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ENERGY SCIENCES NETWORK

Fastcapa-ng

High-Speed Telemetry Ingest and Processing with DPDK and Kafka

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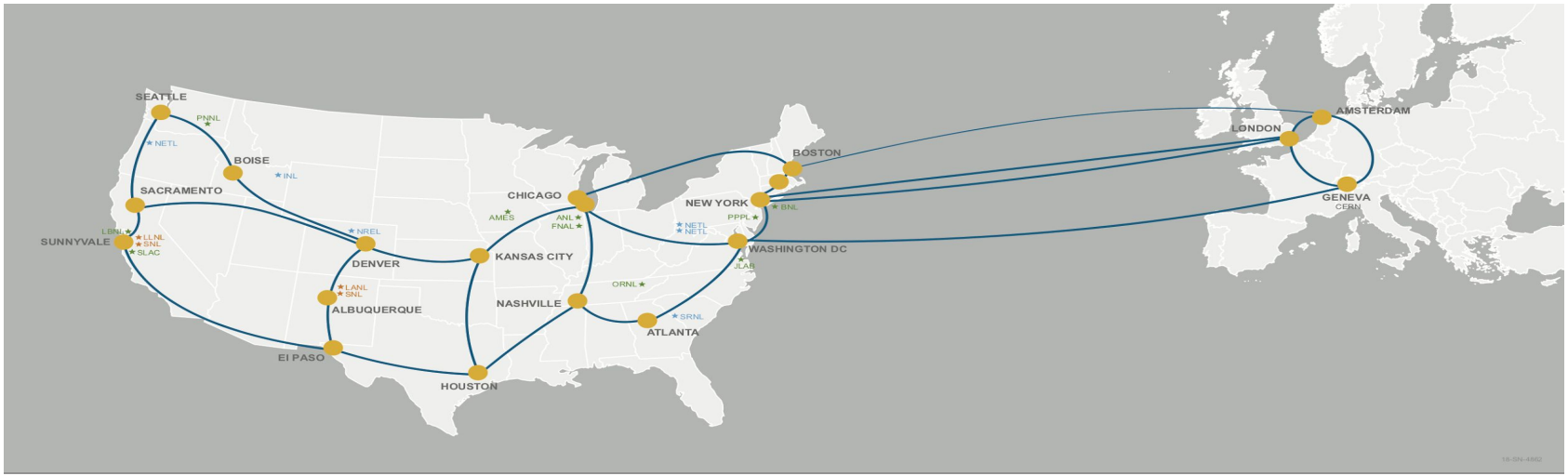
ESnet: DOE's high-performance network (HPN) user facility optimized for enabling big-data science



ESnet provides connectivity to
all of the DOE labs, experiment sites, & supercomputers

ESnet Network Packet Telemetry Data

- SNMP
  - All interfaces, 30 seconds poll interval
  - Primary use: failure detection, traffic visualization: http://my.es.net
  - Data rate: 4000 interfaces => **130 events per second**
- Netflow / IPFIX
  - All interfaces, packets sampled 1:1000
  - Primary use: capacity planning (offline)
  - Raw data rate: **~ 6500 events per second**
- High Touch Services
  - Selected interfaces and flows, 1:1 packet to telemetry
  - Primary use: high-precision telemetry
  - Raw data rate: **~ 1 to 8 million events per second** for a single interface

Telemetry	Raw Data Rate Per Second
SNMP	130
Netflow / IPFIX	6500
High Touch Services	1 - 8 M

