



SharkFest '18 US



sFlow: Theory and Practice of a Sampling Technology

and Its Analysis with Wireshark

Simone Mainardi, PhD

ntop

mainardi@ntop.org

@simonemainardi



Outline



- What is sFlow? When is it useful and when it is not
- How does sFlow work? Agents, collectors, packets and sampling techniques
- Using Wireshark to master sFlow



What is sFlow? [1/2]



- sFlow is a sampling technology designed to export
 - Network devices information (à la SNMP)
 - Packets traversing network devices (à la ERSPAN)



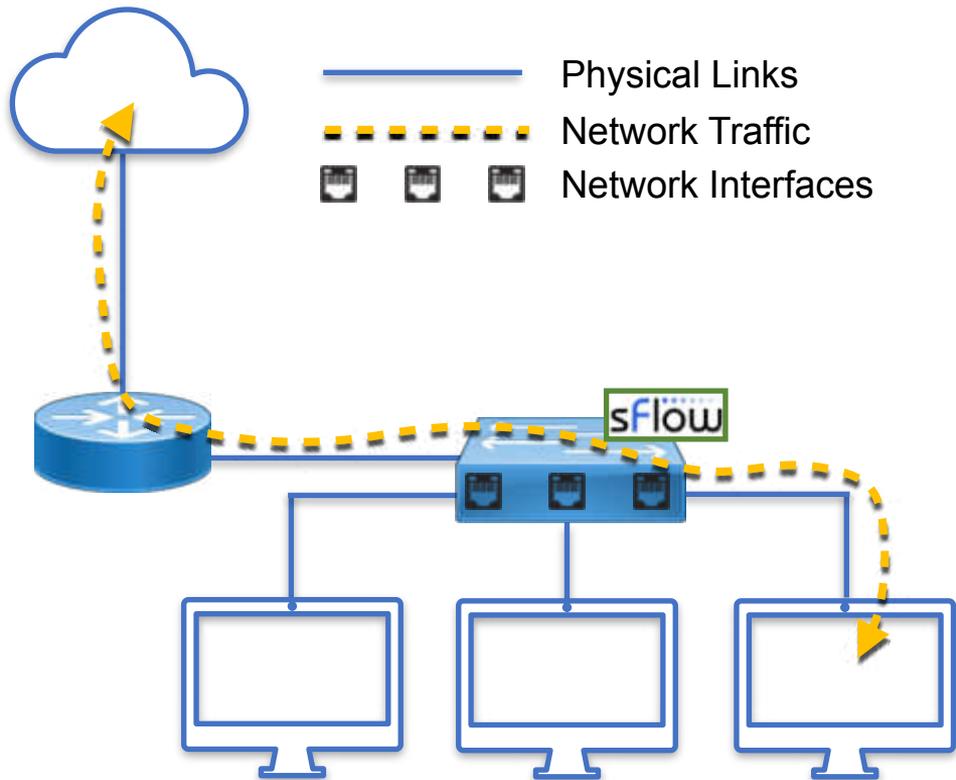
What is sFlow? [2/2]



- Network-wide visibility is obtained by means of configurable sampling
 - Counters samples
 - Flow samples
- Samples are periodically put in sFlow UDP datagrams and pushed over the network



sFlow Visibility



- Device visibility 
 - Counter Samples

- Traffic visibility 
 - Flow Samples



sFlow Counter Samples



- Interfaces status, speed, type
- Cumulative input and output bytes/packets, errors, ...



Network Traffic

Network Interfaces

No.	Time	Source	Destination	Protocol	Length	NumSamples
1	0.000000	72.0.112.100	10.0.3.250	sFlow	570	4
2	2.024941	72.0.112.100	10.0.3.250	sFlow	570	4
3	3.204524	72.0.112.100	10.0.3.250	sFlow	530	2

```
▼ Counters sample, seq 480927
0000 0000 0000 0000 0000 ..... = Enterprise: standard sFlow (0)
..... 0000 0000 0010 = sFlow sample type: Counters sample (2)
Sample length (byte): 160
Sequence number: 480927
0000 0000 ..... = Source ID type: 0
.... 0000 0000 0000 0000 1000 0001 = Source ID index: 129
Counters records: 2
├ Ethernet interface counters
├ Generic interface counters
  0000 0000 0000 0000 0000 ..... = Enterprise: standard sFlow (0)
..... 0000 0000 0001 = Format: Generic interface counters (1)
Flow data length (byte): 88
Interface index: 129
Interface Type: 6
Interface Speed: 1000000000
Interface Direction: Full-Duplex (1)
.....1 = IfAdminStatus: Up
.....1 = IfOperStatus: Up
Input Octets: 2748679350265805
Input Packets: 821400103
Input Multicast Packets: 2931491300
Input Broadcast Packets: 347804767
Input Discarded Packets: 0
Input Errors: 0
Input Unknown Protocol Packets: 0
Output Octets: 13117755552772
Output Packets: 1177201173
Output Multicast Packets: 2077420003
Output Broadcast Packets: 70506004
Output Discarded Packets: 0
Output Errors: 0
Promiscuous Mode: 1
▼ Counters sample, seq 480928
```





When is sFlow Useful? [1/2]



- Network-wide estimations of top:
 - Layer-7 application protocols usage (e.g., HTTP, YouTube, Skype)
 - Sources
 - Destinations
 - Conversations
 - Ports
- Detect volumetric attacks





When is sFlow Useful? [2/2]



- Capacity planning
- Traffic engineering (eg., decide to establish a new peering, buy more bandwidth)
- Network topology adjustments (e.g., bring guys communicating the most onto the same link)
- Detect network issues (e.g, switches port status changes)
- Link congestion





When is sFlow NOT Useful? [1/2]



- Detect bottom-sources, -destinations, -ports, -Layer-7 application protocols, ...
- Feed signature-based
Intrusion Prevention/Intrusion Detection Systems
(IDS/IPS)





When is sFlow NOT Useful? [2/2]



- Stateful protocols analyses
 - No SEQ number analysis
- Sessions reconstruction
 - No TCP reassembly
- Detect Low-and-Slow network attacks
- Content-based network forensics
 - No extraction of files, images, documents





