

PIQ: Persistent Interactive Queries for Network Security Analytics

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John Sonchack
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Boulder

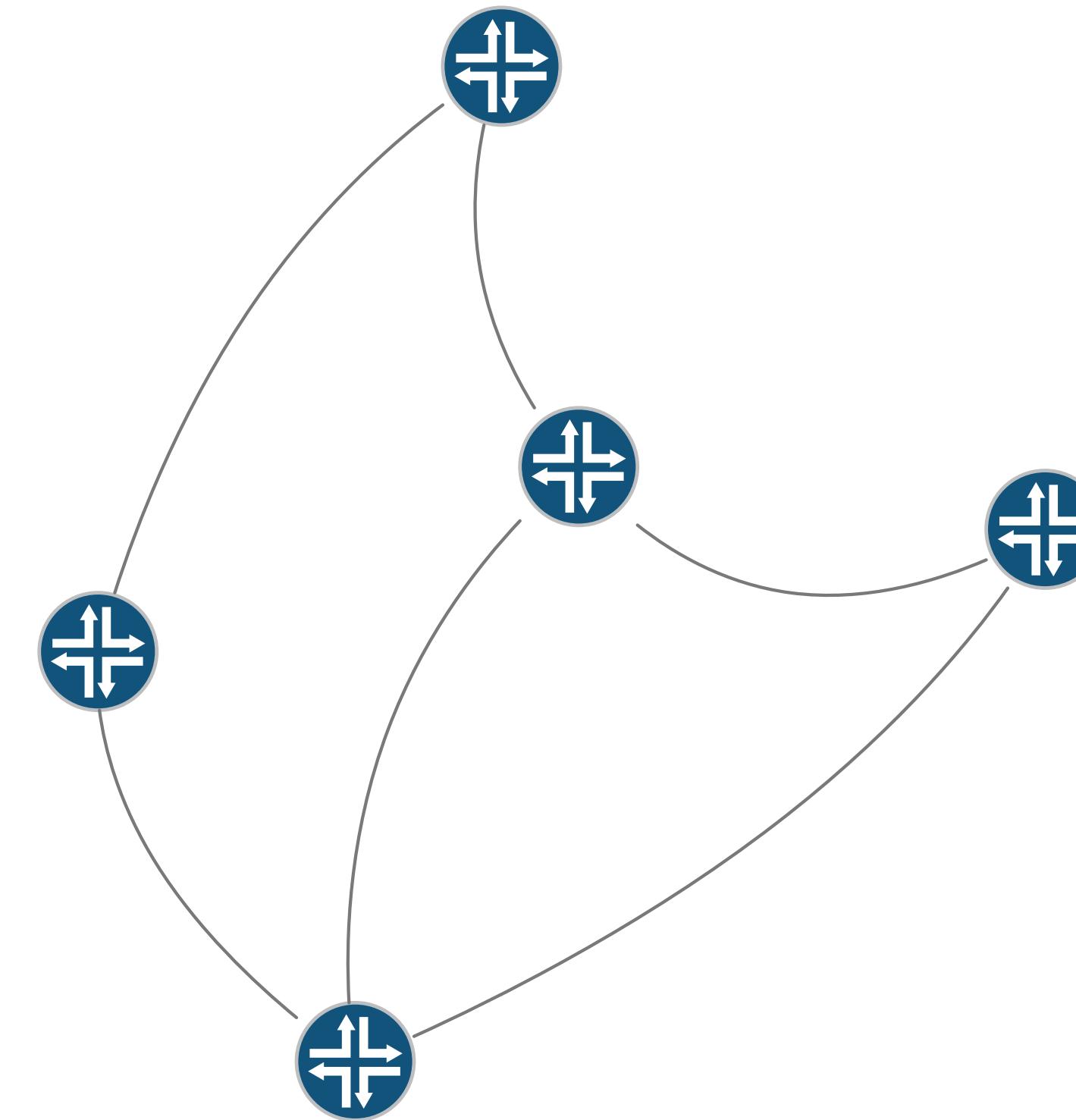


Network Monitoring is important

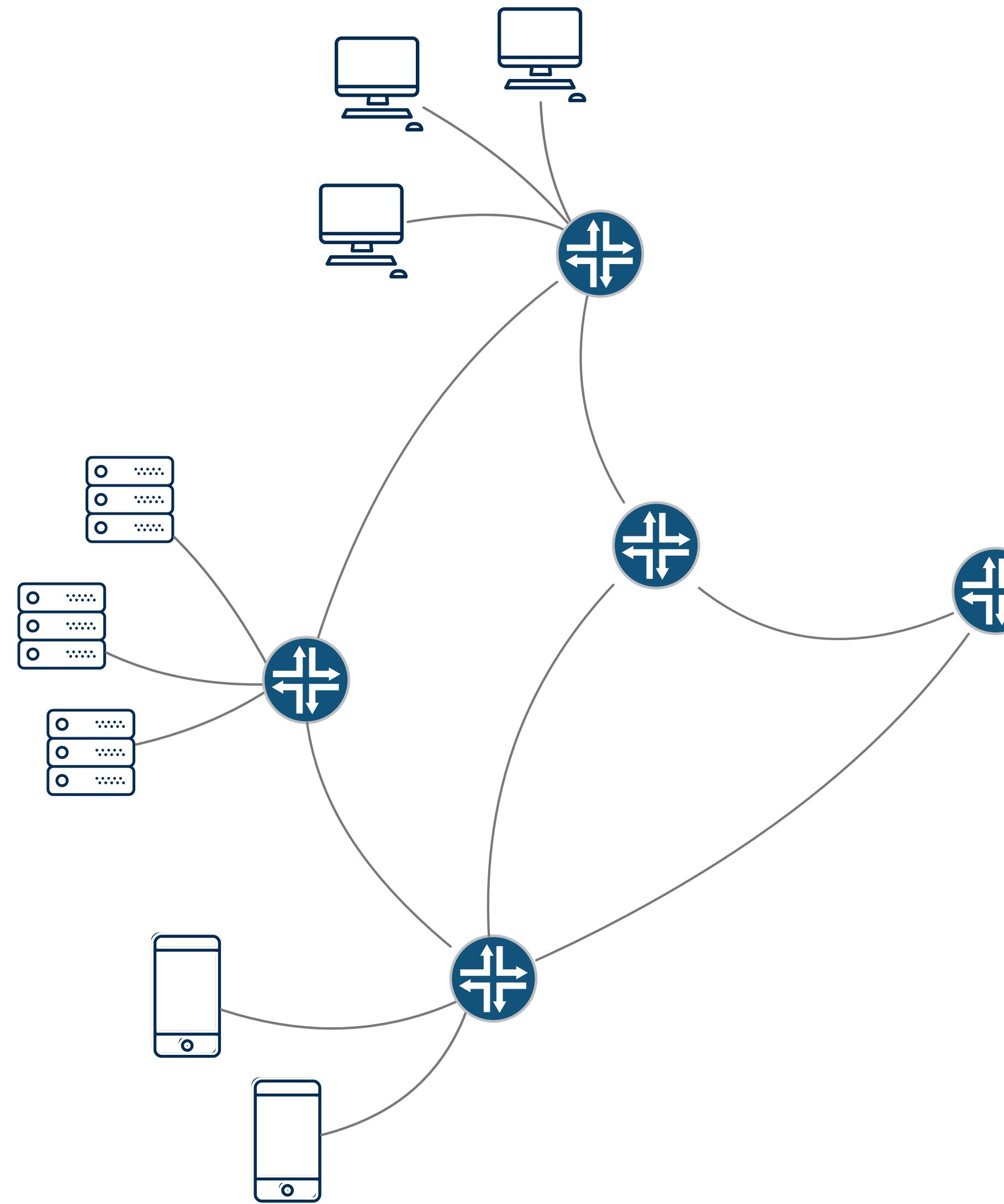
- Security issues
- Performance issues
- Equipment failure
- Misconfiguration



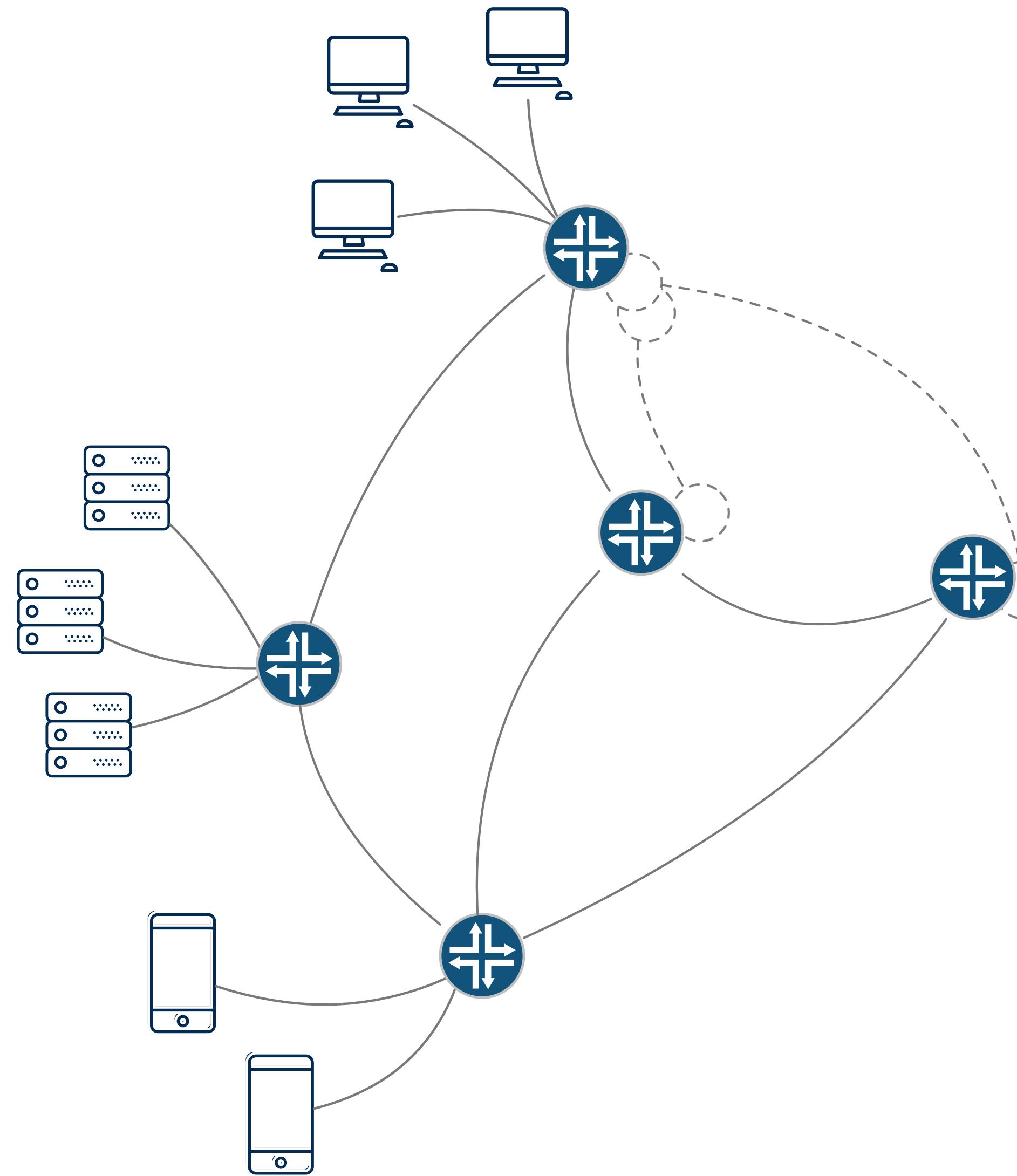
Today's networks are larger and more complex than ever before



