PM	90170444	4	0	528
	192.168.254.1-239.255.255.250-60654-1900-17	192.168.254.1	60654	239.255.255.250	1900	17	22/07/2020 08:42:39 PM	3002887	4	0	692
	192.168.254.1-239.255.255.250-60659-1900-17	192.168.254.1	60659	239.255.255.250	1900	17	22/07/2020 08:42:48 PM	3003361	4	0	692
0	192.168.254.4-192.168.254.255-138-138-17	192.168.254.4	138	192.168.254.255	138	17	22/07/2020 08:43:08 PM	0	2	0	441
1	192.168.254.1-239.255.255.250-54010-1900-17	192.168.254.1	54010	239.255.255.250	1900	17	22/07/2020 08:43:19 PM	15017262	6	0	822
2	192.168.254.1-224.0.0.251-5353-5353-17	192.168.254.1	5353	224.0.0.251	5353	17	22/07/2020 08:43:19 PM	5304	4	0	232
3	192.168.254.1-224.0.0.22-0-0-0	192.168.254.1	0 2	224.0.0.22	0	0	22/07/2020 08:43:19 PM	302191	5	0	0
1	192.168.254.1-192.168.254.255-17500-17500-17	192.168.254.1	17500	192.168.254.255	17500	17	22/07/2020 08:44:37 PM	90169629	4	0	528
,	192.168.254.1-239.255.255.250-62513-1900-17	192.168.254.1	62513	239.255.255.250	1900	17	22/07/2020 08:44:39 PM	3005721	4	0	692
,	8.6.0.1-8.0.6.4-0-0-0	8.6.0.1	0.8	3.0.6.4	0	0	22/07/2020 08:44:43 PM	77541065	12	0	0
,	192.168.254.1-192.168.254.4-0-0-0	192.168.254.1	0 :	192.168.254.4	0	0	22/07/2020 08:44:43 PM	95624534	92	92	0
3	192.168.254.1-239.255.255.250-57650-1900-17	192.168.254.1	57650	239.255.255.250	1900	17	22/07/2020 08:44:48 PM	3004986	4	0	692
9	192.168.254.1-192.168.254.255-137-137-17	192.168.254.1	137	192.168.254.255	137	17	22/07/2020 08:45:24 PM	48700707	13	0	650
j	192.168.254.1-239.255.255.250-54010-1900-17	192.168.254.1	54010	239.255.255.250	1900	17	22/07/2020 08:45:49 PM	105632226	12	0	1404
1	192.168.254.1-239.255.255.250-57656-3702-17	192.168.254.1	57656	239.255.255.250	3702	17	22/07/2020 08:45:49 PM	7141475	7	0	4368
2	192.168.254.1-192.168.254.255-138-138-17	192.168.254.1	138	192.168.254.255	138	17	22/07/2020 08:46:01 PM	105852897	5	0	870
3	192.168.254.1-192.168.254.4-50665-445-6	192.168.254.1	50665	192.168.254.4	445	6	22/07/2020 08:46:01 PM	336767	8	6	477
4	192.168.254.4-192.168.254.1-138-138-17	192.168.254.4	138	192.168.254.1	138	17	22/07/2020 08:46:01 PM	105852737	5	0	915
5	192.168.254.4-192.168.254.255-138-138-17	192.168.254.4	138	192.168.254.255	138	17	22/07/2020 08:46:02 PM	104	2	0	441
5	192.168.254.1-192.168.254.4-50667-445-6	192.168.254.1	50667	192.168.254.4	445	6	22/07/2020 08:46:02 PM	5640	5	4	404
7	192.168.254.1-192.168.254.4-50666-445-6	192.168.254.1	50666	192.168.254.4	445	6	22/07/2020 08:46:02 PM	9885	5	4	404
3	192.168.254.1-192.168.254.4-50668-445-6	192.168.254.1	50668	192.168.254.4	445	6	22/07/2020 08:46:02 PM	46662	5	5	404
1	192.168.254.1-224.0.0.251-5353-5353-17	192.168.254.1	5353	224.0.0.251	5353	17	22/07/2020 08:46:04 PM	103325720	54	0	1728
)	192.168.254.1-224.0.0.252-55997-5355-17	192.168.254.1	55997	224.0.0.252	5355	17	22/07/2020 08:46:04 PM	410610	2	0	52
1	192.168.254.1-224.0.0.252-58838-5355-17	192.168.254.1	58838	224.0.0.252	5355	17	22/07/2020 08:46:04 PM	411588	2	0	52
2	192.168.254.1-192.168.254.4-50671-139-6	192.168.254.1	50671	192.168.254.4	139	6	22/07/2020 08:46:06 PM	25657	5	5	373
3	192.168.254.1-224.0.0.252-60142-5355-17	192.168.254.1	60142	224.0.0.252	5355	17	22/07/2020 08:46:06 PM	411242	2	0	52