Telemetry Data Rates

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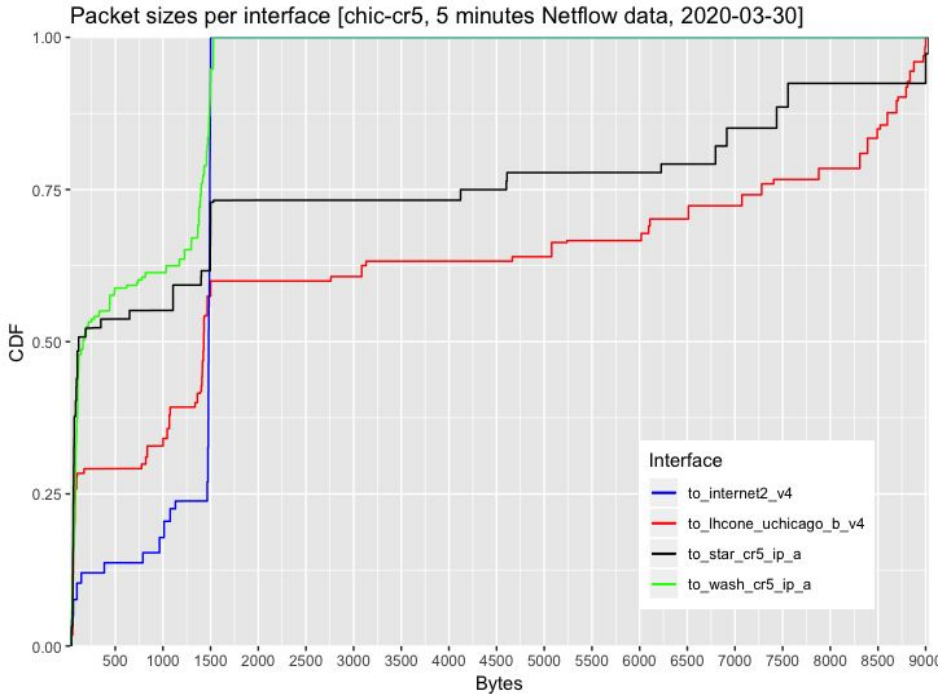
Per-Packet Data Rates

- Packet size depends on:
  - MTU
  - Application (science vs http)
  - Average for science traffic: ~1500B
- Traffic rate at ESnet at any time:
  - All traffic: O(1Tbit/s)
  - Large customers: O(100Gbit/s)

Packet size	Rate	Telemetry PPS	Telemetry Rate
1500B	10Gb/s	812K	1,079Mb/s
1500B	100Gb/s	8,127K	10,790Mb/s
9000B	10Gb/s	138K	183Mb/s
9000B	100Gb/s	1,383K	1,833Mb/s

Telemetry Packet Rates



Estimated packet sizes in production

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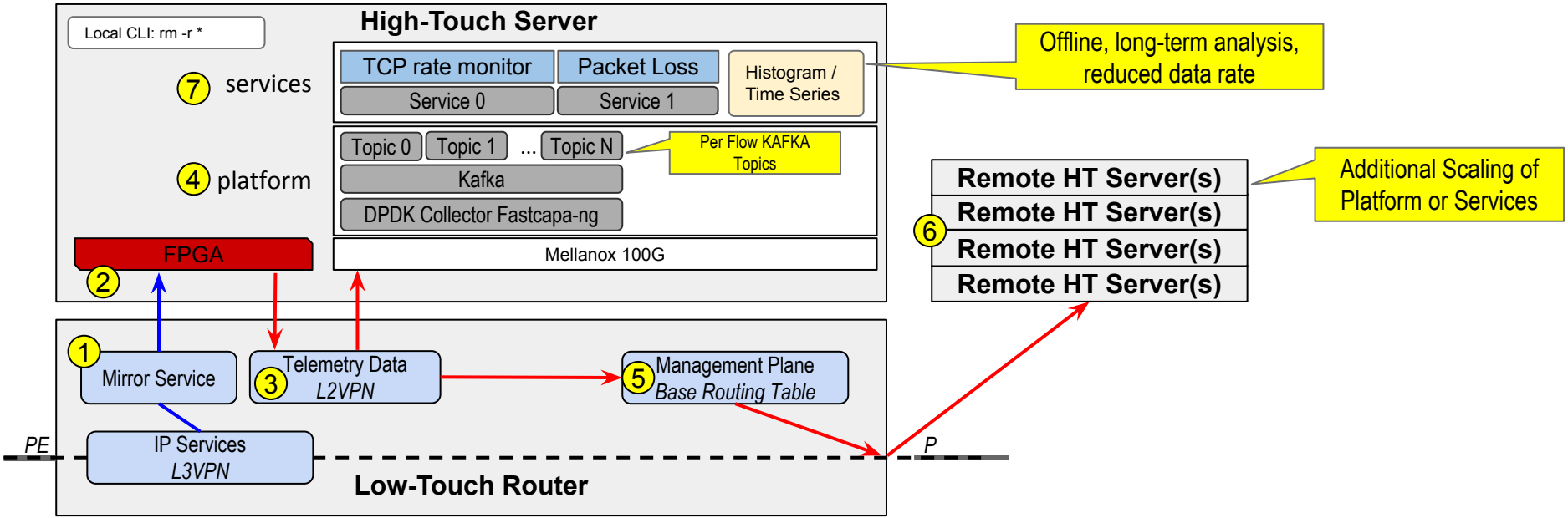
ESnet6 High-Touch Architecture Overview