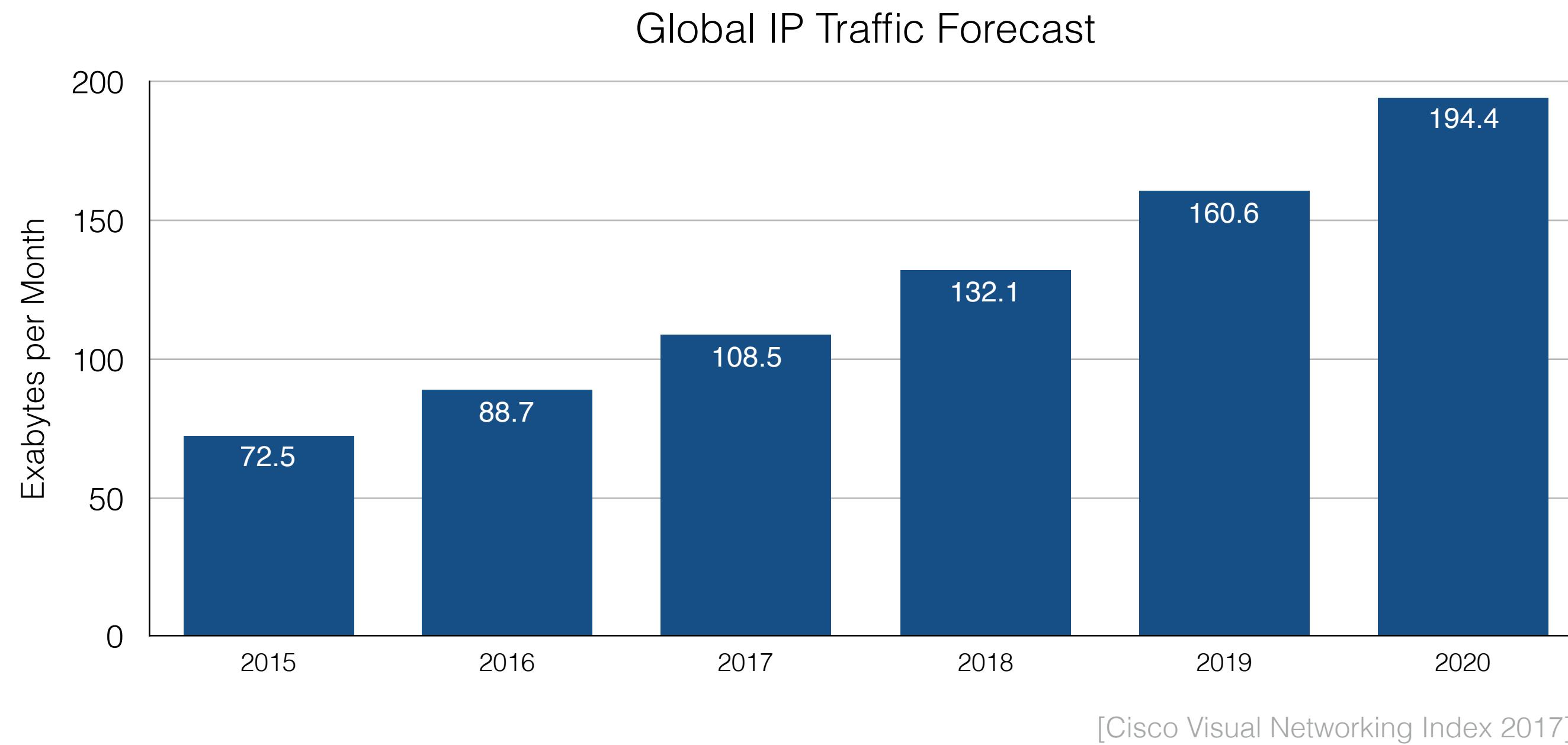
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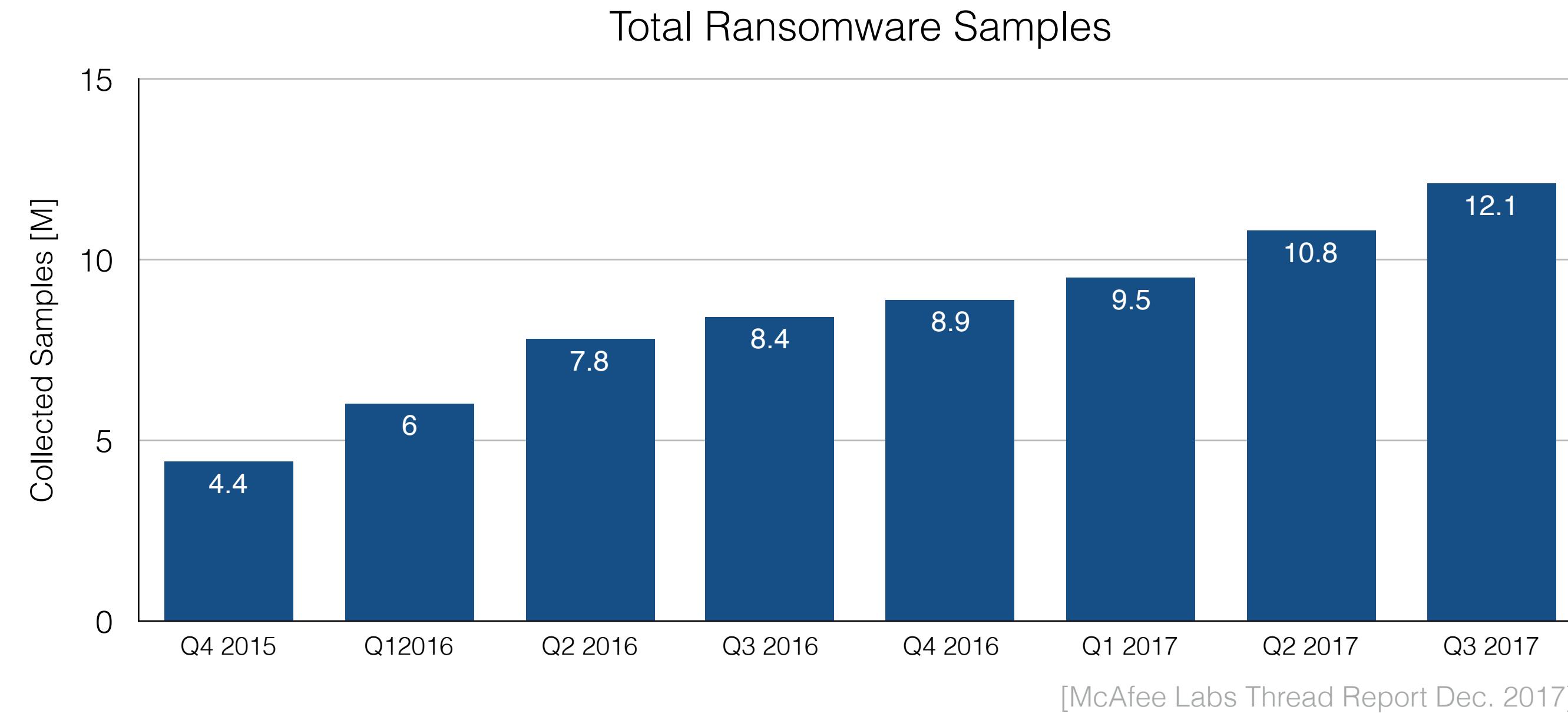
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Network Threats grow rapidly

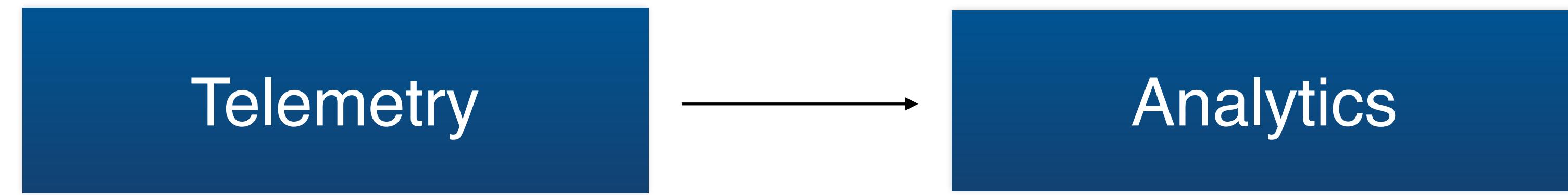


Passive Monitoring

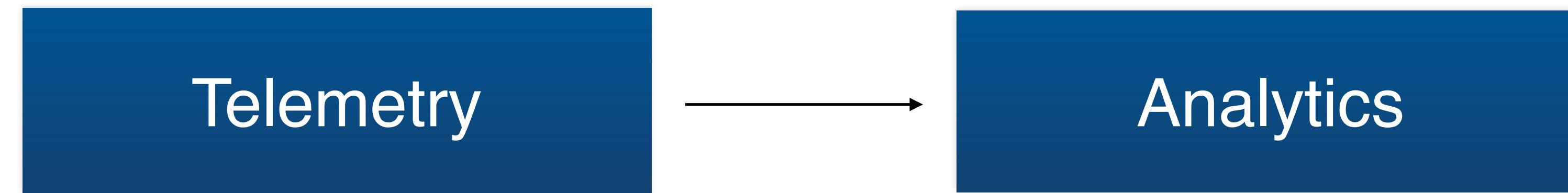
Passive Monitoring

Telemetry

Passive Monitoring



Passive Monitoring

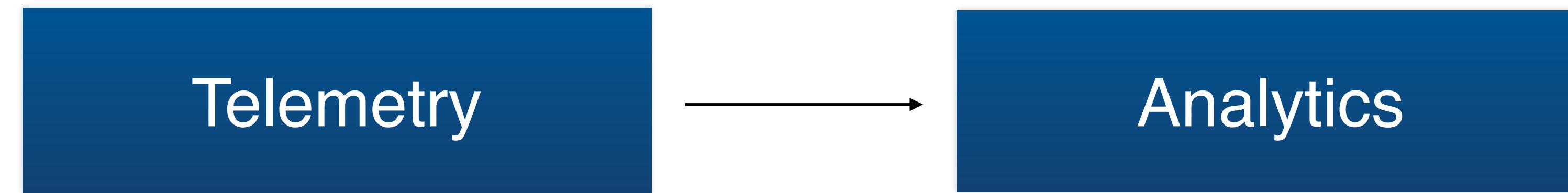


[UnivMon, SIGCOMM '16]