Fig.12.Output of CICFlowMeter from attack in .csv format

In summary, we have come to know that the SMB loris DOS attack can be detected based on the number of Syn/Ack, Fin/Ack or RST packets sent to a specific destination. We had difficulty in order to detect that data from the Wireshark .csv output and hence decided to move forward by using a tool called CICFlowMeter to render data to generate refined output in a useful format to our analysis.

#### C. Security/Privacy Data Analytics

the output data.

The objective of this section is to demonstrate the capability of conducted data analysis methods in order to detect future DOS attacks (i.e,SMB LORIS) in the network environment. Initially, we begin the analysis by loading data and parsing it, but before that, we have performed the data cleaning by omitting the fields with destination port 0 and data values of infinity. Lastly, as depicted in figure 13, the data.shape is printed in order to identify the number of rows and columns and there are 235032 rows and 84 columns to the output .csv file

```
In [245]: import pandas as pd
          import numpy as np
          from sklearn import preprocessing
          import seaborn as sns
          import matplotlib.pyplot as plt
          import warnings
          warnings.filterwarnings('ignore')
          path_to_dataset="smb lois attack.pcap_Flow.csv"
          #We are going to play with timestamp, so parse it
          data = pd.read_csv(path_to_dataset,header=0, low_memory=False, parse_dates=['Timestamp'])
          data = data[data['Dst Port'] != 0]
          data = data[data.values != 'Infinity']
          #Set data index equal to timestamp so we can groupby records based on time
          data.index=data.Timestamp
          #Rows and columns count
          print("Dataframe shape: ", data.shape)
          Dataframe shape: (235032, 84)
```

Fig.13. Reading and cleaning data in JupyterNotebook

As observed in figure 14, Data.head() function represents a sneak peak of the few first columns of

```
[2]: #Lets have a look on first few rows
     data.head()
[2]:
                                                               Flow ID \
    Timestamp
    2020-07-22 20:40:36 192.168.254.1-192.168.254.255-17500-17500-17
    2020-07-22 20:40:36 192.168.254.1-192.168.254.255-17500-17500-17
    2020-07-22 20:40:36 192.168.254.1-192.168.254.255-17500-17500-17
    2020-07-22 20:40:36 192.168.254.1-192.168.254.255-17500-17500-17
    2020-07-22 20:40:36 192.168.254.1-192.168.254.255-17500-17500-17
                                 Src IP Src Port
                                                            Dst IP Dst Port \
    Timestamp
    2020-07-22 20:40:36 192.168.254.1
                                            17500 192.168.254.255
                                                                       17500
    2020-07-22 20:40:36 192.168.254.1
                                           17500
                                                   192.168.254.255
                                                                       17500
    2020-07-22 20:40:36 192.168.254.1
                                            17500
                                                   192.168.254.255
                                                                       17500
    2020-07-22 20:40:36 192.168.254.1
                                            17500
                                                   192.168.254.255
                                                                       17500
    2020-07-22 20:40:36 192.168.254.1
                                            17500 192.168.254.255
                                                                       17500
                         Protocol
                                            Timestamp Flow Duration \
     Timestamp
     2020-07-22 20:40:36
                               17 2020-07-22 20:40:36
                                                            90161875
     2020-07-22 20:40:36
                               17 2020-07-22 20:40:36
                                                            90161875
     2020-07-22 20:40:36
                               17 2020-07-22 20:40:36
                                                            90161875
     2020-07-22 20:40:36
                               17 2020-07-22 20:40:36
                                                            90161875
     2020-07-22 20:40:36
                               17 2020-07-22 20:40:36
                                                            90161875
                         Total Fwd Packet Total Bwd packets ... \
     Timestamp
     2020-07-22 20:40:36
                                                           0
                                        4
                                                           0
     2020-07-22 20:40:36
                                        4
                                        4
                                                           0
     2020-07-22 20:40:36
     2020-07-22 20:40:36
                                         4
                                                           0
     2020-07-22 20:40:36
                         Fwd Seg Size Min Active Mean Active Std Active Max \
     Timestamp
     2020-07-22 20:40:36
                                        8
                                                   0.0
                                                               0.0
                                                                           0.0
     2020-07-22 20:40:36
                                        8
                                                   0.0
                                                               0.0
                                                                           0.0
     2020-07-22 20:40:36
                                        8
                                                   0.0
                                                               0.0
                                                                           0.0
     2020-07-22 20:40:36
                                        8
                                                   0.0
                                                               0.0
                                                                           0.0
     2020-07-22 20:40:36
                                        8
                                                   0.0
                                                               0.0
                                                                           0.0
                         Active Min
                                        Idle Mean
                                                       Idle Std
                                                                     Idle Max \
     Timestamp
     2020-07-22 20:40:36
                                0.0 3.988662e+14 7.977324e+14 1.595465e+15
     2020-07-22 20:40:36
                                0.0 3.988662e+14 7.977324e+14 1.595465e+15
```