1. Mirror Service - Allows selective flows in the dataplane to be duplicated and sent to the FPGA for processing.
2. Programmable Dataplane (DP) - Appends meta-data, timestamps and repackages packet for transmission to Platform code.
3. Telemetry Data L2VPN - Connect Dataplane and Platform, possibly on different High-Touch Servers.
4. Platform - Reads telemetry packets from the network and distributes information to High Touch Services.
5. Management Plane Base Routing Table - Provides connectivity to Remote Servers.
6. Remote Server - Hosts Platform components or Services (but not a Dataplane). Telemetry data can be directed to Remote Servers.
7. Service - Reads data from the Platform and performs real-time analysis as well as inserts selected telemetry data into database.

- - - - Datapath of Customer Packet
- - - - Datapath of Mirrored Packet
-------- Datapath of Telemetry Packet

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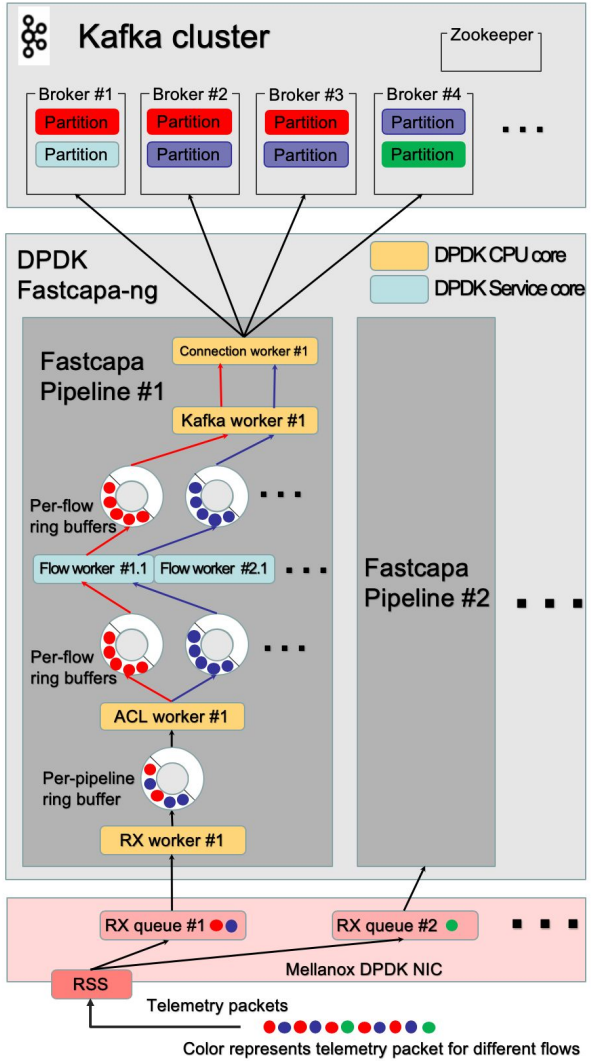
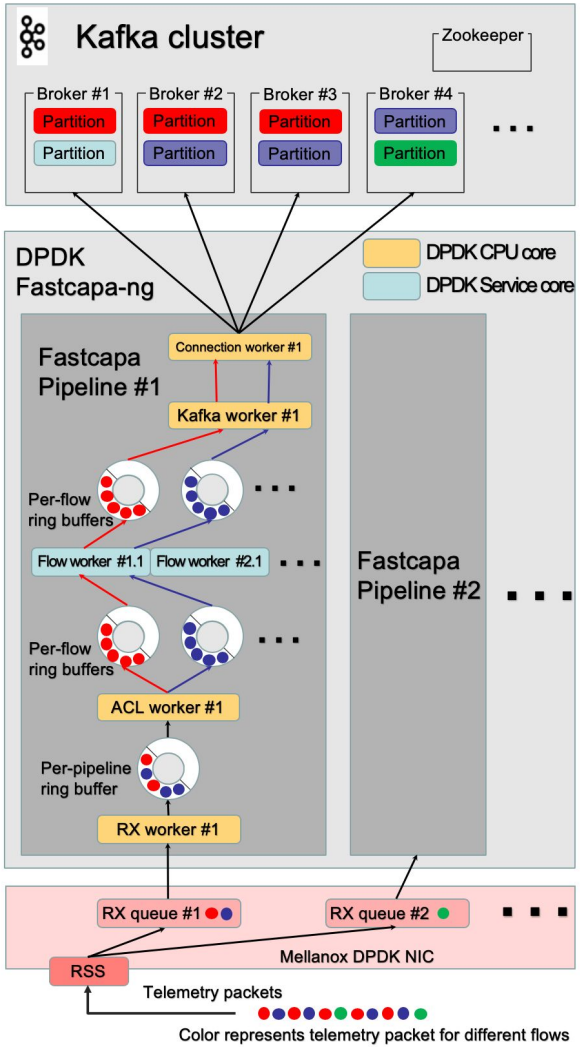
Fastcapa-ng

- **ESnet-developed software (C / DPDK)**
  - Based on Apache Metron Fastcapa
  - Primary functions: telemetry processing, batching, filtering, aggregation, forwarding
- **Design goals:**
  - Packet order preservation
  - High-performance Kafka handling
  - Easy programming
- **Multi-pipeline** design for scalability, each pipeline can handle TCP flows from single 100G link.
- **Multi-stage** design for performance, each packets will be processed by 5 CPUs in series.



Fastcapa-ng Internals

- Dedicated Kafka connection
  - maintain TCP connection, message compression task
- Kafka worker
  - Combine multiple telemetry packets into large kafka messages
- Flow worker (service cores)
  - process flows using different function:
    - Passthrough
    - Sampling
    - Histogram
    - (more under development)
  - Flexible N to M mapping of flow to service cores.
- ACL worker
  - classify flows and send them to dedicated rings.
- RX worker
  - pull packet into ring buffers
- RX queue
  - NIC dma packets into memory
  - RSS (Receive Side Scaling) applied