[Marple, SIGCOMM '17]

[*Flow, ATC '18]

Passive Monitoring



[UnivMon, SIGCOMM '16]

[Marple, SIGCOMM '17]

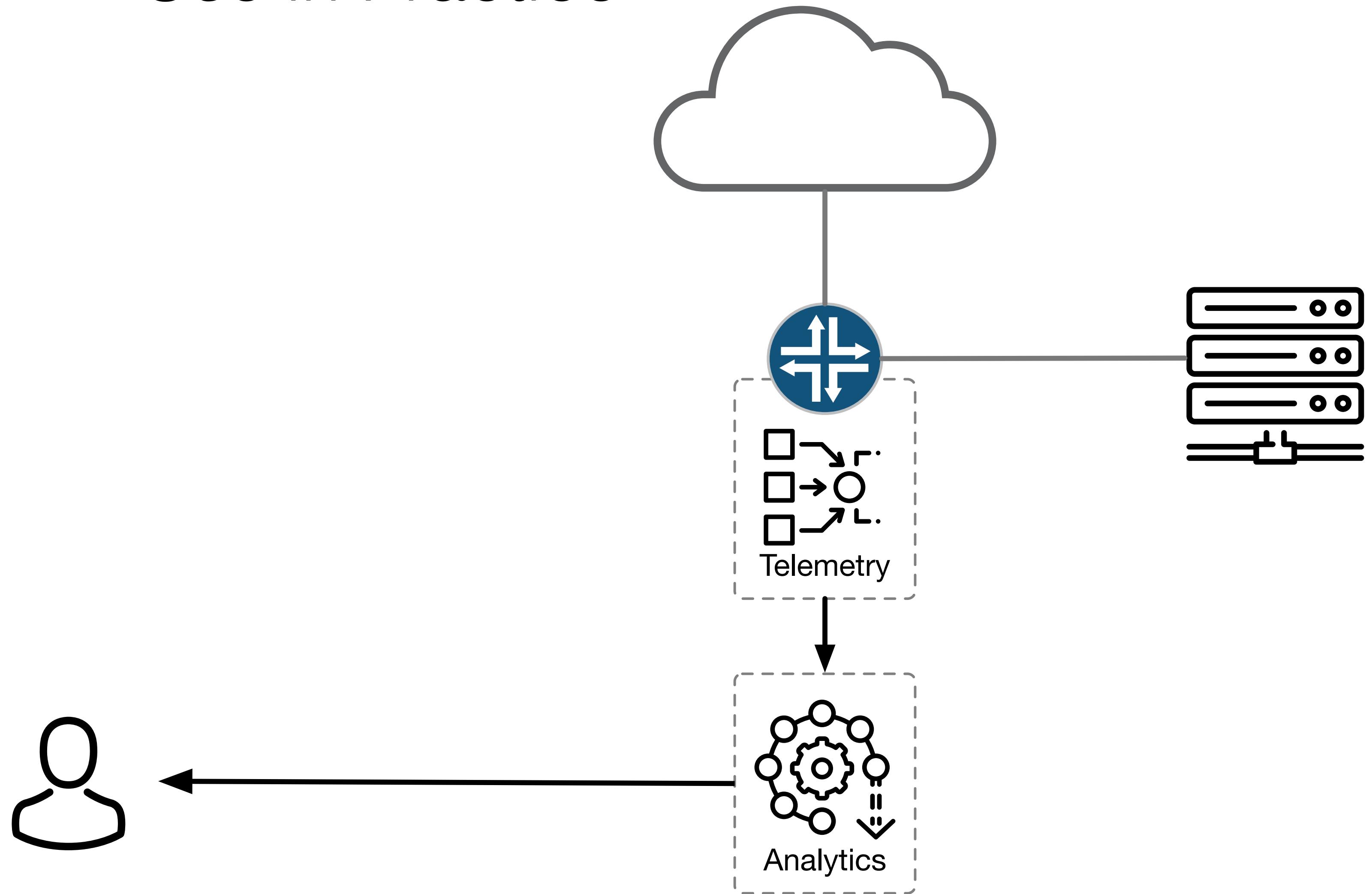
[*Flow, ATC '18]

[NetQRE, SIGCOMM '17]

[Jetstream, HotCloud '18]

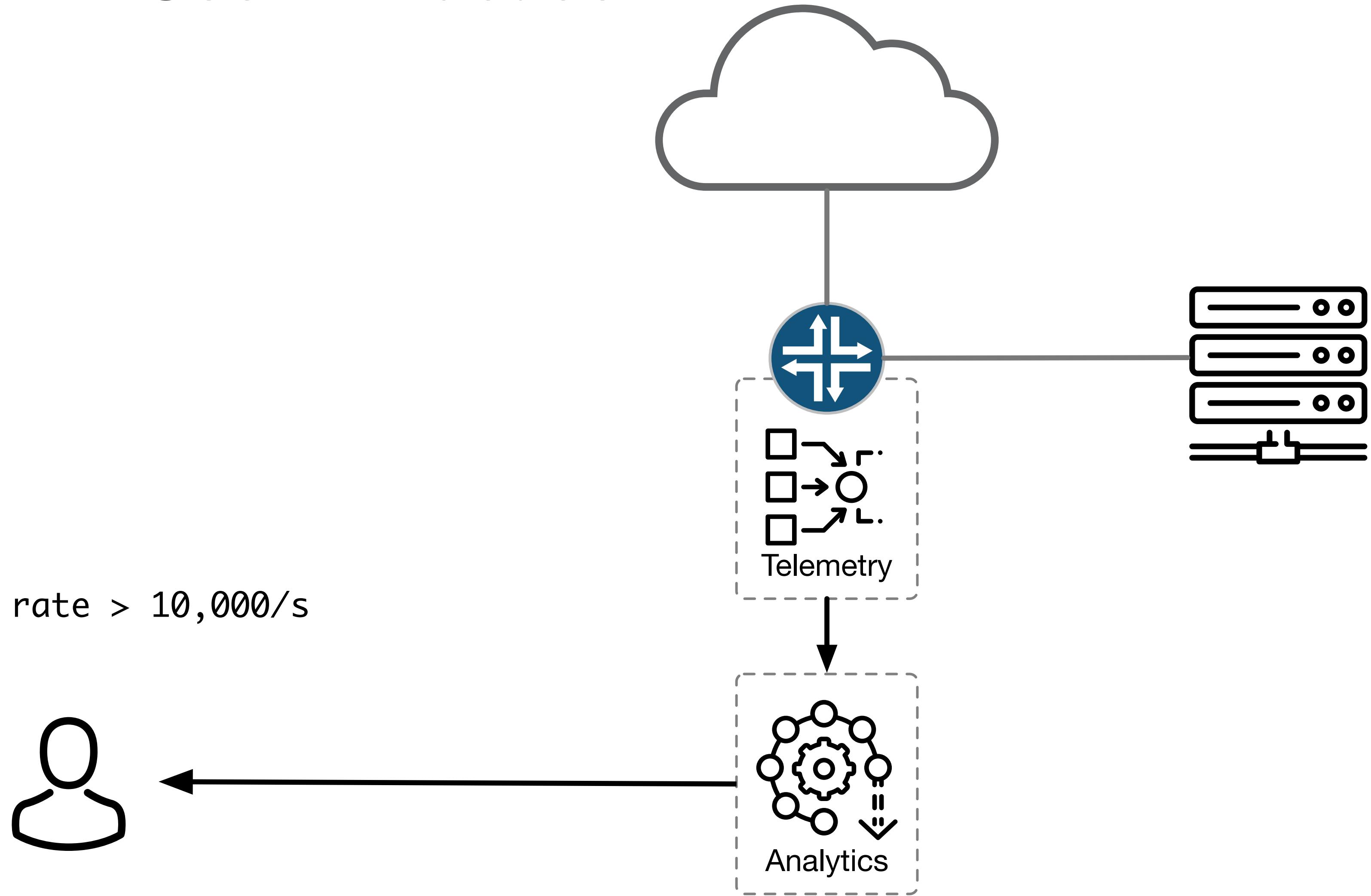
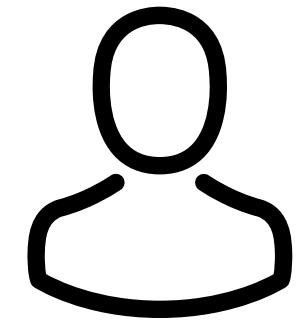
[Sonata, SIGCOMM '18]