Fig.14. Output data generated by the JupyterNotebook

In our analysis, we have focused on utilizing SRC/Dest IP, SRC/Dest port, timestamp and flow duration columns as well as SYN/ACK, FIN/ACK and RST from the 84 output columns as depicted in figure 15.

```
In [247]: #Column names
          list(data.columns)
Out[247]: ['Flow ID',
            'Src IP',
            'Src Port'
            'Dst IP'.
            'Dst Port'
            'Protocol',
            'Timestamp'
            'Flow Duration'
            'Total Fwd Packet'
            'Total Bwd packets'
            'Total Length of Fwd Packet',
            'Total Length of Bwd Packet',
            'Fwd Packet Length Max',
            'Fwd Packet Length Min'
            'Fwd Packet Length Mean',
            'Fwd Packet Length Std',
            'Bwd Packet Length Max',
            'Bwd Packet Length Min',
            'Bwd Packet Length Mean',
            'Bwd Packet Length Std',
            'Flow Bytes/s',
            'Flow Packets/s',
            'Flow IAT Mean',
            'Flow IAT Std',
            'Flow IAT Max',
            'Flow IAT Min'.
            'Fwd IAT Total'
            'Fwd IAT Mean',
            'Fwd IAT Std',
            'Fwd IAT Max',
            'Fwd IAT Min',
            'Bwd IAT Total',
            'Bwd IAT Mean',
```

Fig.15. Dataset Columns List in JupyterNotebook

Figure 16 depicts the density of the number of TCP session connections grouped by the destination IP in each 10 seconds interval time. Based on the result, there are two spikes in an interval of 15 minutes, 20:55 and 21:05 respectively, which is far from normal behavior and matches the attack scenario. However, generally we cannot correlate the high number of TCP session connections to any attack as the IP may belong to a website which is hosting a special event, for instance. In addition, it is noticeable that unlike the number of TCP connections that we have earlier set in Kali to 65535, the number of TCP session connections in below snapshot is 40000 and 45000 which can be viewed as the number of TCP session connections possible on the victim's system before it runs out of memory and hangs.

```
[4]: #For each IP in Dst IP column, how many tcp connections in 10 sec intervals
data.resample('10s')['Dst IP'].count().plot(figsize=(20,7))
plt.xlabel('Time')
plt.ylabel('Density of TCP connections')

In [248]: #For each IP in Dst IP column, how many tcp connections in 10 sec intervals
data.resample('10s')['Dst IP'].count().plot(figsize=(20,7))
plt.xlabel('Time')
plt.ylabel('Density of TCP connections')

Out[248]: Text(0, 0.5, 'Density of TCP connections')
```