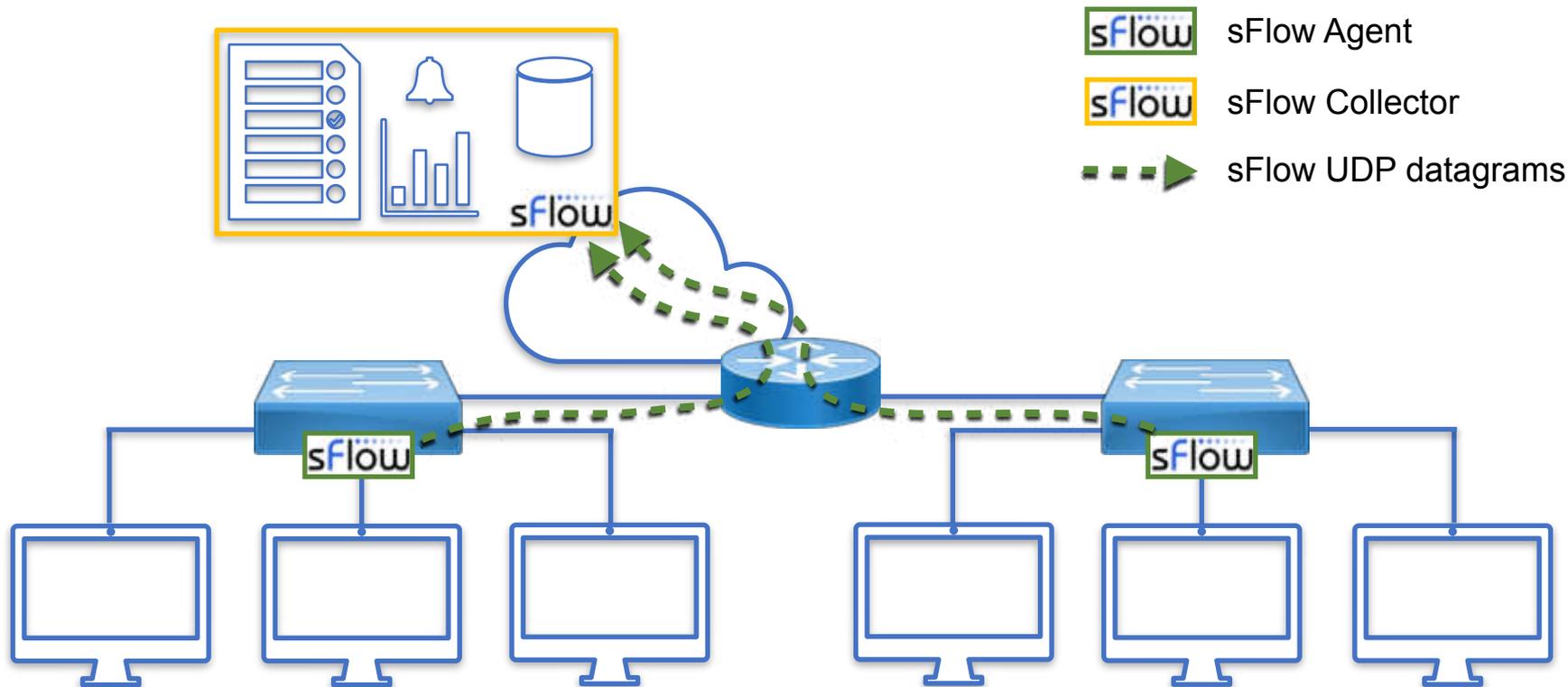
sFlow Monitoring Systems



- sFlow Agents
 - Embedded in switches
 - Marshal samples into UDP Datagrams to send them to one or more sFlow collectors
- sFlow Collectors
 - Receive UDP Datagrams from sFlow Agents
 - Process received data (e.g., to troubleshoot, create and store traffic time series, alert on unexpected traffic patterns)

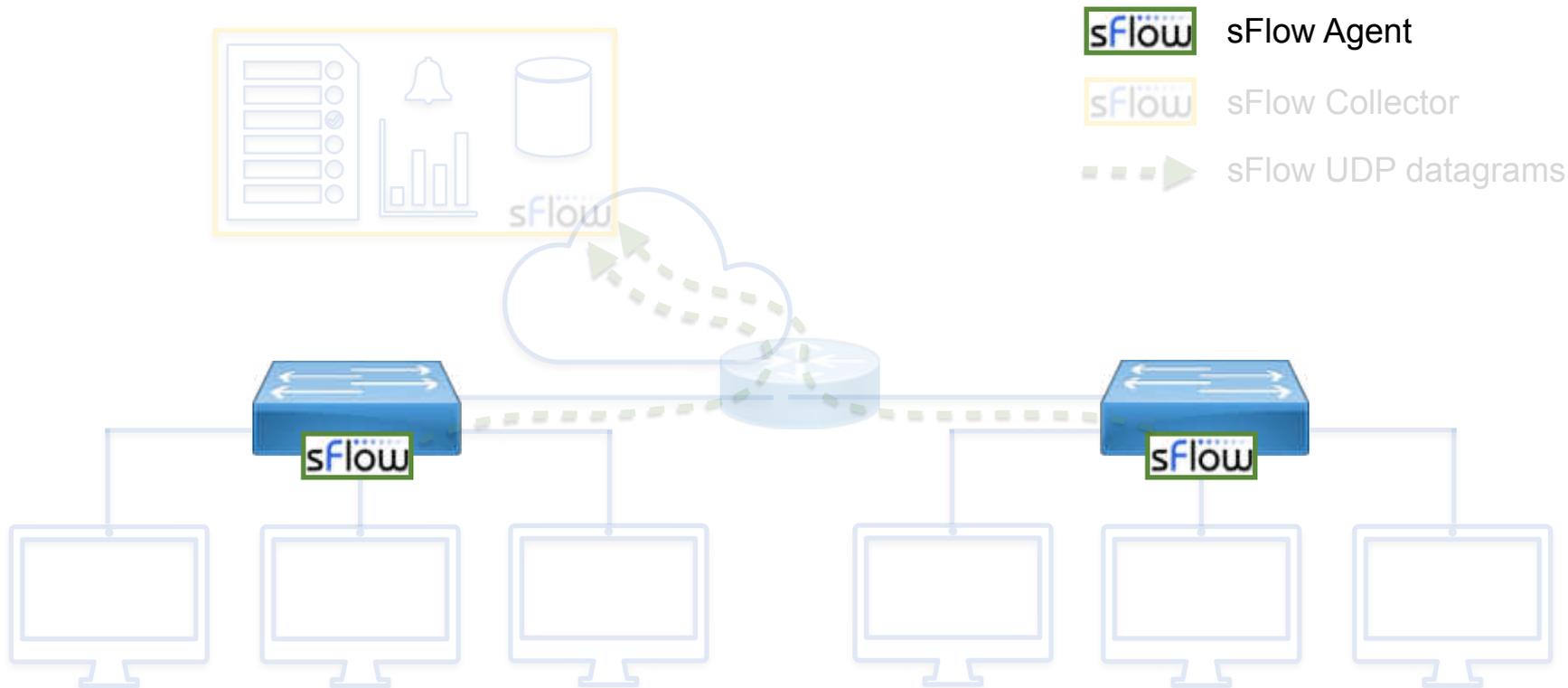


sFlow Monitoring Systems





sFlow Monitoring Systems: Agents





sFlow Embedded Agents



- Tens of manufacturers
 - A10, Aerohive, AlexaIA, ALUe, Allied Telesis, Arista, Aruba, Big Switch, Brocade, Cisco, Cumulus, DCN, Dell, D-Link, Edge-Core, Enterasys, Extreme, F5, Fortinet, HPE, Hitachi, Huawei, IBM, IP Infusion, Juniper, NEC, Netgear, OpenSwitch, Open vSwitch, Oracle, Pica8, Plexxi, Pluribus, Proxim, Quanta, Silicom, SMC, ZTE, and ZyXEL, etc.
- (Non-exhaustive) list maintained at <https://sflow.org/products/network.php>



sFlow Software Agents



- Host sFlow agent (<https://github.com/sflow/host-sflow>)
- Oses: AIX, FreeBSD, Linux, Solaris, and Windows
- Docker containers
- Hypervisors: Hyper-V, KVM/libvirt, Nutanix AHV and Xen hypervisors
- Supported switches, Arista EOS, Cumulus Linux, Dell OS10, OpenSwitch





sFlow Monitoring Systems: Collectors



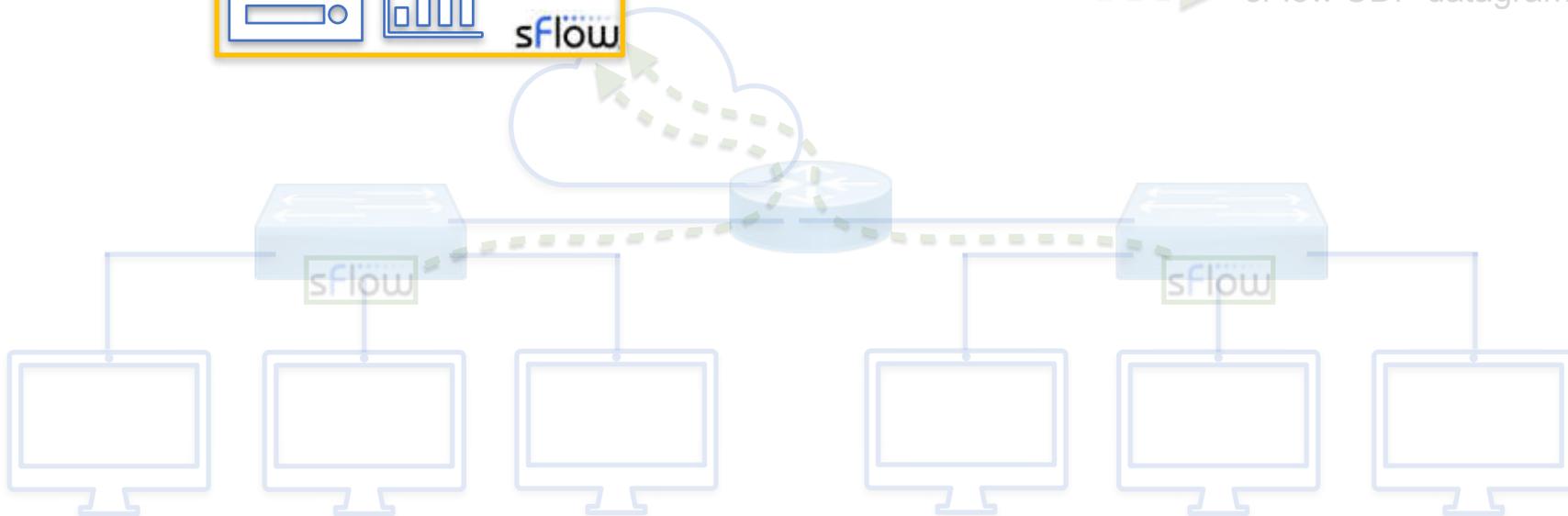
sFlow Agent



sFlow Collector



sFlow UDP datagrams





sFlow Collectors [1/4]