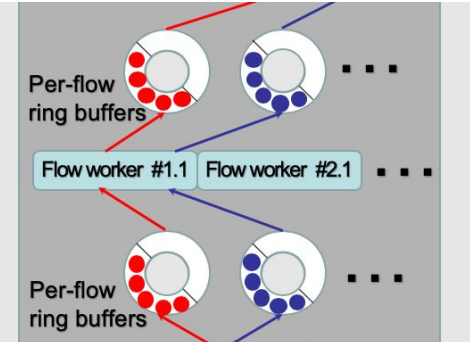
Flow Worker (Service Cores)

```
/**
 * This is sampling worker for service-core function.
 * A sampling rate is defined for the flow processed by this worker.
*/
static int sampling_worker(void *args)
{
    service_params *params = (service_params*) args;
    unsigned nb_in, i;
    unsigned nb_out= 0;
    const unsigned int flow_burst_size = params->flow_burst_size;
    struct rte_ring *input_ring = params->input_rings[params->ring_id];
    struct rte_ring *output_ring = params->output_rings[params->ring_id];

    // dequeue packets from the ring
    struct rte_mbuf* pkts[flow_burst_size];
        nb_in = rte_ring_dequeue_burst(input_ring, (void*) pkts, flow_burst_size, NULL);

    if(likely(nb_in > 0)) {
        params->stats.in += nb_in;

        for(i = 0; i < nb_in; i ++){
            if(params->sampling_counter == 0){
                rte_ring_enqueue(output_ring,pkts[i]);
                nb_out ++;
            }
            else{
                rte_pktmbuf_free(pkts[i]);
            }
            params->sampling_counter = (params->sampling_counter + 1) % params->sampling_rate;
        }
        params->stats.out += nb_out;
    }

    return 0;
}
```

Read from input queue

Write to output queue

Drop packet



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Fastcapa-ng Runtime Configuration

```
{
    protocol = 6;
    protocol_mask = 255;
    srcIP = "192.168.25.5";
    srcIP_mask = 32;
    dstIP = "192.168.25.4";
    dstIP_mask = 32;
    srcPort = 5201;
    srcPort_mask = 5201;
    dstPort = 10001;
    dstPort_mask = 10001;
    priority = 103;

    flow_id = 3;
    flow_id_mask = 65535;
    ring_id = 3;
    service_function = "sampling";
    sampling_rate = 10; //meaning 1:10 downsampling
    pipeline = 1;
    service_core_in_pipeline = 0;
    service_core_id = 2;
    kafka_topic = "topic_flow3";
},
```

Sampling

```
{   protocol = 6;
    protocol_mask = 255;
    srcIP = "192.168.25.4";
    srcIP_mask = 32;
    dstIP = "192.168.25.5";
    dstIP_mask = 32;
    srcPort = 10002;
    srcPort_mask = 10002;
    dstPort = 5202;
    dstPort_mask = 5202;
    priority = 102;

    flow_id = 2;
    flow_id_mask = 65535;
    ring_id = 2;
    service_function = "histogram";
    resolution = 100;//ns for inter arrival
    report_interval_tsc = 280000000; //CPU cycle count not actual
    //report_interval_tsc = 280; //CPU cycle count not actual
    pipeline = 0;
    service_core_in_pipeline = 1;
    service_core_id = 1;
    kafka_topic = "topic_flow2";
},
```

Histogram

```
{   protocol = 6;
    protocol_mask = 0;
    srcIP = "0.0.0.0";
    srcIP_mask = 0;
    dstIP = "0.0.0.0";
    dstIP_mask = 0;
    srcPort = 0;
    srcPort_mask = 65535;
    dstPort = 0;
    dstPort_mask = 65535;
    priority = 1;

    flow_id = 0;
    flow_id_mask = 0;
    ring_id = 0; //drop at flow_worker
    service_function = "passthrough";//"drop"
    pipeline = 0;
    service_core_in_pipeline = 0;
    service_core_id = 0;
    kafka_topic = "topic_drop";
},
```

Filter

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Fastcapa-ng Runtime Statistics