Fig.16. Density of the number of TCP session connections grouped by the destination IP

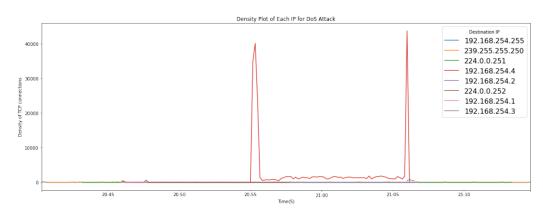
In figure 17, the density of the IP addresses TCP session connections involved in the attack scenario is analyzed in order to confirm if they match with what was configured earlier. As depicted below, two main IP addresses involved in the scenario are 192.168.254.4 and 192.168.254.3 which are the same as victim and attacker machine IPs, respectively.

```
[5]: # Density Plot for each IP
IPs=data['Dst IP'].unique()
plt.figure(figsize=(20,7))

for IP in IPs:
    # Subset to the destination port
    subset = data[data['Dst IP'] == IP]
    subset.resample('10s')['Dst IP'].count().plot(figsize=(20,7),label = IP)

# Plot formatting
plt.legend(prop={'size': 16}, title = 'Destination IP')
plt.title('Density Plot of Each IP for DoS Attack')
plt.xlabel('Time(S)')
plt.ylabel('Density of TCP connections')
```

#### [5]: Text(0, 0.5, 'Density of TCP connections')



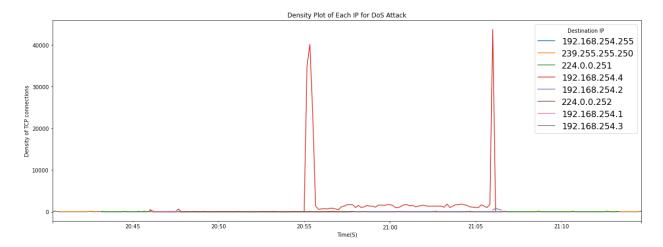


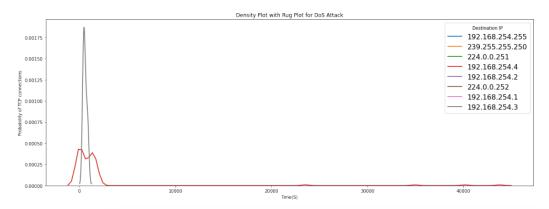
Fig.17 Density of IP addresses TCP session connection involved in attack scenario

Due to the scaling issue of the last plot, we have also attempted to generate a Rug Plot based on the KDE method which operates based on the probability density function and depicts the probability of having TCP connections in a period of time. As observed in figure 18, the attacker has the maximum probability of having TCP connections at time 0. Next highest probability

belongs to the Victim's IP. As it is mentioned before, the SMB loris attack targets the victim with a high number of TCP connections to which the victim needs to respond and since the memory resources of the victim is limited, after a certain number of TCP SYN requests, it has used up all its resources and there is no more resources available to be allocated to new TCP connections and hence there is no response to the attacker's request. So it is rational to see that not only the number of packets but also the probability of generated TCP connections originating from the attacker's side outweigh that of the victim's side. That is the reason the attacker's IP spike is almost 0.00175 and that of the victim is almost 0.0005. In addition, we can conclude that compared to other network entities, most of the communication is between the attacker and the victim.

```
[6]: # Density Plot with Rug Plot
     IPs=data['Dst IP'].unique()
     plt.figure(figsize=(20,7))
     for IP in IPs:
         # Subset to the destination port
         subset = data[data['Dst IP'] == IP]
         # Draw the density plot
         sns.distplot(subset.resample('10s')['Dst IP'].count(), hist = False, kde = [1]
      →True,
                      kde_kws = {'linewidth': 2},
                      label = IP)
     # Plot formatting
     plt.legend(prop={'size': 16}, title = 'Destination IP')
     plt.title('Density Plot with Rug Plot for DoS Attack')
     plt.xlabel('Time(S)')
     plt.ylabel('Probability of TCP connections')
```

[6]: Text(0, 0.5, 'Probability of TCP connections')