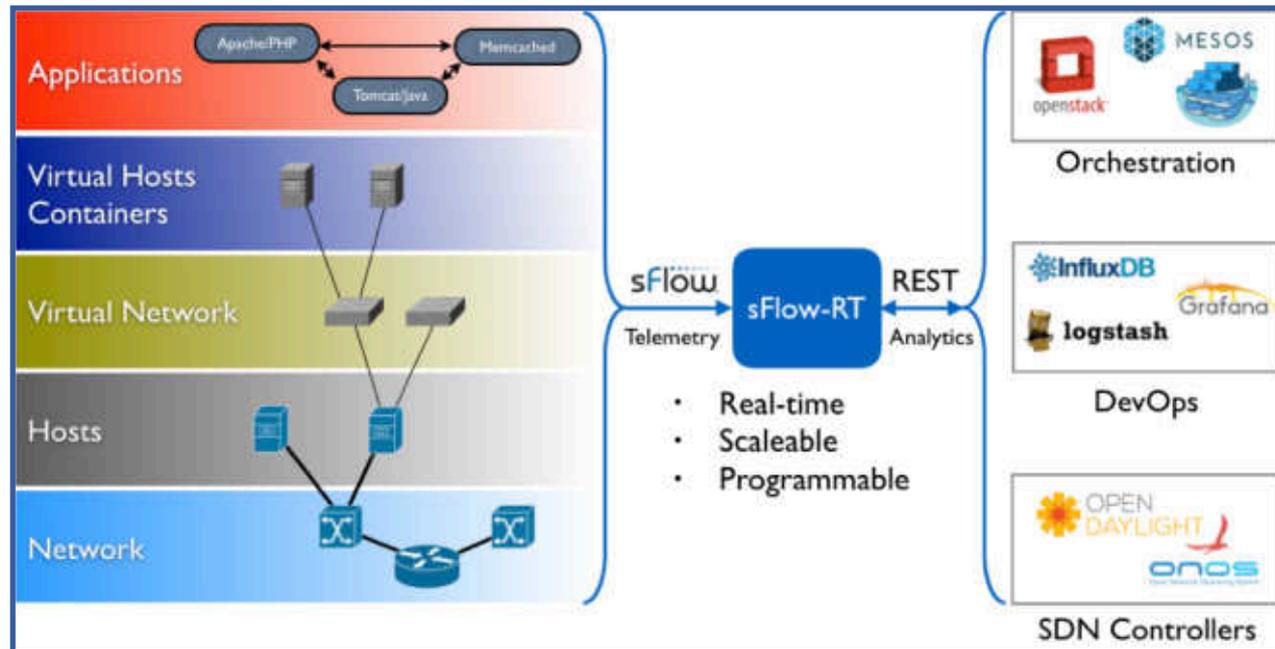
- sFlow Toolkit
 - Basic command line utilities (output to pcap, sFlow to NetFlow, txt)
- sFlowTrend/sFlowTrend-Pro
 - Graphical tool to generate live statistics network interfaces, top sources/destinations, top applications, ...



sFlow Collectors [2/4]



- sFlow-RT
 - Scriptable collector via REST/JavaScript
 - Retrieve metrics, set thresholds, receive notifications, ...





sFlow Collectors [3/4]



- ntopng
 - Graphical tool to generate live and historical statistics on sources and destinations, network conversations (who talks to whom), and network interfaces
 - Facilitates the correlation of sources and destinations with the physical ports they are using

	Application	L4 Proto	Client	Server	Duration	Flow Exporter	Bytes	Info
Info	SSL	TCP	79.136.102.9 :https	noptr.inleed.net :53722	0 sec	All Flow Exporters	99 MB	
Info	Unknown	UDP	noptr.inleed.net :6881	121.211.80.113 :44474	0 sec	Flow Exporter 10.0.2.154		
Info	HTTP	TCP	46.59.102.200 :http	165.231.120.232 :44411	0 sec	Flow Exporter 10.0.2.253		
						Flow Exporter 185.189.48.162[server.vali.se]	17 MB	
						Client	5.97 Mbit/s ↑	23.92 MB



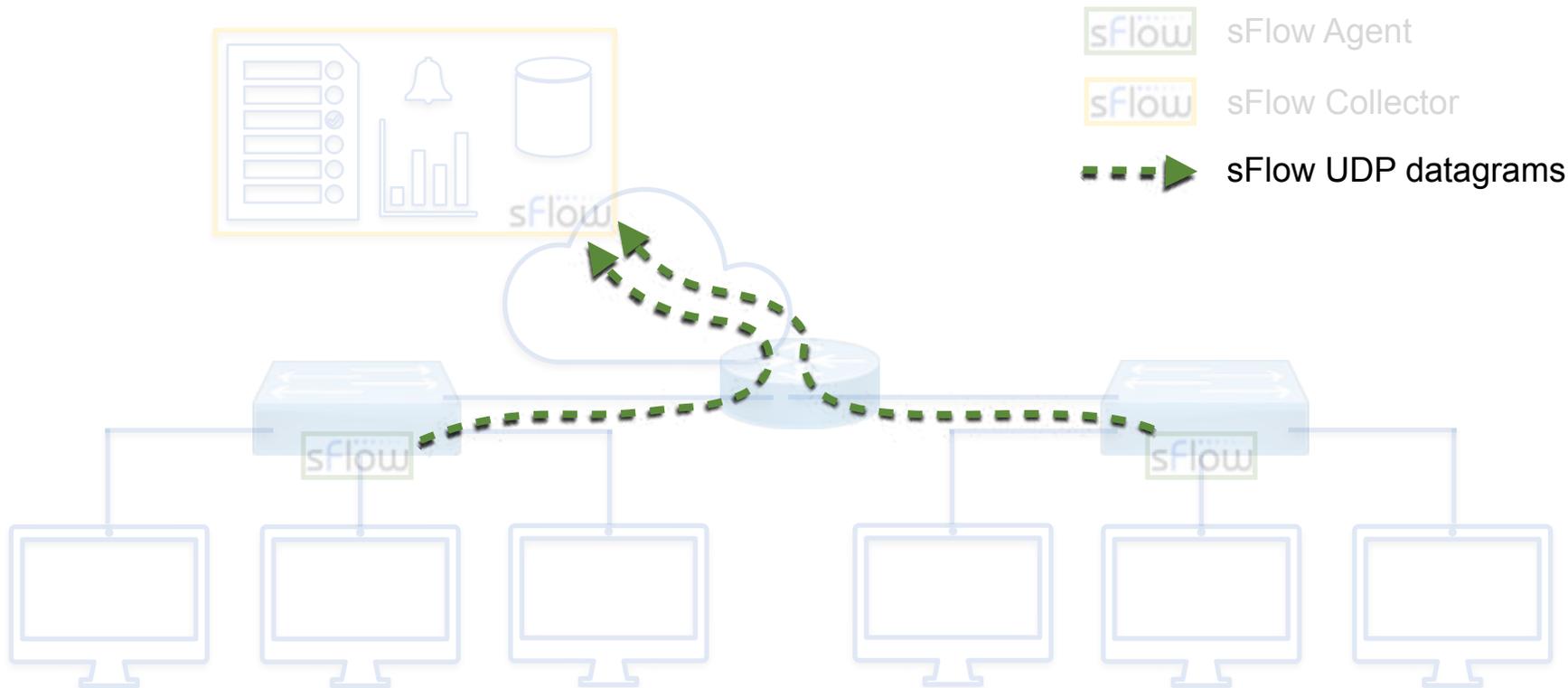
sFlow Collectors [4/4]



- Wireshark
 - Dissect sFlow traffic
 - Dissect packets in flow samples as if they were regular packets
 - Lua plugin to see aggregated information
- (Non-exhaustive) list available at <https://sflow.org/products/collectors.php>



sFlow Monitoring Systems: Transport





sFlow Transport



- sFlow works over UDP
 - Reduced memory and CPU wrt TCP
 - Robust in congested networks
 - Higher delays and lost packets increase but there is no need to buffer any data nor to wait for retransmissions
- sFlow packets are sequenced so the application can detect losses



sFlow ↑ Push Architecture [1/2]