Use in Practice

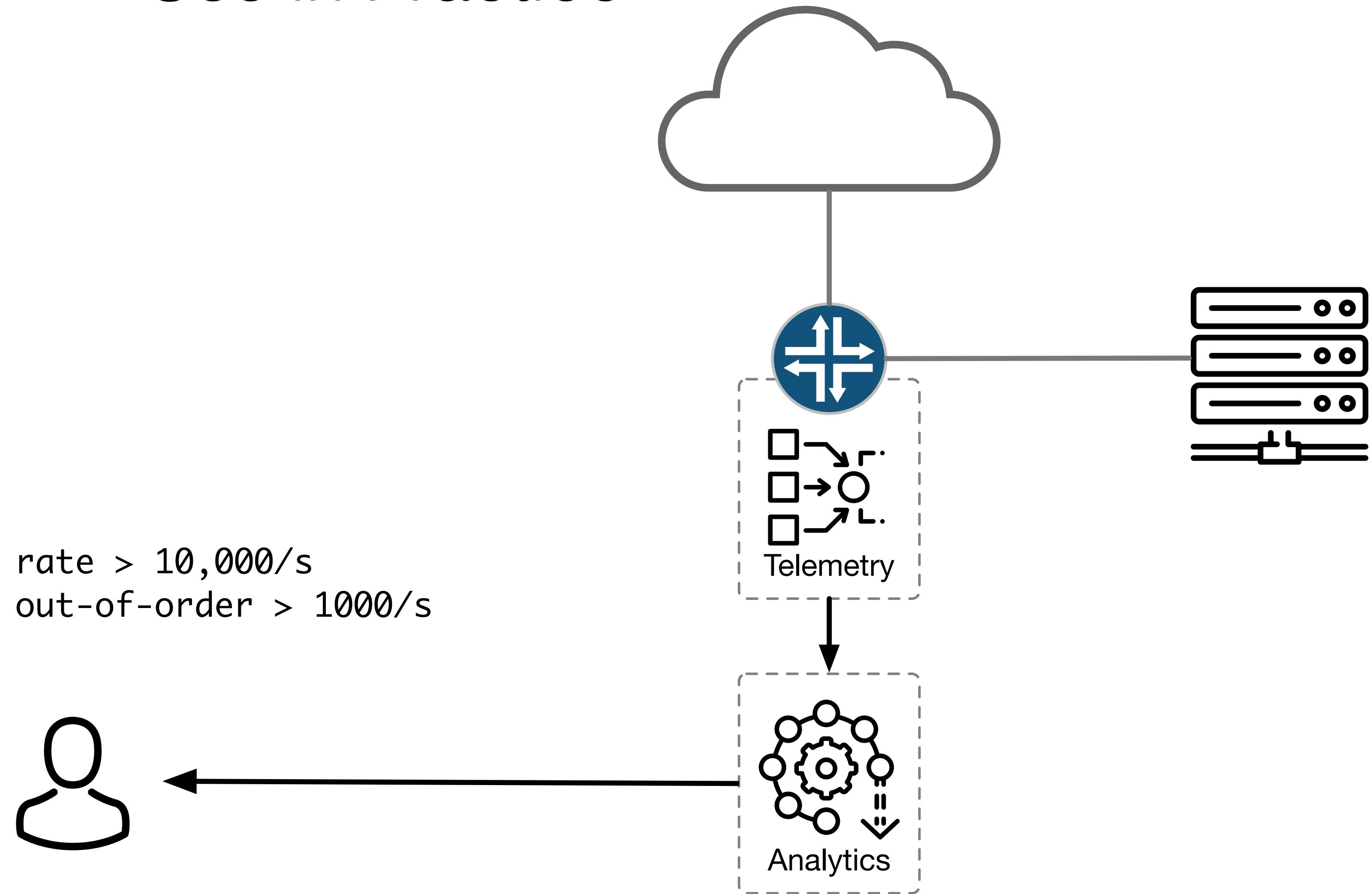


Use in Practice

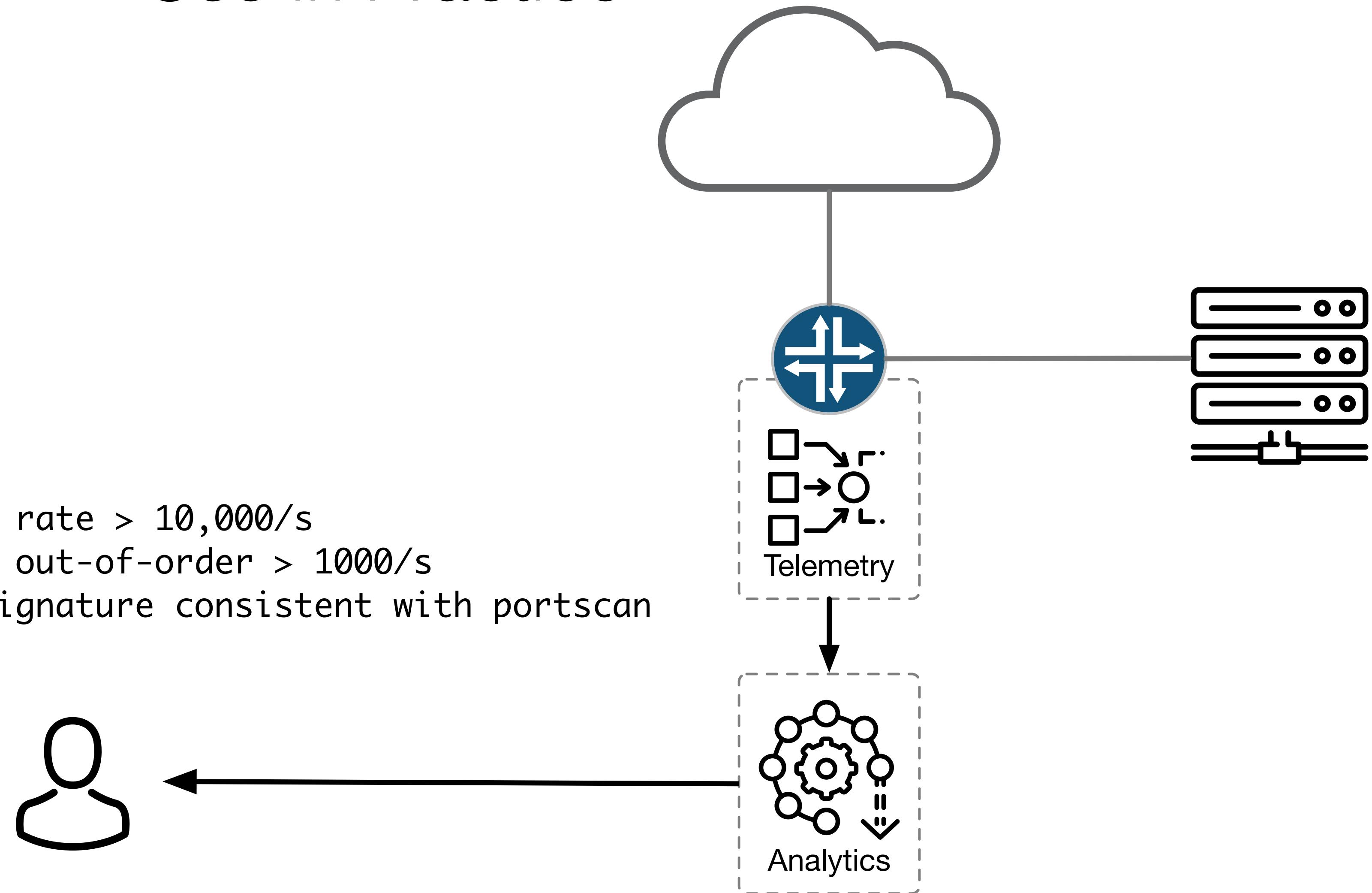
[ip.src == 10.12.13.14] pkt rate > 10,000/s