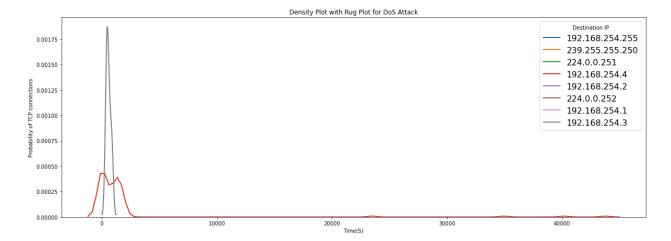


Fig.18 Density plot with Rug plot for DOS attack

As the result of the above discussions, we have reached the conclusion that the communication is between the attacker's IP(192.168.254.3) and the victim's IP(192.168.254.4). Based on a filtered subset of data from the original dataset, which encompasses the communication between the attacker and the victim, we attempted to generate the density of the number of TCP connections again in order to confirm that the plots timing, numbers, etc follow the attack procedure. As observed in figure 19, based on the density of TCP session connections, there exist two spikes at 20:55 and 21:05 which match the time of both attacks and hence confirm the first conclusion driven before.

Conclusion: Most of communications are between gray and red IPs (192.168.254.4) and (192.168.254.3)

```
[7]: #Plot our suspicious subset of dataset

df_suspicious=data[(data['Dst IP'] =='192.168.254.4') & (data['Src IP'] =='192.

→168.254.3')]

df_suspicious.resample('5s')['Src IP'].count().plot(figsize=(20,7))

plt.xlabel('Time')

plt.ylabel('Density of TCP connections')
```

[7]: Text(0, 0.5, 'Density of TCP connections')

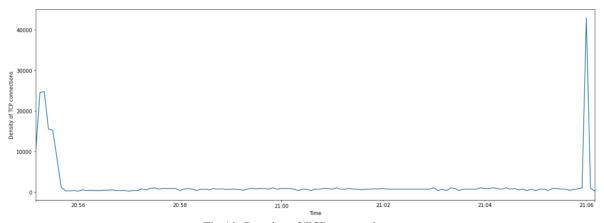


Fig.19. Density of TCP connections

From another point of view, we count the unique used destination ports for each involved IP in figure 20. As depicted below, the victim has used two ports as SMB loris operated on port 445 and the ping operation is performed on port 21. The attacker, on the other hand, utilized 14 ports at a time which is suspicious. That is why we have conducted the same study based on the source port as well based on which the attacker IP has had 1701 ports involved in initiation of TCP connections during this period which explains why 14 distinct destination ports have been involved. It is noticeable that since the attacker has opened 1701 TCP connections and the memory space of the victim is limited, it only had enough resources to reply to 14 of those ports. It is hence concluded that the IP 192.168.254.3 is the attacker in this scenario since it has initiated TCP connections on 1701 of its ports in a period of 15 minutes. Since we have earlier seen that the density of TCP connections numbers is about 40,000 and above at the time of attack, we have further analyzed the logs and come to know that some of the 1700 ports are utilized to initiate multiple TCP connections.

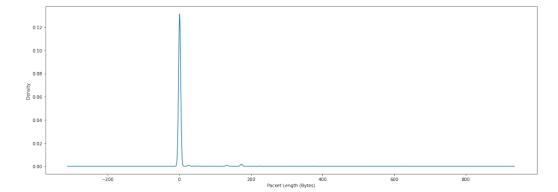
```
[8]: #Validating our conclusioins from other points of view
     df2 = data.groupby("Dst IP")
     print('IP','\t\t','Port')
     df2['Dst Port'].nunique()
    ΙP
                      Port
[8]: Dst IP
                          3
     192.168.254.1
     192.168.254.2
                          1
     192.168.254.255
     192.168.254.3
                         14
                         2
     192.168.254.4
                          1
     224.0.0.251
     224.0.0.252
                          1
     239.255.255.250
     Name: Dst Port, dtype: int64
    Our victim is 192.168.254.4 with 2 of its ports as destination port Also suspicious attacker is
    communicated on 14 different ports
[9]: df2 = data.groupby("Src IP")
     print('IP','\t\t','Port')
     print(df2['Src Port'].nunique())
    ΙP
                      Port
    Src IP
    192.168.254.1
                        67
    192.168.254.3
                      1701
    192.168.254.4
    Name: Src Port, dtype: int64
```