- sFlow UDP datagrams are periodically and unsolicitedly sent by each agent to one or more collectors
- Collectors don't need to discover new agents
- Reduced workload
 - Collectors don't have to generate reqs and match reqs/resps
 - Agents don't have to parse and process reqs



sFlow ↑ Push Architecture [2/2]



- Increased security
 - Agents don't have to listen on open ports
 - Firewalls only have to allow mono-directional agent-to-collector communications
- Reduced latency
 - No need to establish connections



sFlow Sampling Processes



- Two different sampling processes in sFlow
- Counters Sampling
 - Produce Counter Samples
- Statistical Packets Sampling
 - Produce Flow Samples





sFlow Counters Sampling [1/3]



- Produce counter values for the Counter Samples
- Periodic sampling of network interfaces counters (e.g, input and output bytes and packets)
- sFlow agents are configured with a Sampling Interval
 - One sample every Sampling Interval

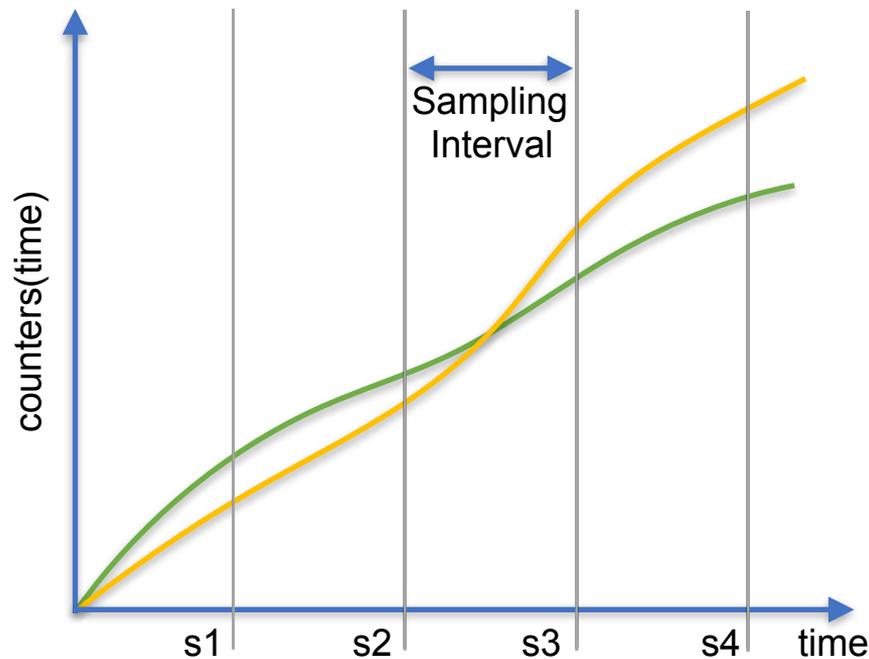




sFlow Counters Sampling [2/3]



— Input Bytes — Output Bytes



- $\Delta = \text{Sampling Interval}$
- $sX = X\text{th counter sample}$
- $s1 = \text{counters}(\Delta)$
- $s2 = \text{counters}(2\Delta)$
- ...
- $sN = \text{counters}(N\Delta)$



sFlow Counters Sampling [3/3]



- Sampling Interval is intended to be the maximum time between two consecutive counter samples
- Counter samples may be taken opportunistically to "pad" other sFlow datagrams



sFlow Packets Sampling



- Produce packets for the Flow Samples
- Must ensure that any packet observed has an equal chance of being sampled
- Sampling rate is configurable





Sampling Accuracy



- Sampling, although unable to offer 100% exact results, are able to provide results with a statistically-quantifiable accuracy



An Example of Packets Sampling: HTTP



- 1,000,000 packets transit the network
- 10,000 packets are sampled at random (1%)
- 1,000 of the samples represent HTTP traffic



Estimating the Actual Number of HTTP Packets



- If 1,000 of the samples represent HTTP traffic, then how many of the original 1M packets were actually HTTP?
 - At least 1,000 (those that have been sampled)
 - At most 991,000 (990,000 unsampled + 1,000 HTTP samples)
 - ... but neither of these two values is at all likely...





Best Estimate of the Actual Number of HTTP Packets



- It is most likely that the fraction of HTTP traffic is in the same ratio as its fraction of the samples
- 1,000 of the 10,000 samples, i.e., 10%
- This gives a value of 100,000 packets as the best estimate of the total number of HTTP packets





How Confident We can Be?



- Of course it is very unlikely that there were exactly 100,000 HTTP packets
- A small range of values can be specified that are very likely, say 95% likely, to contain the actual value





Calculating the Confidence



- Calculating the confidence boils down to estimating the variance of the best estimate (closed-form solution exists)
- We are 95% confident that the actual number of HTTP packets falls somewhere between 94,120 and 105,880





Confidence as a % [1/2]

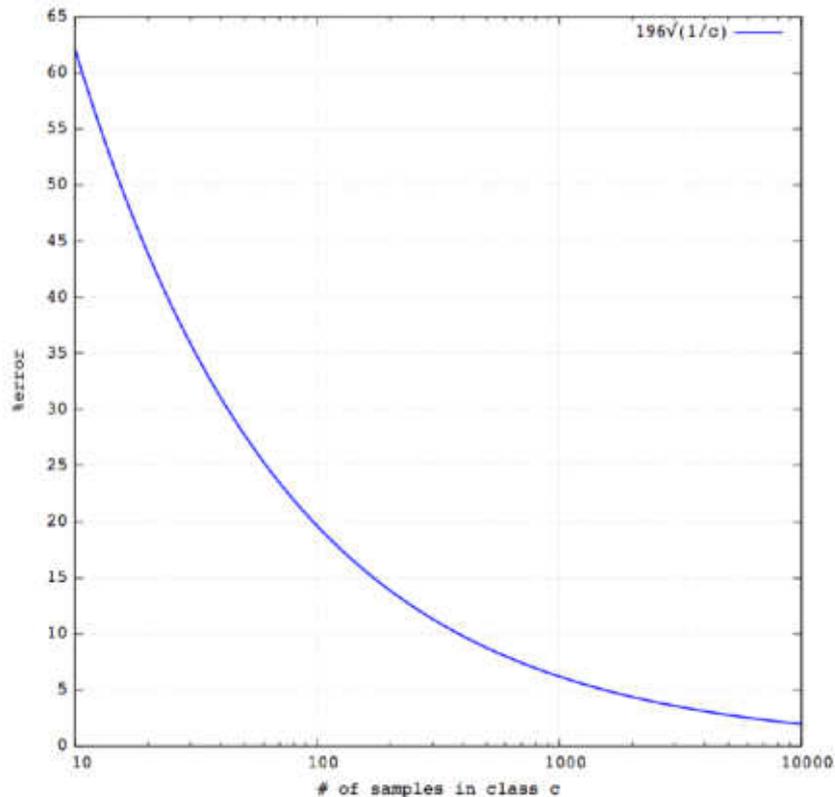


- The confidence range calculated can also be expressed as a percentage of the best estimate
- One can say that the actual value is, with high probability, within a %error from the best estimate
- In other words the largest likely error is %error





Confidence as a % [2/2]



- Depends only on the number of samples c
- Independent from the total number of frames
- Same confidence:
 - 1,000 Pps sampling rate of 1%
 - 1,000,000 Pps sampling rate of 0,001%



sFlow vs Other Technologies



- Several other technologies have been developed over the years to provide network-wide visibility
 - Cisco NetFlow (v1, v5, v7, v8, v9)
 - IPFIX
 - SNMP (v1, v2c, v2c, v3)
 - RMON



sFlow vs SNMP [1/2]



- SNMP provides what sFlow provides with counter samples but...
- ... there is no concept of flow samples in SNMP
- With SNMP you can tell how much bandwidth is being used but...
- ... you cannot tell who is using the bandwidth



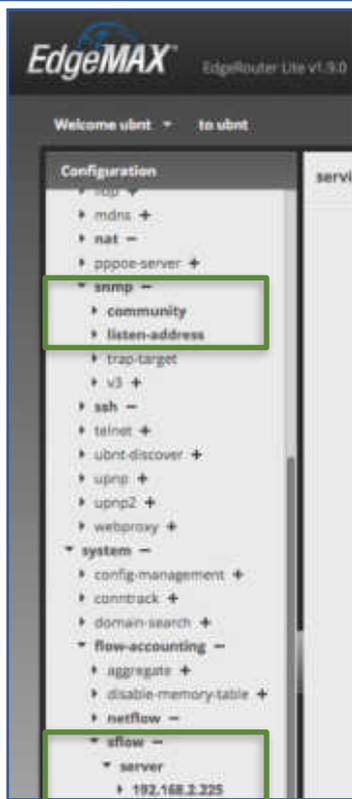
sFlow vs SNMP [2/2]



	sFlow	SNMP
Transport	UDP	UDP
Architecture	↑ PUSH	↓ PULL
Device Visibility		
Traffic Visibility		



sFlow vs SNMP Traffic



- Ubiquiti EdgeRouter Lite
- Configured with
 - sFlow
 - SNMP
- Assess the traffic required to have counters for one interface





sFlow vs SNMP: sFlow Traffic



One sample per packet

Counter samples

Only for interface with id 3

186-Byte packets

ubiquity_sFlow pcap

Expression... +

Expression: ((sflow_245.numsamples == 1) && (sflow_245.samplotype == 2) && (sflow_245.ifindex == 3))