ESnet Fastcapa-ng

	----- in -----	--- in MPPS ---	--- queued ---	----- out -----	---- drops	---- -- ring space -
[nic-port-0]	794580034485	0	-	0		
[nic]	794580034485	0	-	0		
[rx-worker-00]	55503	0.000000	-	55503	0	0
[rx-worker-01]	794579979214	0.458752	-	794579979214	0	0
[rx]	794580034717	0.458752	-	794580034717	0	
[acl-worker-00]	55503	0.000000	-	0	0	
[acl-worker-01]	794579979226	0.458752	-	794579979226	0	
[acl]	794580034729	0.458752	-	794579979226	0	
[flow-worker-00]	0	0.000000	-	0	0	
[flow-worker-01]	0	0.000000	-	0	0	
[flow-worker-02]	0	0.000000	-	0	0	
[flow-worker-03]	794579979242	0.458752	-	79457997925	0	
[flow-worker-04]	0	0.000000	-	0	0	
[rings]	794579979242	0.458752	-	79457997925	0	
[kafka-worker-00]	0	0.000000	-	0	0	
[kafka-worker-01]	79457997929	0.049152	-	78417537800	0	
[kafka]	79457997929	0.049152	-	78417537800	0	
[kafka-conn-worker-00]	0	0.000000	-	0	0	
[kafka-conn-worker-01]	78417537802	0.049152	-	78417366783	0	
[kaf-conn]	78417537802	0.049152	-	78417366783	0	

Fastcapa-ng pipeline statistics
Also in Grafana via Prometheus

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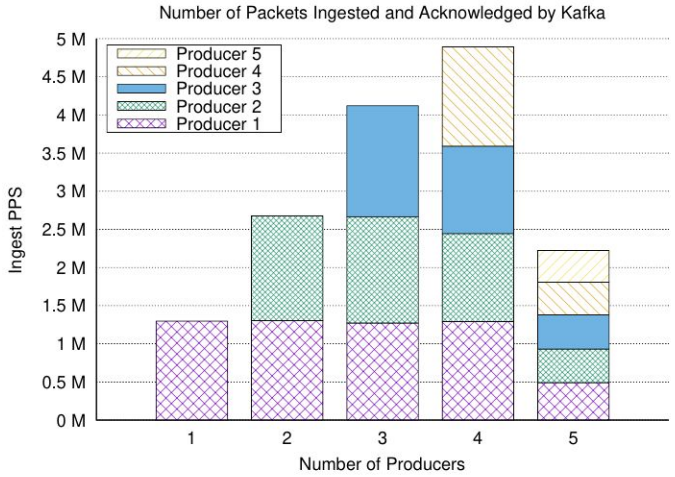
Kafka Performance

- Docker-compose for a single server
  - bitnami/kafka (x6), bitnami/zookeeper (x3)
  - bitnami/jmx-exporter
  - prom/prometheus
  - grafana/grafana
- 5M messages per second Kafka ingest performance demonstrated on single server
- Possible bottlenecks to go higher:
  - Librdkafka C client (inside Fastcapa-ng)
  - Docker proxy - network
  - CPU - Client and brokers share the host



~5M messages per second ingest
untuned single server / 6 broker / parallel producers
Kafka Benchmark tool, 64K message batches