Fig.20. The unique used destination ports for each involved

The length of the packets has also been taken into consideration and were plotted in figure 21. It is observed that most of the packets are of a very small size and that some of the packets are of negative size which is related to the lack of data cleaning. The small size of the packets explains that most of the packets are related to the SMBLoris attack and are of the type TCP connection. In order to confirm that the pattern matches that of the suspicious subset of data related to the IPs 192.168.254.3 and 192.168.254.4, we run the same experiment only on that specific subset of data to check the length of packets which further confirms that the attack data packets are of a very small size.

```
[10]: #Plotting packets length density
   plt.figure()
   data['Packet Length Mean'].plot(kind = 'density',figsize=(20,7))
   plt.xlabel('Packet Length (Bytes)')
   plt.ylabel('Density')
```

# [10]: Text(0, 0.5, 'Density')



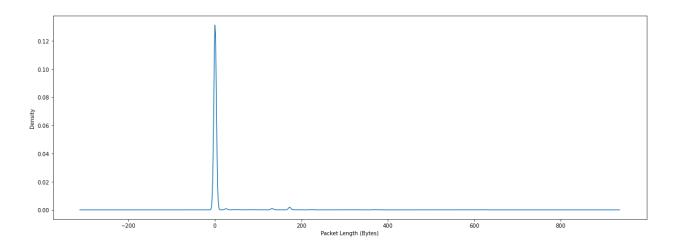


Fig.21. Packet length of whole data set

```
[11]: df_suspicious['Packet Length Mean'].plot(kind = 'density',figsize=(20,7))
       plt.xlabel('Packet Length (Bytes)')
       plt.ylabel('Density')
[11]: Text(0, 0.5, 'Density')
            0.5
 2.0
 1.0
 0.5
                                             1
Packet Length (Bytes)
```

Fig.22. Packet length in bytes of suspicious subset of data

Also, the source and destination ports related to the suspicious data set were plotted in figure 23 and it is observed that the destination port is 445 which is used for the SMBLoris attack.

Source port count: 1700 Destination port count: 1

[12]: <matplotlib.axes.\_subplots.AxesSubplot at 0x223d0d55948>

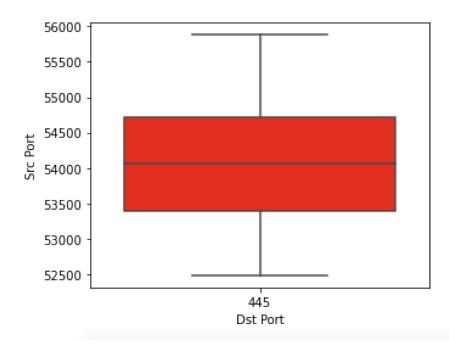


Fig.23. Source/Destination ports of the suspicious dataset

As mentioned earlier, the SMBLoris attack traffic is different from that of the normal traffic in terms of the number of SYN packets generated from the attacker's machine towards the victim in a short period of time. Figure 24 depicts the ratio of the number of SYN packets to the total number of packets in each TCP connection of the attacker and the windows machine. As can be observed, the windows machine has very few spikes which are related to the ping and samba file browsing whereas the attacker traffic shows that a high percentage of the packets are having SYN flags from 20:55 to 21:05 which is the attack period.

[13]: Text(0, 0.5, 'Syn Flag Ratio')

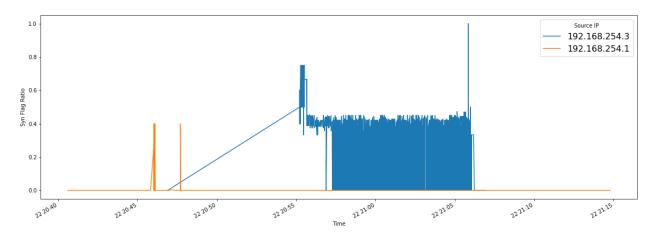


Fig.24. Attacker's ratio of the number of SYN packets to the total number of packets in each TCP connection