No.	Time	Source	Destination	Protocol	Length	NumSamples	Info
36	6.820105	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
93	18.530577	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
199	37.440200	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
241	48.810444	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
340	69.604585	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
473	97.650854	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
516	105.068770	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
572	117.429964	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
615	125.425581	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
679	137.892357	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
722	147.080032	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
821	167.928194	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...
878	178.731487	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...



sFlow vs SNMP: SNMP Traffic



```
$ snmpget -v2c -cntop 192.168.2.1 ifHCInOctets.3
IF-MIB::ifHCInOctets.3 = Counter64: 57111598398
$ snmpget -v2c -cntop 192.168.2.1 ifHCOutOctets.3
IF-MIB::ifHCOutOctets.3 = Counter64: 1310307062699
$ snmpget -v2c -cntop 192.168.2.1 ifHCInUcastPkts.3
IF-MIB::ifHCInUcastPkts.3 = Counter64: 510083567
$ snmpget -v2c -cntop 192.168.2.1 ifHCOutUcastPkts.3
IF-MIB::ifHCOutUcastPkts.3 = Counter64: 921959741
$ snmpget -v2c -cntop 192.168.2.1 ifHighSpeed.3
IF-MIB::ifHighSpeed.3 = Gauge32: 1000
```

781
Bytes

No.	Time	Source	Destination	Protocol	Length	NumSamples	Info
1	0.000000	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.6.3
2	0.036348	192.168.2.1	172.16.2.141	SNMP	81		get-response 1.3.6.1.2.1.31.1.1.1.6.3
3	2.238210	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.10.3
4	2.274659	192.168.2.1	172.16.2.141	SNMP	82		get-response 1.3.6.1.2.1.31.1.1.1.10.3
5	10.530200	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.7.3
6	10.601663	192.168.2.1	172.16.2.141	SNMP	80		get-response 1.3.6.1.2.1.31.1.1.1.7.3
7	17.594939	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.11.3
8	17.656787	192.168.2.1	172.16.2.141	SNMP	80		get-response 1.3.6.1.2.1.31.1.1.1.11.3
9	30.435430	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.15.3
10	30.470999	192.168.2.1	172.16.2.141	SNMP	78		get-response 1.3.6.1.2.1.31.1.1.1.15.3



sFlow vs SNMP: sFlow Traffic



sFlow: 1 186-Byte packet
SNMP: 10 packets
with total length
781 Bytes

The image shows two Wireshark capture windows. The top window, titled 'ubiquity_sFlow.pcap', displays a list of sFlow packets. A red box highlights the 'Length' column, which shows a value of 186 for each packet. The bottom window, titled 'SNMP_snmpget.pcap', displays a list of SNMP packets. A red box highlights the 'Length' column, which shows values of 76, 81, 76, 82, 76, 80, 76, 80, 76, and 78 for the 10 packets. A red arrow points from the sFlow packet length box to the SNMP packet length box.

No.	Time	Source	Destination	Protocol	Length	NumSamples	Info
36	6.820105	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub...
93	18.530577	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub...
199	37.440200	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub...
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340	69.604585	192.168.2.1	192.168.2.225	sFlow	186	1	V5, agent 192.168.80.149, sub-agen...

No.	Time	Source	Destination	Protocol	Length	NumSamples	Info
1	0.000000	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.6.3
2	0.036348	192.168.2.1	172.16.2.141	SNMP	81		get-response 1.3.6.1.2.1.31.1.1.1.6.3
3	2.238210	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.10.3
4	2.274659	192.168.2.1	172.16.2.141	SNMP	82		get-response 1.3.6.1.2.1.31.1.1.1.10.3
5	10.530200	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.7.3
6	10.601663	192.168.2.1	172.16.2.141	SNMP	80		get-response 1.3.6.1.2.1.31.1.1.1.7.3
7	17.594939	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.11.3
8	17.656787	192.168.2.1	172.16.2.141	SNMP	80		get-response 1.3.6.1.2.1.31.1.1.1.11.3
9	30.435430	172.16.2.141	192.168.2.1	SNMP	76		get-request 1.3.6.1.2.1.31.1.1.1.15.3
10	30.470999	192.168.2.1	172.16.2.141	SNMP	78		get-response 1.3.6.1.2.1.31.1.1.1.15.3



sFlow, Wireshark and ntop



- Wireshark can be used with sFlow traffic to
 - Dissect sFlow packets
 - Dissect packets in sFlow flow samples
- Using the a Lua plugin by ntop Wireshark can be used also as an sFlow collector



DEMOS



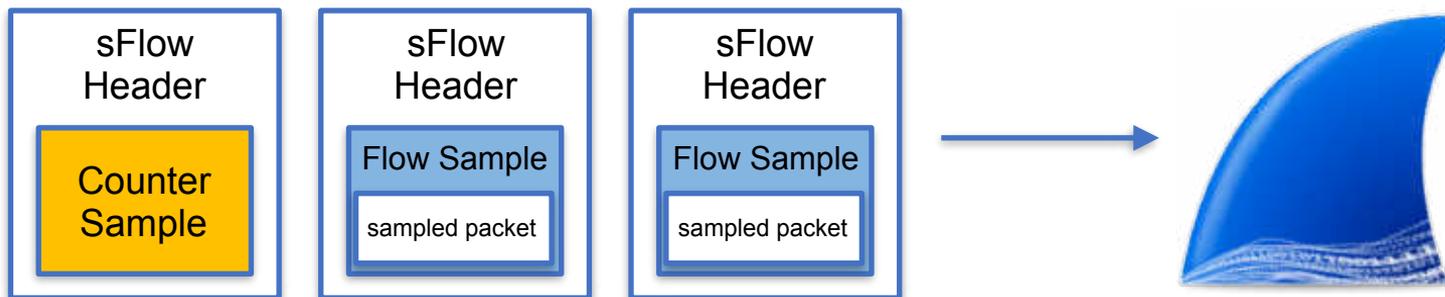
- Live sFlow traffic courtesy of our friend Jens Olsson at hosting provider Inleed
- Three switches generating sFlow that we will get via SSH



DEMO #1: Wireshark + sFlow Traffic [1/2]



- A closer look at sFlow traffic with Wireshark





DEMO #1: Wireshark + sFlow Traffic [2/2]



Execute a remote tcpdump via SSH
(could have used Wireshark extcap sshdump)

output to stdout

filter to just get
sFlow traffic

```
ssh root@<remote-host> "tcpdump -s0 -nnei ens3 -w - 'port 6343'" \  
| wireshark -k -i -
```

pipe the ssh stdout...