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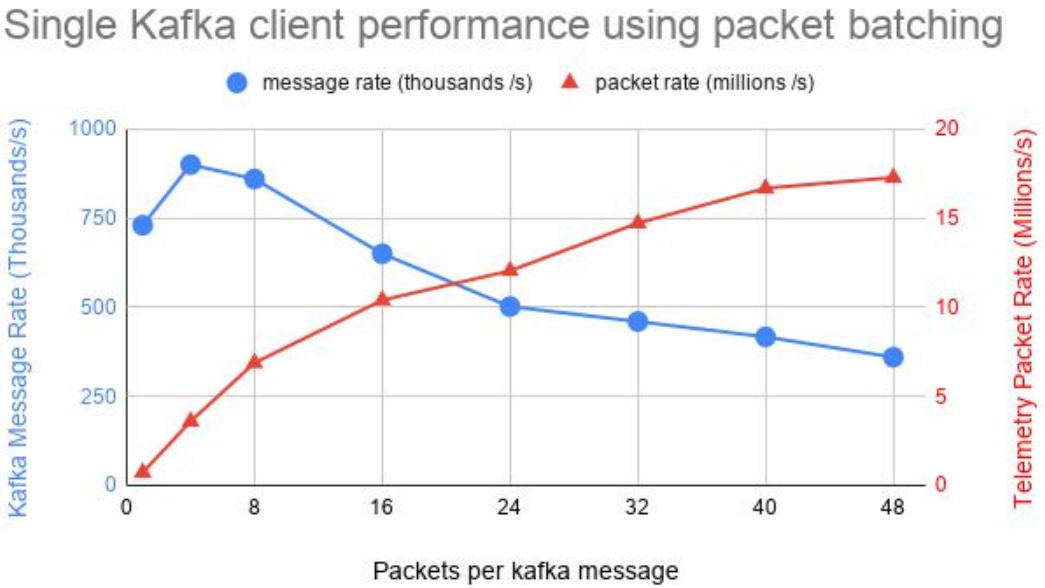
Fastcapa's Kafka - going over 15M PPS

On top of **message batching** (handled by librdkafka), we need **packet batching** (handled by Fastcapa / client application).

That means that one Kafka message contains multiple telemetry packets. Client application has to unpack.



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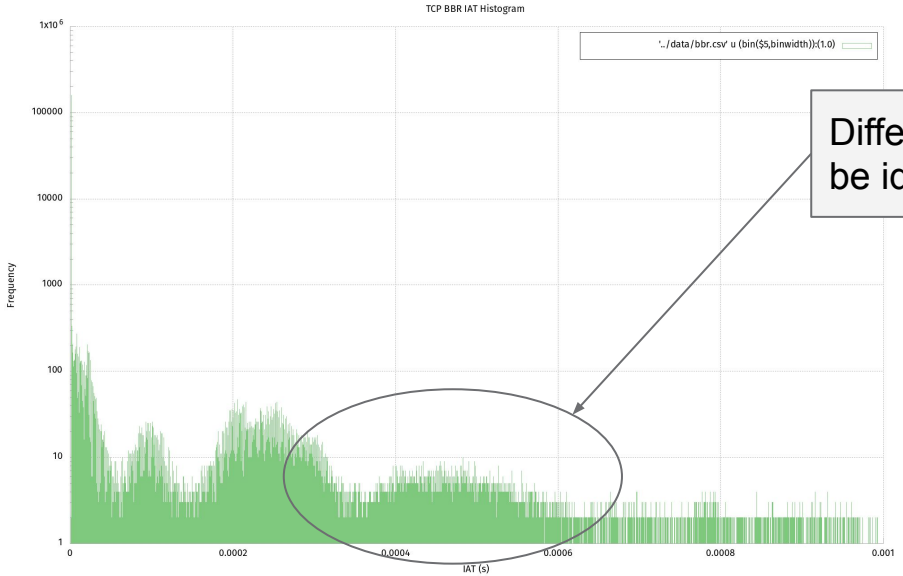
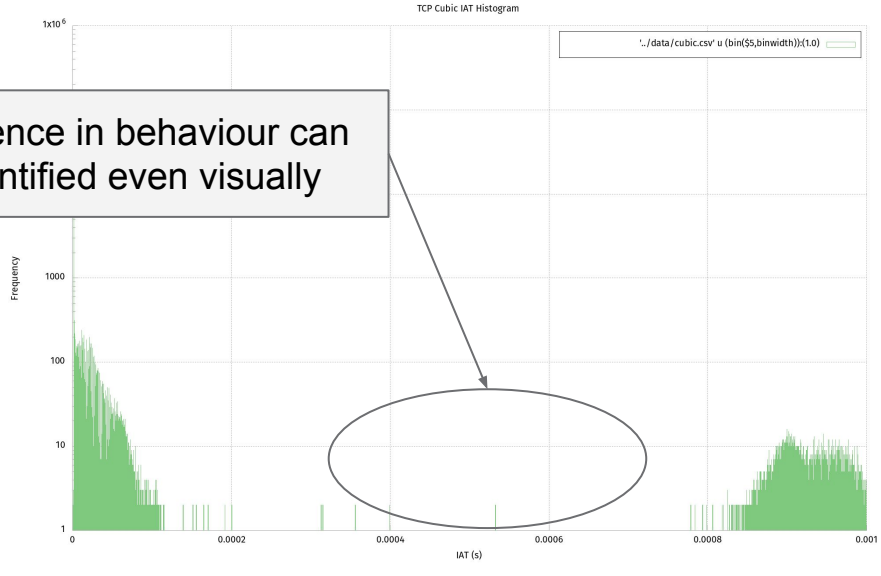
Histogram Aggregation - Inter-Arrival Time