As another measure of the SMBLoris attack, the number of RST packets has also been analyzed and as can be seen below, short after the attack started (20:56), the number of RST packets originated from the attacker towards the victim, due to no response from the victim, is increased and continued till the time (21:07) that manual reboot has been conducted.

```
[34]: # Density Plot for each IP
           IPs=data['Src IP'].unique()
           plt.figure(figsize=(20,7))
           syn_flag_ratio=[]
           for IP in IPs:
                # Subset to the destination port
               subset = data[data['Src IP'] == IP]
               syn_count=subset['RST Flag Count'].astype(int)
               total_fw=subset['Total Fwd Packet'].astype(int)
               syn_flag_ratio.append(syn_count/total_fw)
           plt.legend(prop={'size': 16}, title = 'Source IP')
           plt.xlabel('Time')
           plt.ylabel('RST Flag Ratio')
    [34]: Text(0, 0.5, 'RST Flag Ratio')
                                                                                          192.168.254.3
                                                                                          192.168.254.1
                                                                       2221.05
                                                                                  2221.10
 1.0
                                                                                                  192.168.254.3
                                                                                                  192.168.254.1
 0.8
Flag Ratio
9.0
LS 0.4
 0.2
                2220.45
                                            2220.55
                                                          2221:00
                                                                         2222:05
                              22 20:50
                                                                                       2221:10
                                                                                                     2221:35
  2220:40
```

Fig.25. Attacker's RST flag ratio

As mentioned before, another measure of SMBLoris attack is the number of FIN packets generated from the attacker to the victim's machine. As observed in figure 26, there is a meaningful discrepancy between the FIN flag ratio initiated from the attacker's side and that of the victim during a short period of time which confirms the attack's pattern.

```
[38]: # Density Plot for each IP
    IPs=data['Src IP'].unique()
    plt.figure(figsize=(20,7))
    syn_flag_ratio=[]
    for IP in IPs:
        # Subset to the destination port
        subset = data[data['Src IP'] == IP]
        syn_count=subset['FIN Flag Count'].astype(int)
        total_fw=subset['Total Fwd Packet'].astype(int)
        syn_flag_ratio.append(syn_count/total_fw)

    syn_flag_ratio[0].plot(label='192.168.254.3')
    syn_flag_ratio[0].plot(label='192.168.254.1')
    plt.legend(prop={'size': 16}, title = 'Source IP')
    plt.xlabel('Time')
    plt.ylabel('FIN Flag Ratio')
```

[38]: Text(0, 0.5, 'FIN Flag Ratio')

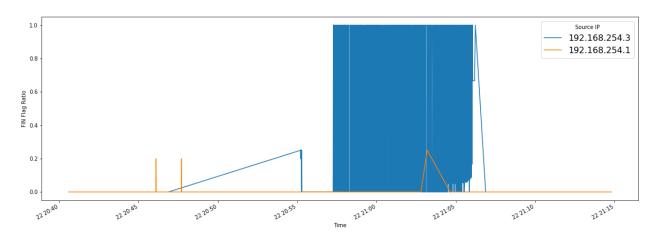


Fig.26. Attacker's FIN flag ratio

#### **III. Conclusions**

SMBLoris attack is a type of denial of service attack which initiates several TCP connections in order to consume the victim's resources and is different from the normal traffic in the number of transmitted SYN, FIN/ACK and RST between involved parties. As a result of this report's analysis, SMBLoris attack pattern matches the transmission of a high number of previouslymentioned packets in a short duration of time.

#### **Abbreviations**

SMBLoris	Samba Loris
DoS	-attack Denial-of-Service (DoS) attack
TCP	Transmission Control Protocol
SYN	
Synchronize	
SYN/ ACK	Synchronize/Acknowledgment
ACK	Acknowledgment
FIN/ACK	Finish/ Acknowledgment
PSH/ACK	Push/ Acknowledgment

# References

- [1] Information Security Analytics: Finding Security Insights, Patterns, and Anomalies in Big Data, Talabis, McPherson, Miyamoto, Martin
- [2] https://github.com/ahlashkari/CICFlowMeter
- [3] https://www.secpod.com/smbloris
- [4]https://www.kali.org
- [5]https://www.wireshark.org
- [6]https://jupyter.org