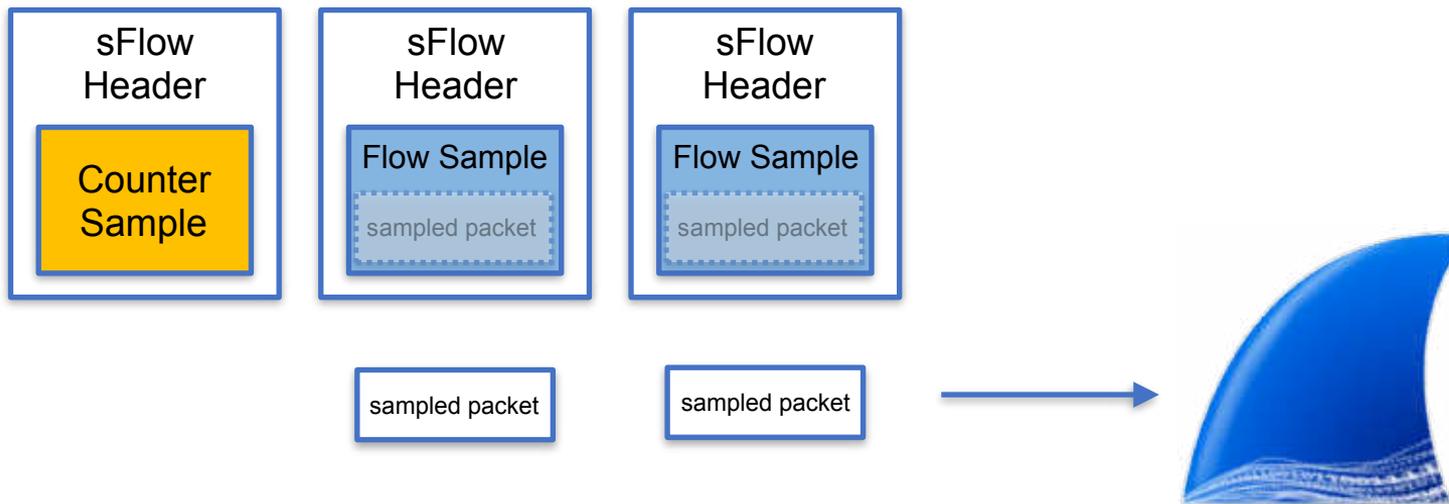
...to the Wireshark stdin



DEMO #2: Wireshark + sFlow Sampled Packets [1/2]



- sflowtool required to extract packets
<https://github.com/sflow/sflowtool.git>





DEMO #2: Wireshark + sFlow Sampled Packets [2/2]



Execute a remote tcpdump via SSH

output to stdout

filter to just get
sFlow traffic

```
ssh root@<remote-host> "tcpdump -s0 -nnei ens3 -w - 'port 6343' \  
| ./src/sflowtool -t -r - \  
| wireshark -k -i -"
```

pipe the sflowtool stdout...

...to the Wireshark stdin

read from stdin...

... and output packets
contained in flow samples
to stdout

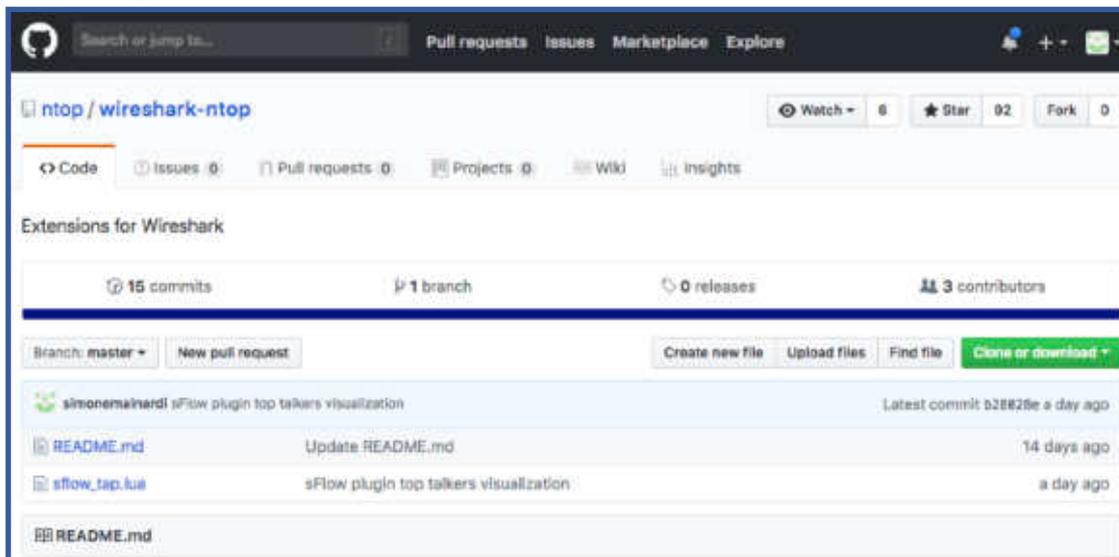


DEMO #3: Wireshark as an sFlow Collector [1/2]



Fork me on GitHub

- Lua plugin `sflow_tap.lua` is available at <https://github.com/ntop/wireshark-ntop>





DEMO #3: Wireshark as an sFlow Collector [2/2]



Wireshark - sFlow Counters

INTERFACE	IN BYTES	OUT BYTES	IN RATE	OUT RATE	UTILIZATION
1	8.25 GB	956.24 GB	0.00 B/s	69.80 Kb/s	0.00 %
2	5.61 GB	120.73 GB	151.03 Kb/s	4.89 Mb/s	0.49 %
25	9.11 TB	20.54 TB	97.41 Mb/s	215.22 Mb/s	21.52 %
26	21.51 TB	9.05 TB	207.72 Mb/s	86.93 Mb/s	2.08 %
TOTAL	30.64 TB	30.65 TB	305.28 Mb/s	307.10 Mb/s	

Wireshark - sFlow Top Talkers

SOURCE	SOURCE BYTES	SOURCE RATE	DEST	DEST BYTES	DEST RATE
79.136.102.9	171.17 MB	1.36 Mb/s	192.165.9.17	191.19 MB	1.36 Mb/s
185.189.49.21	30.75 MB	424.55 Kb/s	185.189.49.20	5.74 MB	1.63 Mb/s
94.254.123.37	17.17 MB	278.42 Kb/s	79.136.102.9	3.43 MB	78.12 Kb/s
151.101.1.62	5.74 MB	1.63 Mb/s	107.167.113.42	2.86 MB	0.00 B/s
185.189.51.174	5.72 MB	274.79 Kb/s	81.229.134.60	2.86 MB	0.00 B/s

SOURCE	SOURCE BYTES	SOURCE RATE	DEST	DEST BYTES	DEST RATE
94.254.123.37	20.03 MB	1.06 Mb/s	185.189.49.4	13.70 MB	3.15 Mb/s
213.80.97.15	13.70 MB	3.15 Mb/s	5.150.195.205	11.48 MB	22.05 Mb/s
192.168.0.162	12.04 MB	27.41 Kb/s	194.71.138.160	11.44 MB	223.92 Kb/s



Take-Home



- sFlow is a pretty lightweight technology to have an overall view of your network devices and the traffic they are handling
 - Is this device overloaded? Who's consuming all this bandwidth?
- Wireshark is suitable not only to dissect and inspect sFlow packets but also to provide devices interfaces status and top talkers information!
 - `sflow_tap.lua` plugin available at: <https://github.com/ntop/wireshark-ntop>
- Contact me: mainardi@ntop.org / @simonemainardi



Appendix



- Effects of lost sFlow packets
- Packet Sampling:
 - Strategies
 - Formulas
 - Statistical Background
- Demonstration screenshots



Effects of Lost sFlow Packets



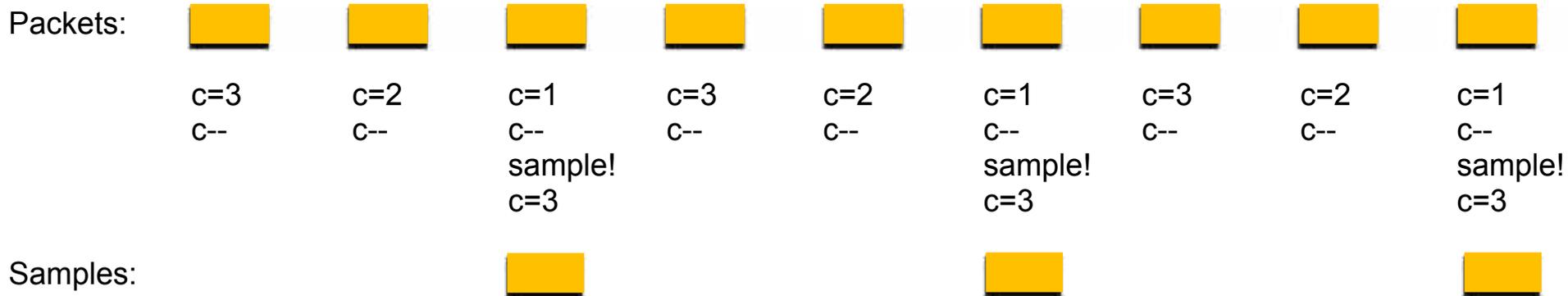
- Lost counter samples
 - Values are cumulative, new (updated) values will be sent in the next sample
 - Almost impossible to miss the detection of a counter wrap (64-bit counters)
- Lost flow samples
 - Changes in the actual sampling rate



Packets Sampling Strategies [1/2]



- One packet in N is sampled
 - Initialize a counter to N
 - Decrement the counter with each packet
 - Sample the packet when the counter reaches 0
- Example with $N=3$