Use in Practice

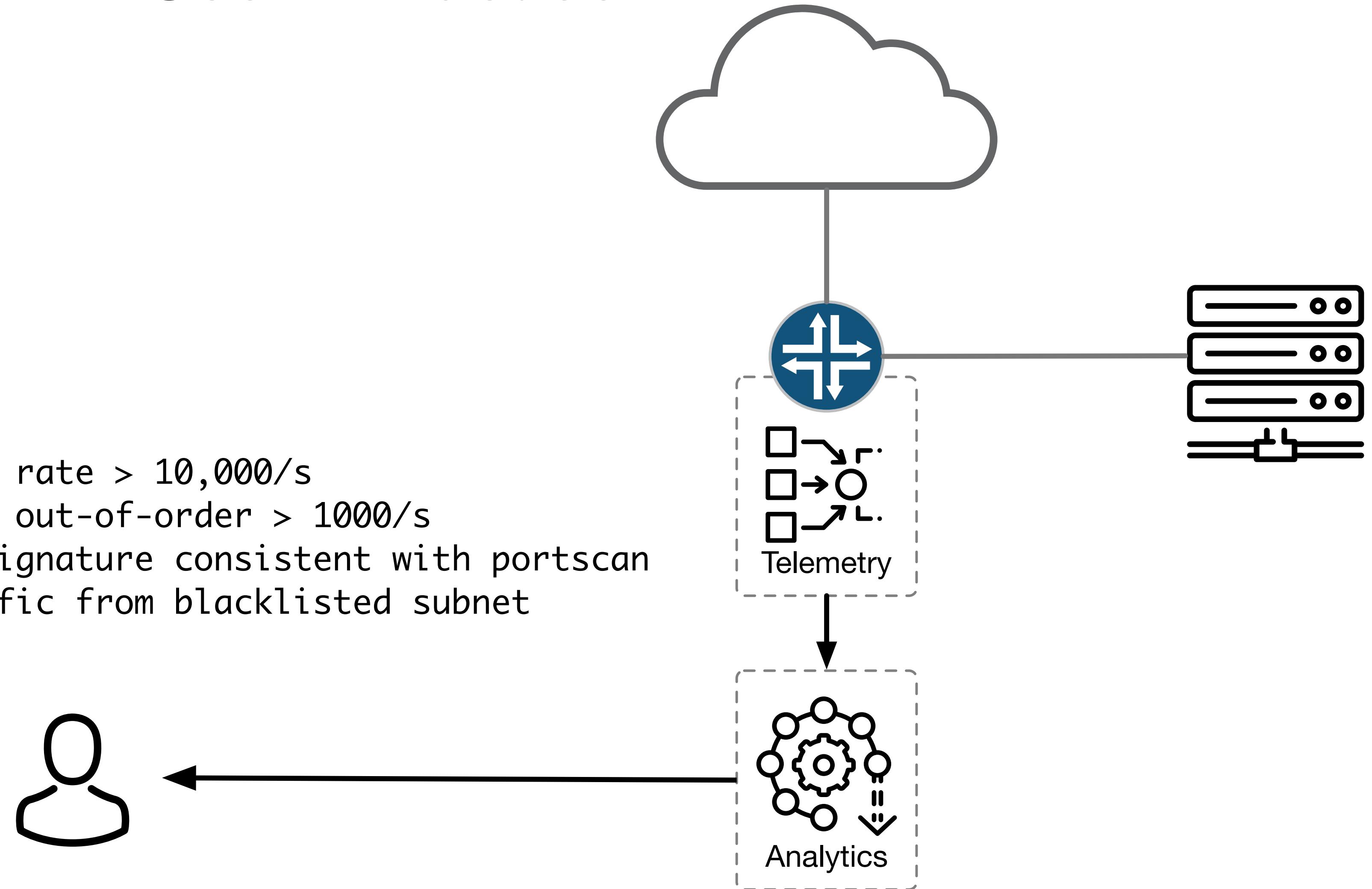


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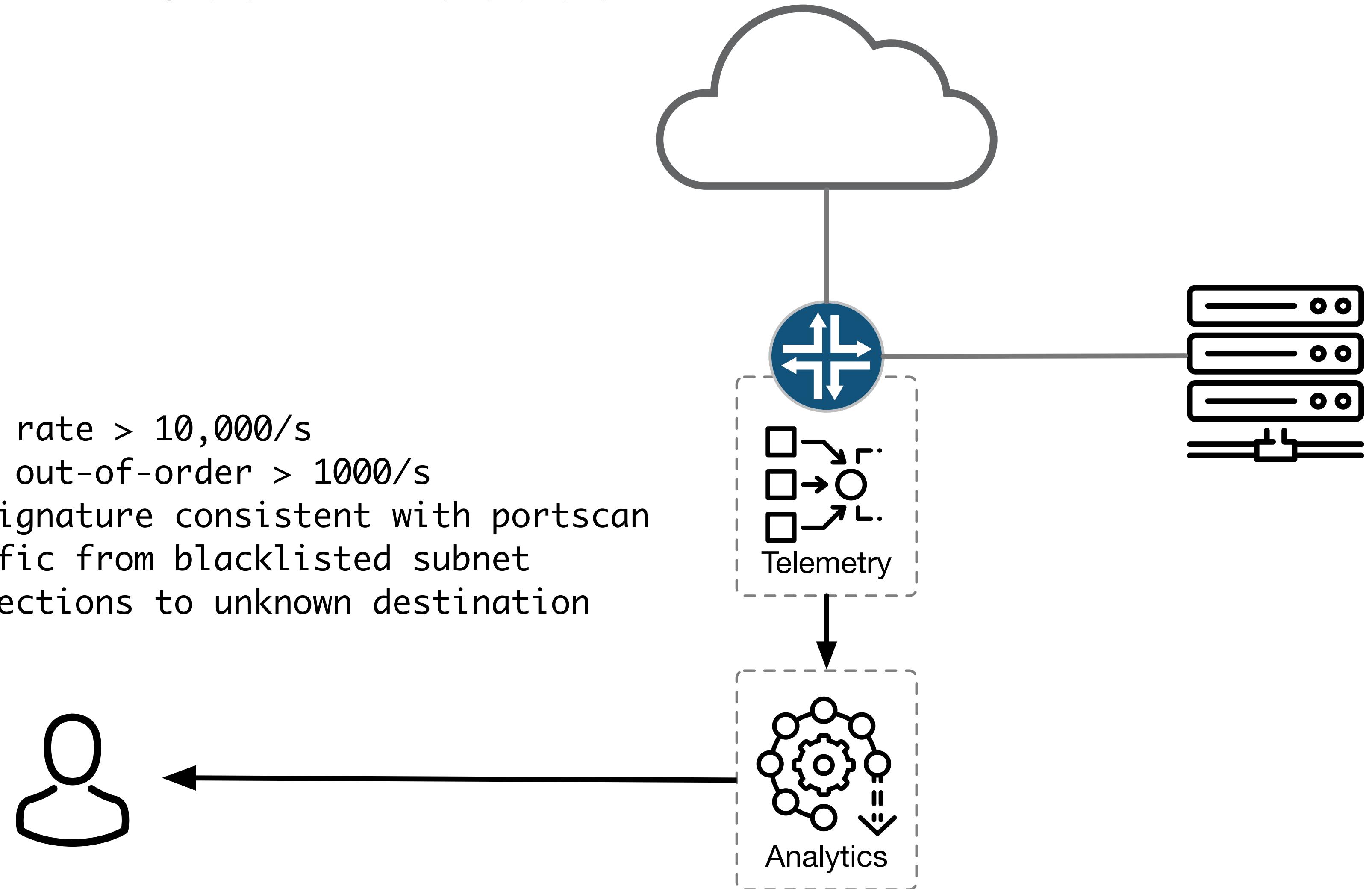
Use in Practice

```
[ip.src == 10.12.13.14] pkt rate > 10,000/s  
[ip.dst == 10.12.13.14] tcp out-of-order > 1000/s  
[ip.src == 239.232.230.2] signature consistent with portscan  
[ip.src == 123.123/24] traffic from blacklisted subnet
```



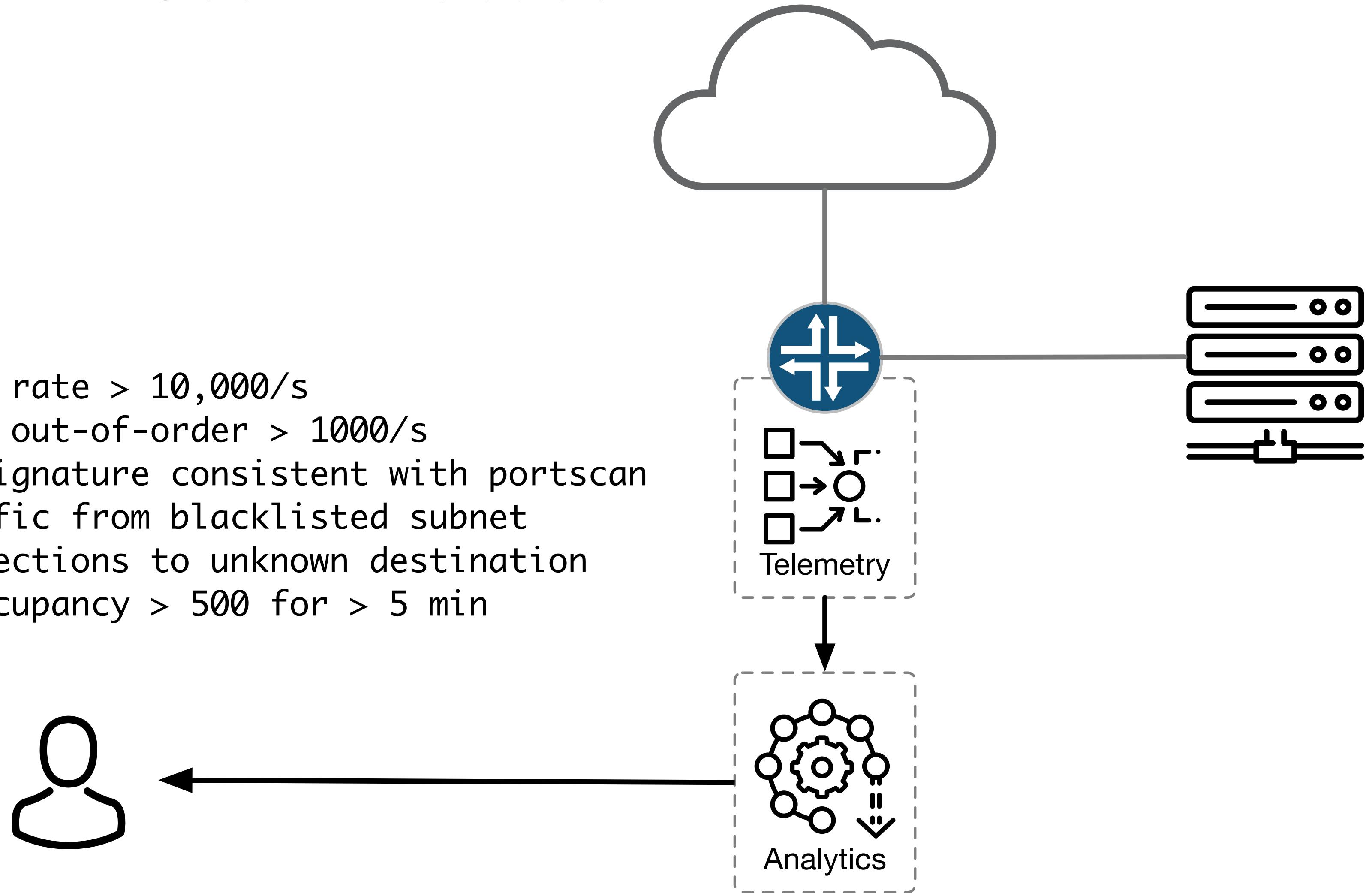
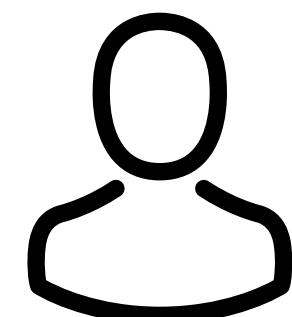
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Use in Practice

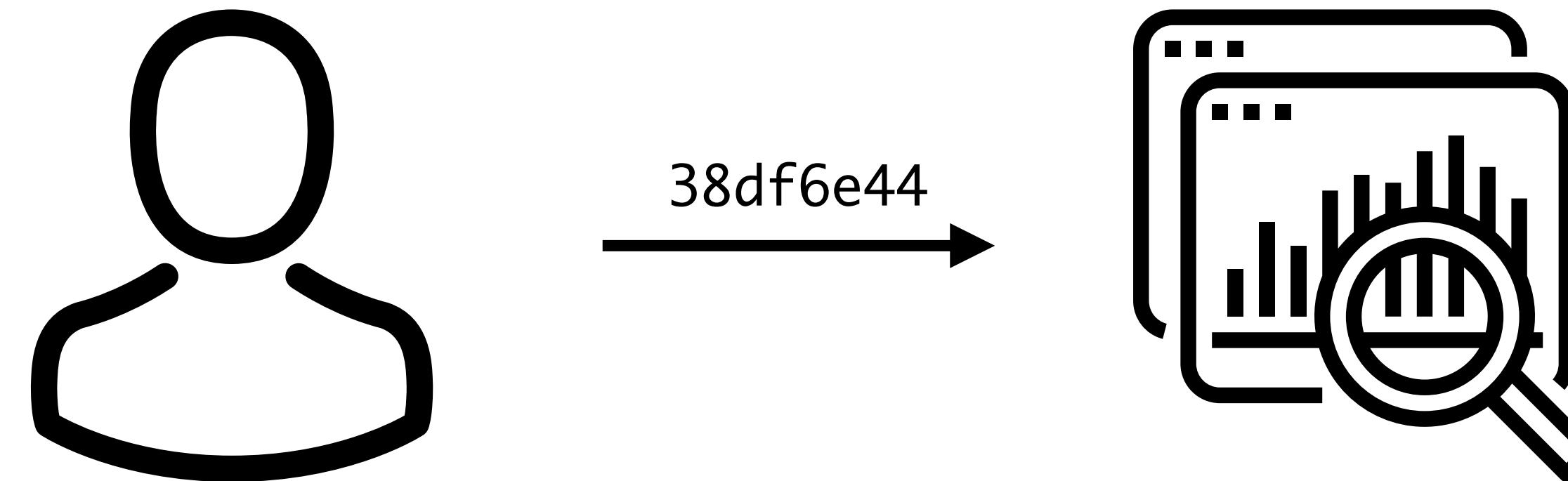
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- ↳ incident id: 38df6e44