TCP BBR (delay-based)



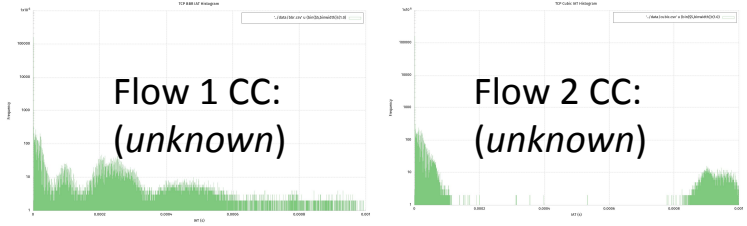
TCP Cubic (loss-based)

Difference in behaviour can be identified even visually

BBR: inter-packet timing is more widespread than other congestion control algorithms.

Machine Learning on Histogram Data

- Aggregated data - such as histograms can be used to tell apart congestion control (CC) used by TCP flows
- We are using data plane histograms of inter-arrival times per flow (2000 packets per histogram)
- ML algorithms explored: Convolutional Neural Networks, k-Nearest Neighbors



Input: per-flow histograms of Inter-Arrival Time (IAT)

Machine Learning
(trained with labeled data)

Inference in less than 1 ms in all cases

Flow 1 CC: most likely *TCP BBR*

Flow 2 CC: most likely *TCP RENO*

More details, dataplane architecture, ML code in:

Simpson, Kyle A., Richard Cziva, and Dimitrios P. Pezaros. "Seiðr: Dataplane Assisted Flow Classification Using ML." IEEE GLOBECOM, Taipei, Taiwan (2020).

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High Touch Application Programming

- High Touch Applications can be implemented using **Kafka Streams** - an easy way to program real-time applications on stream of data.
- Expressive, highly scalable and fault tolerant API that allows: aggregation, filtering, counting, grouping data...


```
int THRES = 10;
KTable<Windowed<String>, Long> SYNcounts = stream
      .filter((k, telemetry) -> telemetry.isSYN())
      .groupBy((k, telemetry) -> telemetry.getIPDstAddr())
      .windowedBy(TimeWindows.of(Duration.ofSeconds(5)))
      .count(Materialized.with(String(), Long()))
      .filter((key, value) -> value > THRES);
SYNcounts.toStream().to("syn-attacks");
```

Example: High Touch SYN Flood Detection

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Conclusion

- We are processing millions of telemetry messages per second
- Data ingest is handled by **Fastcapa-ng**, an ESnet DPDK + Kafka project
  - Multi-stage, multi-pipeline architecture with easy configurability
  - Executes stateful functions: sampling, histogram creation, etc.
  - We can push 15M telemetry messages to Kafka with a single server
- Histogram data: important aggregation option - TCP CC detection
- Kafka streams: high-level application programming on telemetry streams

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Questions…

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