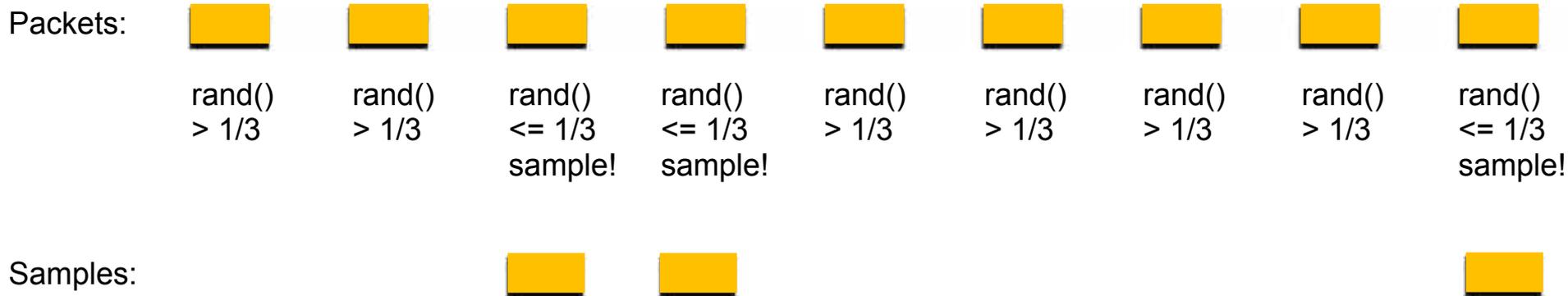




sFlow Packets Sampling [2/2]



- One packet in N (on average) is sampled
 - Draw a random number $0 \leq r \leq 1$
 - Sample if $r \leq 1/N$
- Synchronization with periodic traffic patterns is prevented with randomness
- Example with $N=3$, $\text{rand}() = \text{random } [0,1]$ number generator





Estimating the Actual Number of HTTP Packets



- If 1,000 of the samples represent HTTP traffic, then how many of the original 1M packets were actually HTTP?
 - At least 1,000 (those that have been sampled)
 - At most 991,000 (990,000 unsampled + 1,000 HTTP samples)
 - ... but neither of these two values is at all likely...





Best Estimate of the Actual Number of HTTP Packets



- It is most likely that the fraction of HTTP traffic is in the same ratio as its fraction of the samples
- 1,000 of the 10,000 samples, i.e., 10%
- This gives a value of 100,000 packets as the best estimate of the total number of HTTP packets

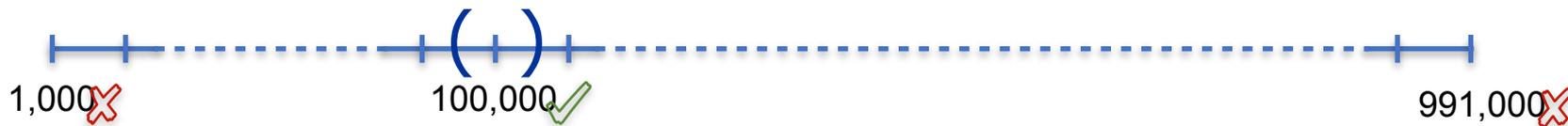




How Confident We can Be?



- Of course it is very unlikely that there were exactly 100,000 HTTP packets
- A small range of values can be specified that are very likely, say 95% likely, to contain the actual value





Calculating the Confidence [1/3]



- Calculating the confidence boils down to estimating the variance of the best estimate



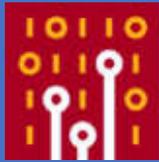
Calculating the Confidence [2/3]



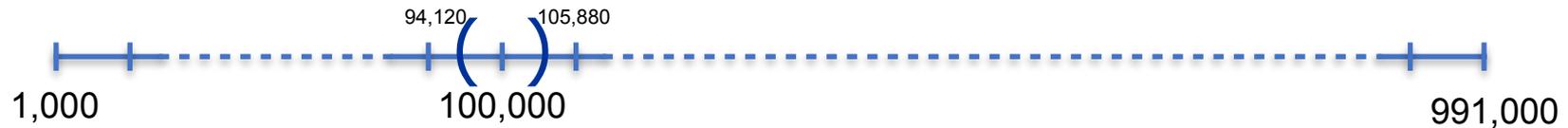
- $N = 1,000,000$ packets transited
- $n = 10,000$ packets sampled
- $c = 1,000$ HTTP samples
- $N_c = 100,000 = \text{best estimate} = c / n * N$
- The variance of the best estimate N_c is
$$\sigma^2 = N^2 * c * (1 - c / n) * 1 / (n * (n - 1))$$
$$= 9,000,000$$



Calculating the Confidence [3/3]



- The 95% confidence is within 1.96 standard deviations from the best estimate
[$N_c - 1.96\sigma$; $N_c + 1.96\sigma$]
- In the HTTP example
 - $\sigma^2 = 9,000,000$
 - $\sigma = 3,000$
 - [$100,000 - 1.96 * 3000$, $100,000 + 1.96 * 3000$]
= [94,120; 105,880]
- We are 95% confident that the actual number of HTTP packets falls somewhere between 94,120 and 105,880





Confidence as a % [1/3]



- The confidence range calculated can also be expressed as a percentage of the best estimate
- One can say that the actual value is, with high probability, within a %error from the best estimate
- In other words the largest likely error is %error



Confidence as a % [2/3]



- The estimate of the percentage error %error
 $\%error = \sqrt{1 / c}$
- In the HTTP example
 - $\%error = 196 * \sqrt{1 / c}$
 $= 196 * \sqrt{1 / 1,000}$
 $= 6.20 \%$
- The largest likely error is 6.20 %
- Note: %error formula given is an approximation and only works well when $n \gg c$





Statistical Background



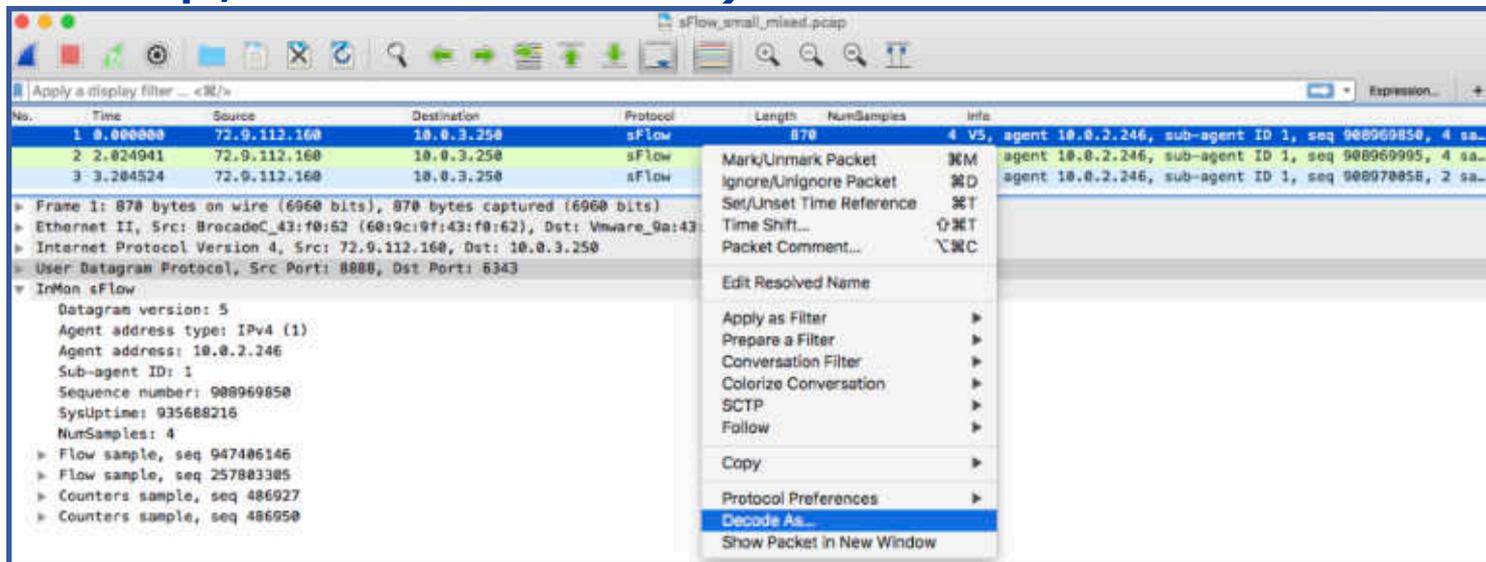
- Assumption is that packet sampling can be modeled by the binomial distribution
- Prove that measured statistics can be used to accurately estimate the parameters of the actual theoretical binomial distribution
- Use the central limit theorem to compute the confidence intervals of a normal curve