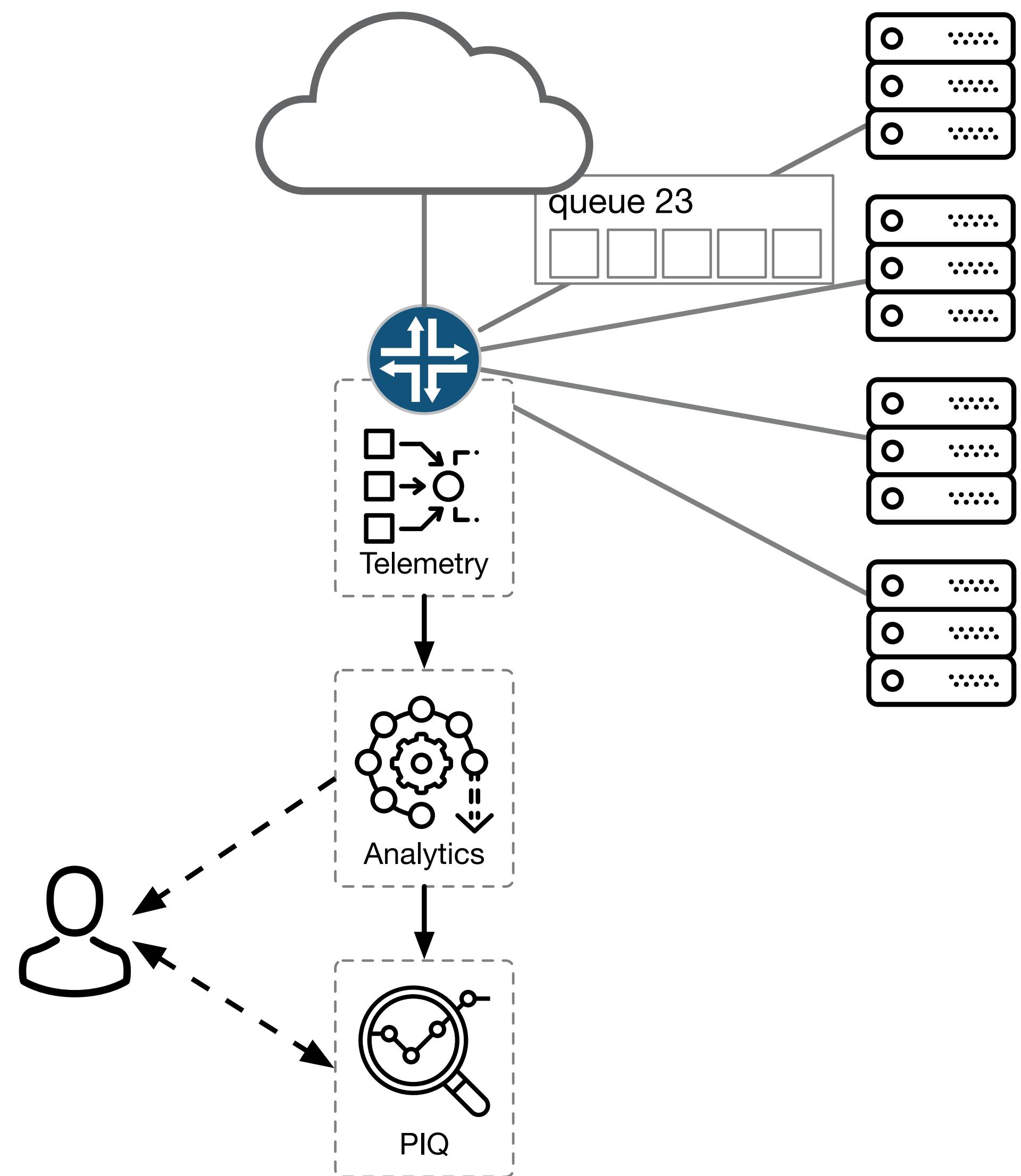
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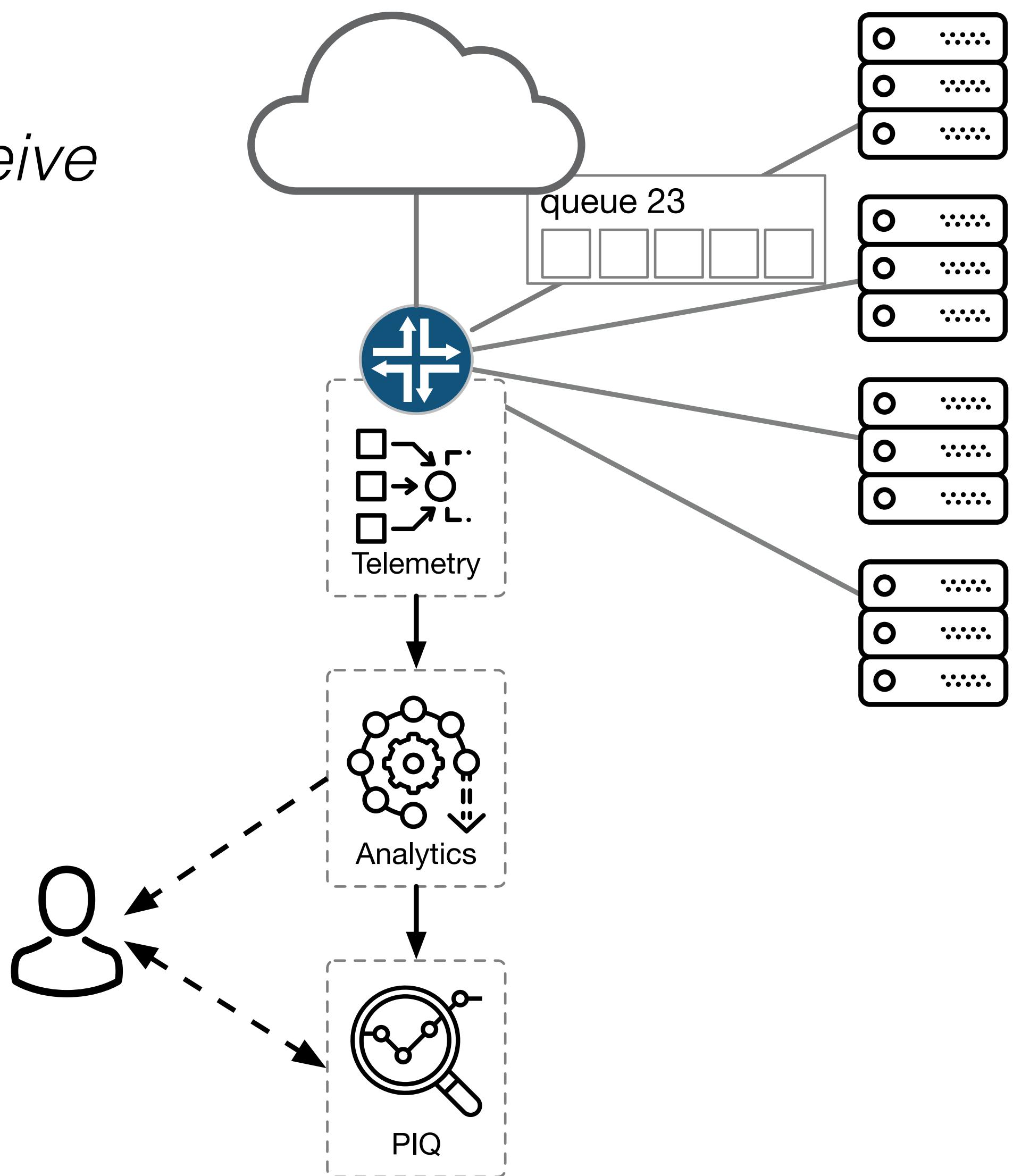


Retrospective Network Queries



Retrospective Network Queries

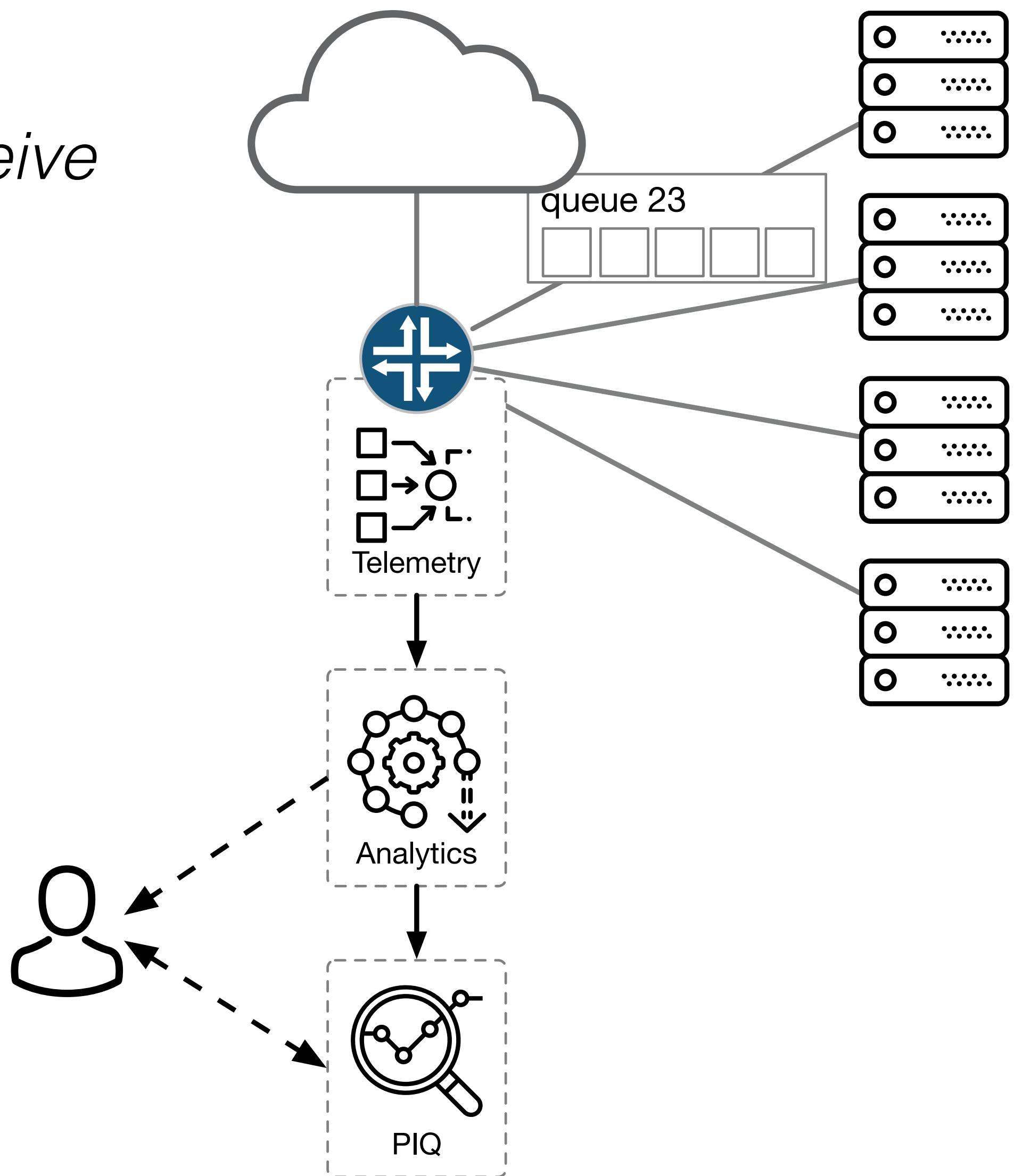
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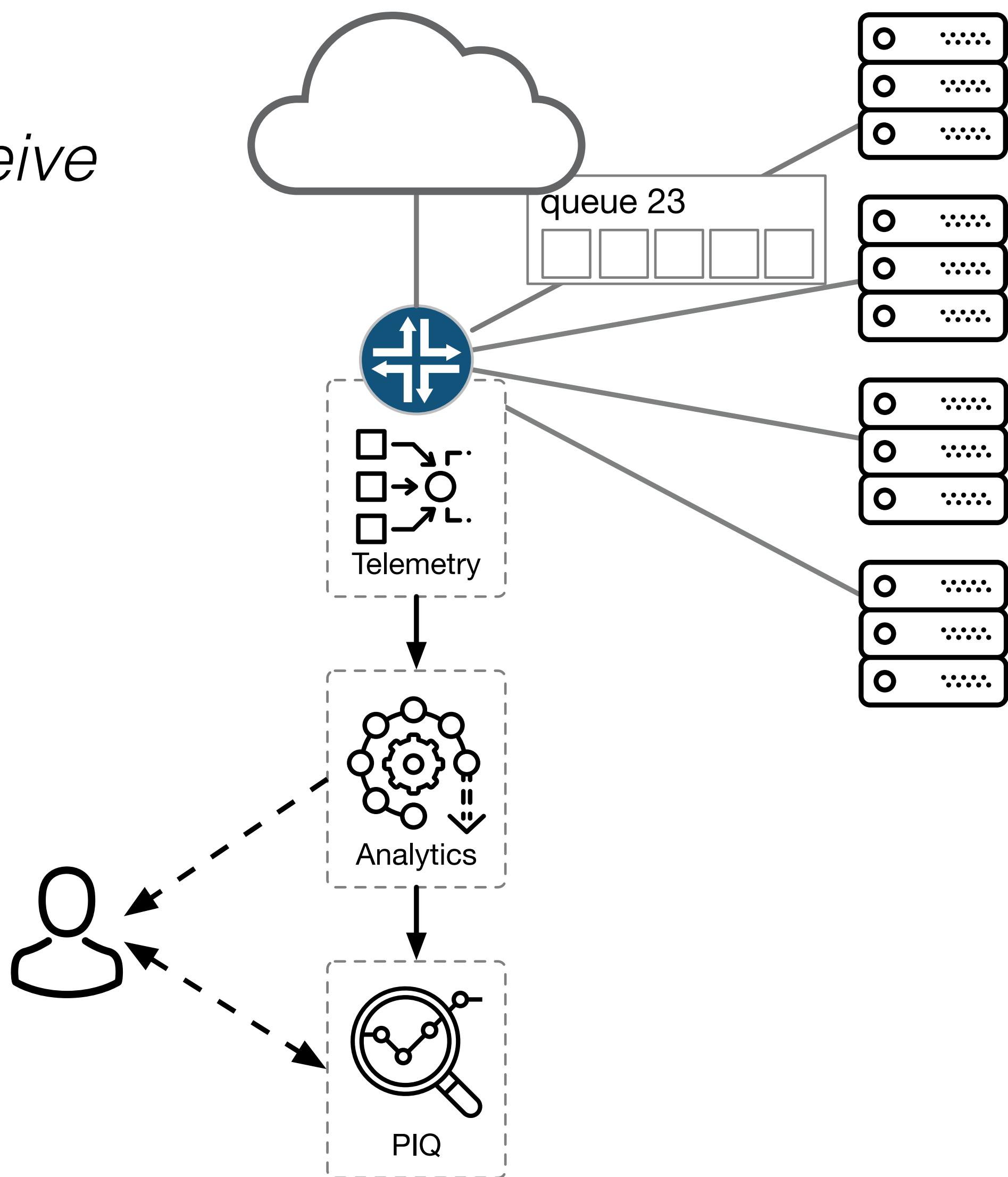
- “show me sample 38df6e44”
 - traffic looks normal



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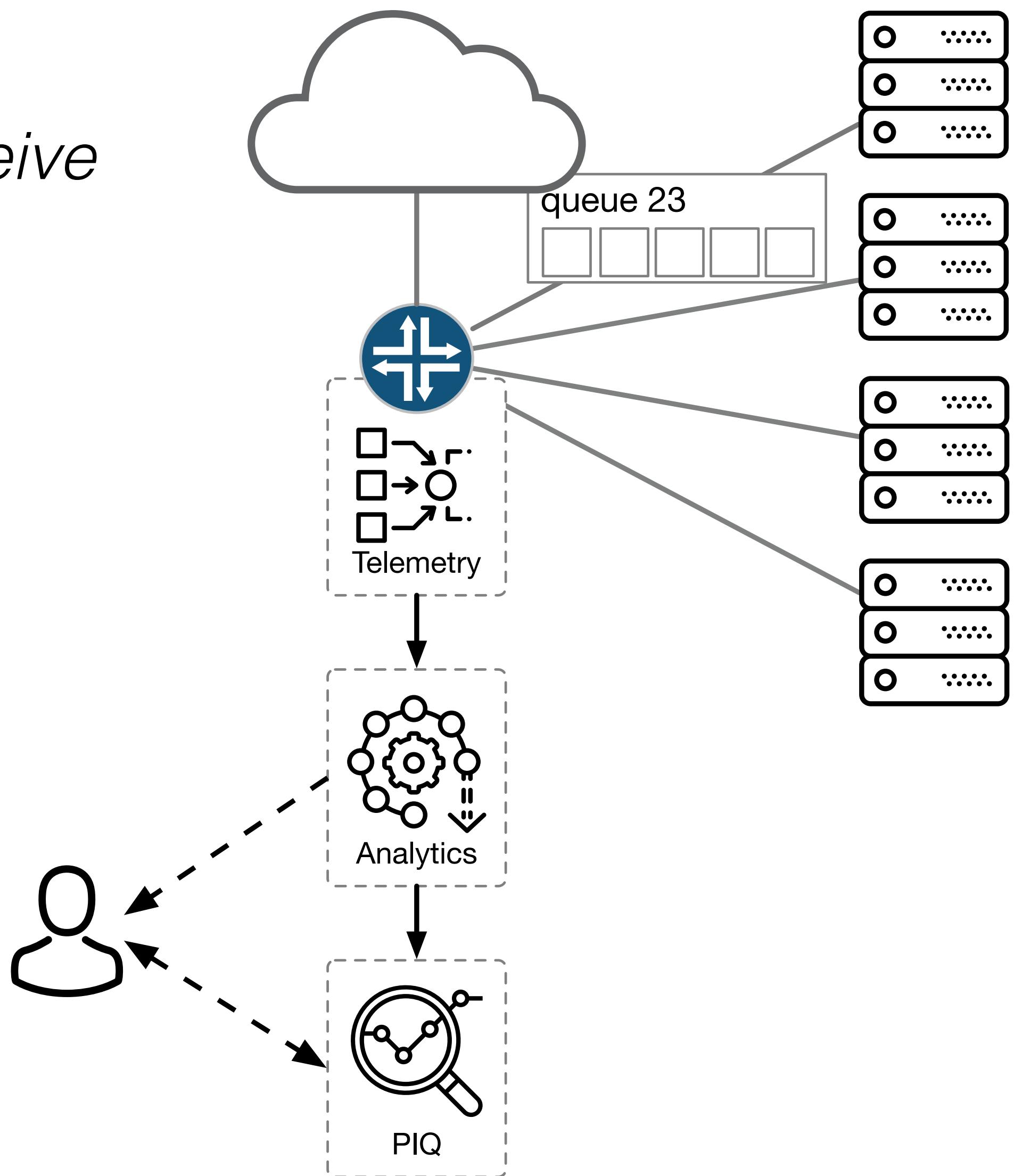
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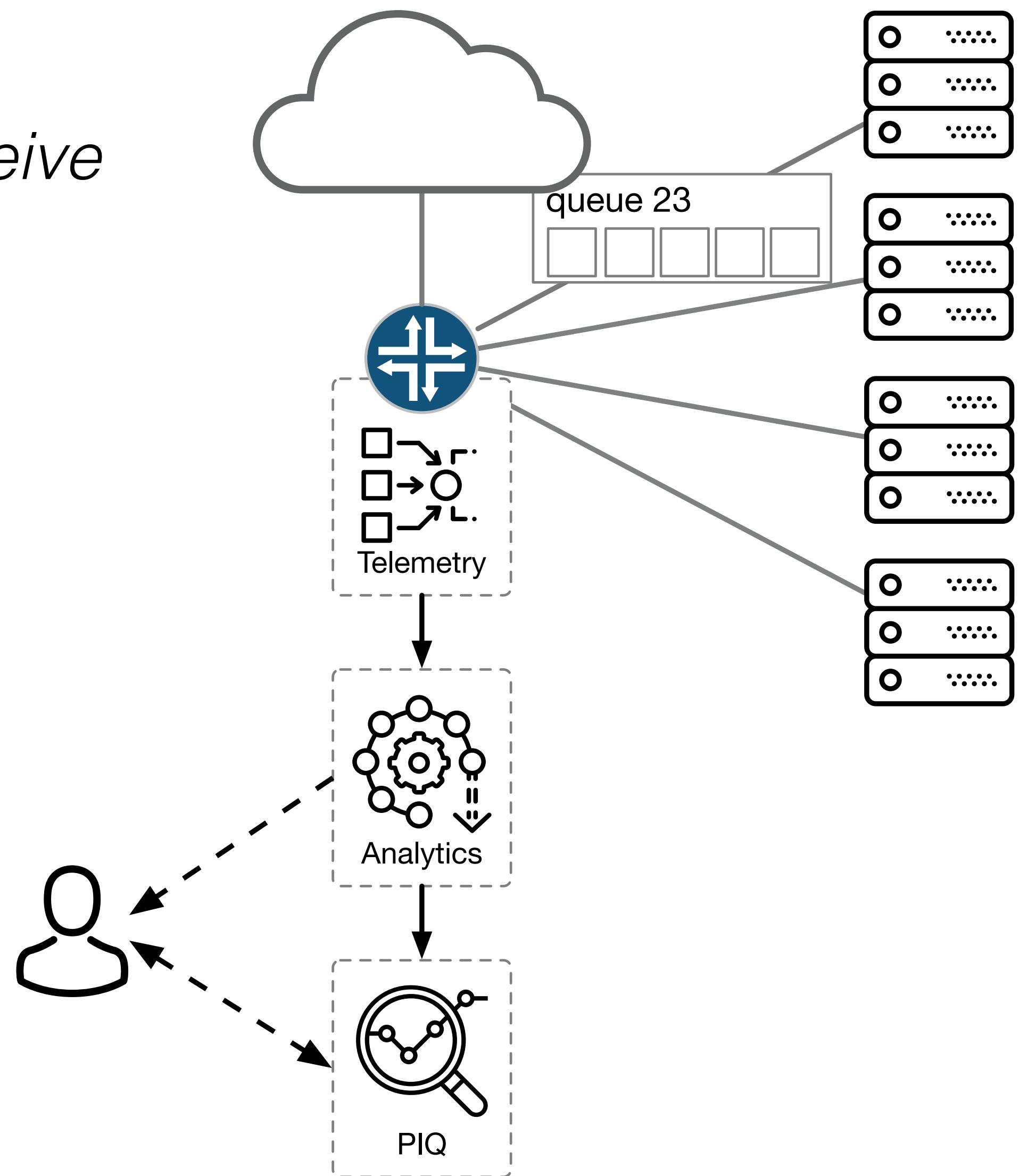
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 - queues 24, 25, and 26