DEMO: Wireshark + sFlow Traffic



- Simply feed Wireshark with sFlow traffic (pcap, extcap, live interfaces)





DEMO: Wireshark + sFlow Flow Samples



Apply a display filter: <DE>

No.	Time	Source	Destination	Protocol	Length	NumSamples	Info
384	40.000000	Cisco_36:8f:3f	Broadcast	ARP	64		who has 105.109.49.230? Tell 105.109.48.1
385	40.000000	194.68.59.32	60.226.18.20	OpenVPN	746		MessageType: P_DATA_V2
386	40.000000	194.68.59.34	90.152.134.226	OpenVPN	190		MessageType: P_DATA_V1
387	40.000000	194.68.59.76	84.120.203.209	OpenVPN	1415		MessageType: P_DATA_V1
388	41.000000	76.76.231.9	46.50.182.198	TCP	70		68956 → 443 [ACK] Seq=1 Ack=1 Win=1988 Len=0 TSval=8718...
389	41.000000	194.68.59.76	2.21.240.211	TCP	60		[TCP Previous segment not captured] 52727 → 443 [ACK] S...
390	41.000000	194.68.59.30	89.153.165.148	OpenVPN	757		MessageType: P_DATA_V2
391	41.000000	194.68.59.30	80.153.165.148	OpenVPN	757		MessageType: P_DATA_V2
392	41.000000	194.68.59.36	134.3.254.70	OpenVPN	878		MessageType: P_DATA_V2
393	41.000000	194.68.59.76	80.209.209.84	ESP	1562		ESP (SPI=0x2974ccb)
394	41.000000	194.68.59.76	189.82.204.142	TCP	60		[TCP Previous segment not captured] 7773 → 443 [ACK] S...
395	41.000000	194.68.59.80	188.187.146.175	SSL	1506		[TCP Previous segment not captured] , Continuation Data
396	41.000000	194.68.59.56	31.16.258.172	OpenVPN	790		MessageType: P_DATA_V2
397	41.000000	194.68.59.80	188.187.146.175	SSL	1596		[TCP Previous segment not captured] , Continuation Data
398	42.000000	194.68.59.56	31.16.258.172	OpenVPN	746		MessageType: P_DATA_V2
399	42.000000	194.68.59.36	134.3.254.70	OpenVPN	878		MessageType: P_DATA_V2

Frame 358: 62 bytes on wire (496 bits), 62 bytes captured (496 bits) on interface 0
Ethernet II, Src: IntelCor_did:23:3a (00:1b:21:did:23:3a), Dst: Cisco_36:8f:3f (f8:0d:cb:36:8f:3f)
Internet Protocol Version 4, Src: 194.68.59.56, Dst: 93.7.116.34
User Datagram Protocol, Src Port: 5074, Dst Port: 22222
Data (20 bytes)



DEMO: Wireshark as an sFlow Collector [1/2]



The screenshot shows the Wireshark interface with the 'Tools' menu open and 'sFlow' selected. The 'sFlow Counters' window displays statistics for three agents. The first agent (10.0.2.154) has 5 interfaces, the second (10.0.2.253) has 14 interfaces, and the third (185.189.48.162) has 8 interfaces. The data is summarized in the following tables:

agent: 10.0.2.154	INTERFACE	IN BYTES	OUT BYTES	IN RATE	OUT RATE	UTILIZATION
	1	8.25 GB	956.24 GB	0.00 B/s	69.80 Kb/s	0.00 %
	2	5.61 GB	120.73 GB	151.03 Kb/s	4.89 Mb/s	0.49 %
	25	9.11 TB	20.54 TB	97.41 Mb/s	215.22 Mb/s	21.52 %
	26	21.51 TB	9.05 TB	207.72 Mb/s	86.93 Mb/s	2.08 %
	TOTAL	30.64 TB	30.65 TB	305.28 Mb/s	307.10 Mb/s	

agent: 10.0.2.253	INTERFACE	IN BYTES	OUT BYTES	IN RATE	OUT RATE	UTILIZATION
	3	250.62 MB	4.89 GB			
	4	23.27 GB	536.29 MB			
	6	66.67 GB	65.07 GB	301.51 Kb/s	64.24 Kb/s	0.03 %
	10	4.92 GB	109.29 GB	0.00 B/s	53.48 Kb/s	0.00 %
	14	220.22 GB	8.92 TB	15.98 Kb/s	98.10 Kb/s	0.00 %
	16	24.87 TB	43.79 TB	3.16 Mb/s	1.12 Mb/s	0.32 %
	17	40.61 TB	7.62 TB	8.90 Mb/s	3.42 Mb/s	0.89 %
	19	30.63 TB	5.46 TB	5.46 Mb/s	2.48 Mb/s	0.55 %
	20	105.59 TB	79.46 TB	51.32 Mb/s	7.29 Mb/s	5.13 %
	24	7.24 GB	418.61 GB	3.85 Kb/s	247.46 Kb/s	0.02 %
	25	215.70 TB	204.28 TB	263.15 Mb/s	197.08 Mb/s	2.63 %
	26	10.08 TB	78.23 TB	5.55 Mb/s	104.29 Mb/s	1.04 %
	TOTAL	427.78 TB	428.35 TB	337.86 Mb/s	316.15 Mb/s	

agent: 185.189.48.162	INTERFACE	IN BYTES	OUT BYTES	IN RATE	OUT RATE	UTILIZATION
	1	0.00 B	425.00 B			
	4	211.15 MB	37.61 GB	381.87 b/s	59.93 Kb/s	0.06 %
	5	693.78 KB	5.23 MB			
	6	19.29 KB	850.00 B			
	8	29.82 TB	29.64 TB	128.61 Mb/s	123.21 Mb/s	1.29 %
	TOTAL	29.82 TB	29.68 TB	128.61 Mb/s	123.27 Mb/s	



DEMO: Wireshark as an sFlow Collector [2/2]



The screenshot shows the Wireshark interface with the 'Tools' menu open, navigating to 'sFlow' and 'Talkers'. The main window displays a table of sFlow data for three agents.

agent:	SOURCE	SOURCE BYTES	SOURCE RATE	DEST	DEST BYTES	DEST RATE
10.0.2.154	79.136.102.9	171.17 MB	1.36 Mb/s	192.165.9.17	191.19 MB	1.36 Mb/s
10.0.2.154	185.189.49.21	30.75 MB	424.55 Kb/s	185.189.49.20	5.74 MB	1.63 Mb/s
10.0.2.154	94.254.123.37	17.17 MB	278.42 Kb/s	79.136.102.9	3.43 MB	78.12 Kb/s
10.0.2.154	151.101.1.62	5.74 MB	1.63 Mb/s	107.167.113.42	2.86 MB	0.00 B/s
10.0.2.154	185.189.51.174	5.72 MB	274.79 Kb/s	81.229.134.60	2.86 MB	0.00 B/s
10.0.2.253	94.254.123.37	20.03 MB	1.06 Mb/s	185.189.49.4	13.70 MB	3.15 Mb/s
10.0.2.253	213.80.97.15	13.70 MB	3.15 Mb/s	5.150.195.205	11.48 MB	22.05 Mb/s
10.0.2.253	192.168.0.162	12.04 MB	27.41 Kb/s	194.71.138.160	11.44 MB	223.92 Kb/s
10.0.2.253	194.68.59.159	11.44 MB	223.92 Kb/s	192.176.45.219	11.44 MB	1.06 Mb/s
10.0.2.253	185.102.102.3	8.58 MB	24.00 Mb/s	192.176.45.237	11.41 MB	156.44 Kb/s
185.189.48.162	194.68.59.88	1.95 GB	1.57 Mb/s	46.223.129.1	1.89 GB	131.07 Kb/s
185.189.48.162	194.68.59.56	759.24 MB	6.36 Mb/s	31.16.250.172	733.50 MB	6.36 Mb/s
185.189.48.162	194.68.59.36	666.09 MB	7.08 Mb/s	134.3.254.70	625.27 MB	7.08 Mb/s
185.189.48.162	194.68.59.54	567.68 MB	6.00 Mb/s	95.222.30.6	559.70 MB	6.00 Mb/s
185.189.48.162	194.68.59.78	347.23 MB	12.19 Mb/s	80.209.209.84	340.56 MB	870.69 Kb/s