Retrospective Network Queries

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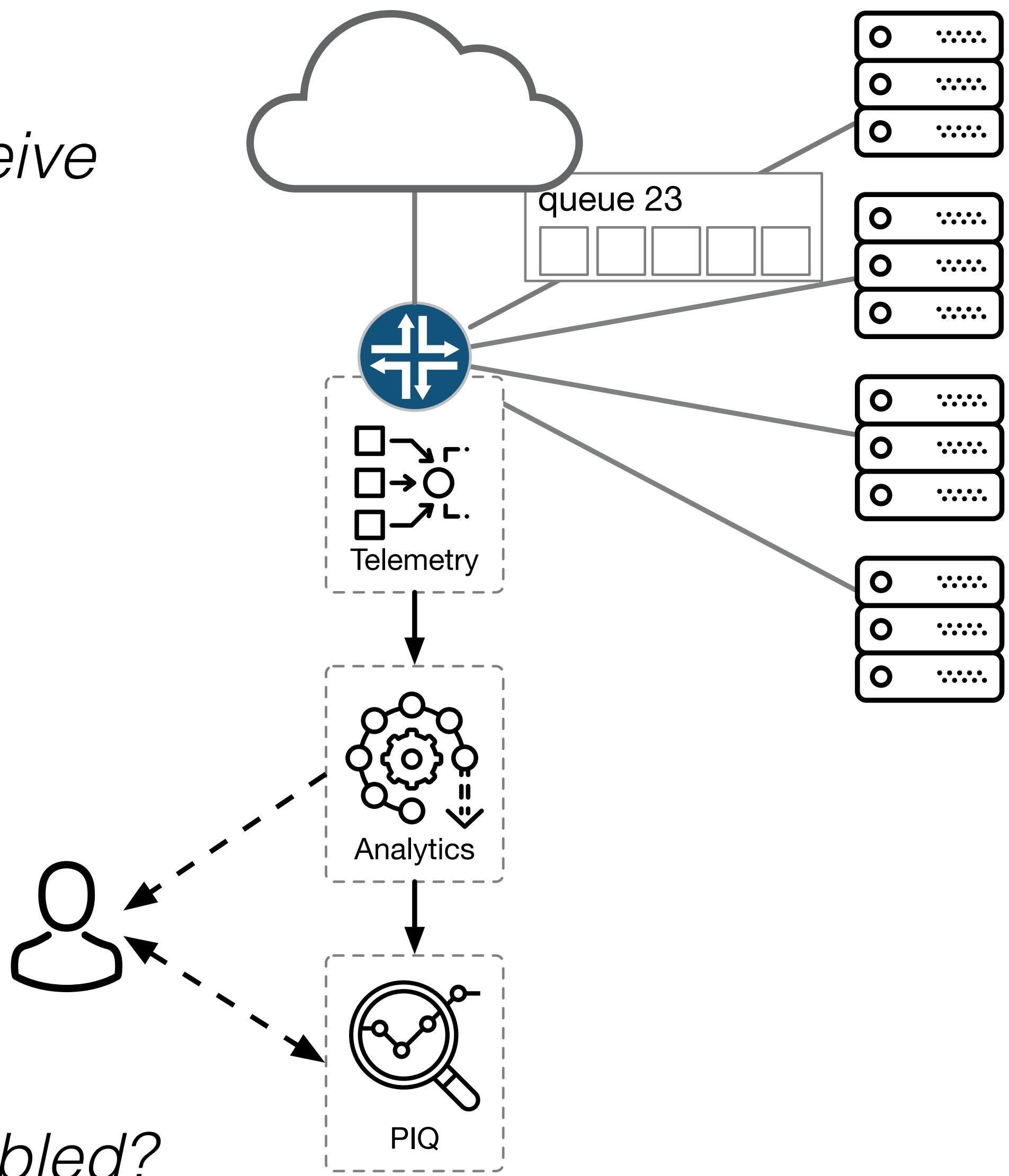
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- “show me traffic in queues 24, 25, 26 at 2018-11-28 15:23:12.023112”
 - only control traffic



Retrospective Network Queries

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- “show me sample 38df6e44”
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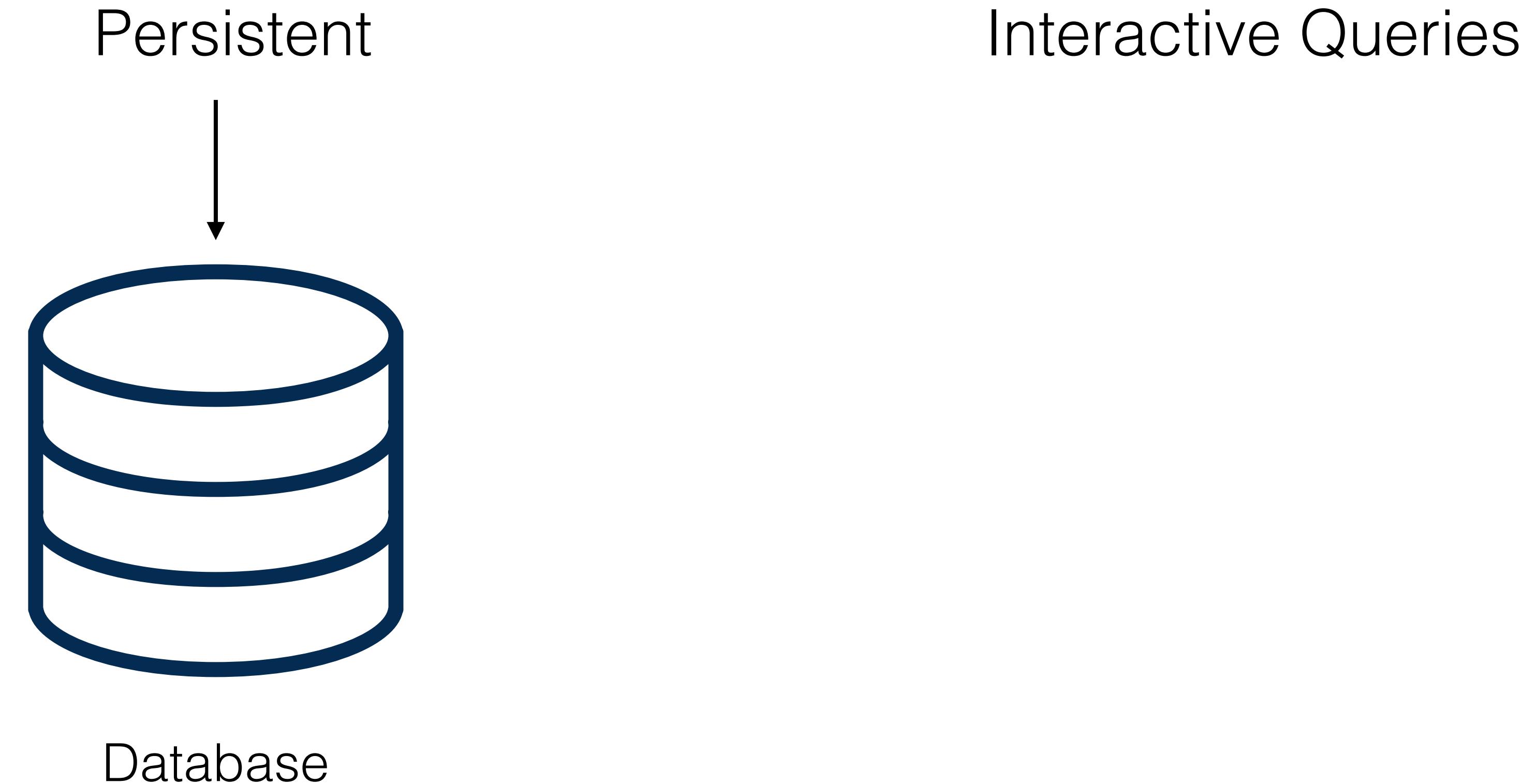
Problem with Hashing? Other queues in group disabled?

Retrospective Network Queries

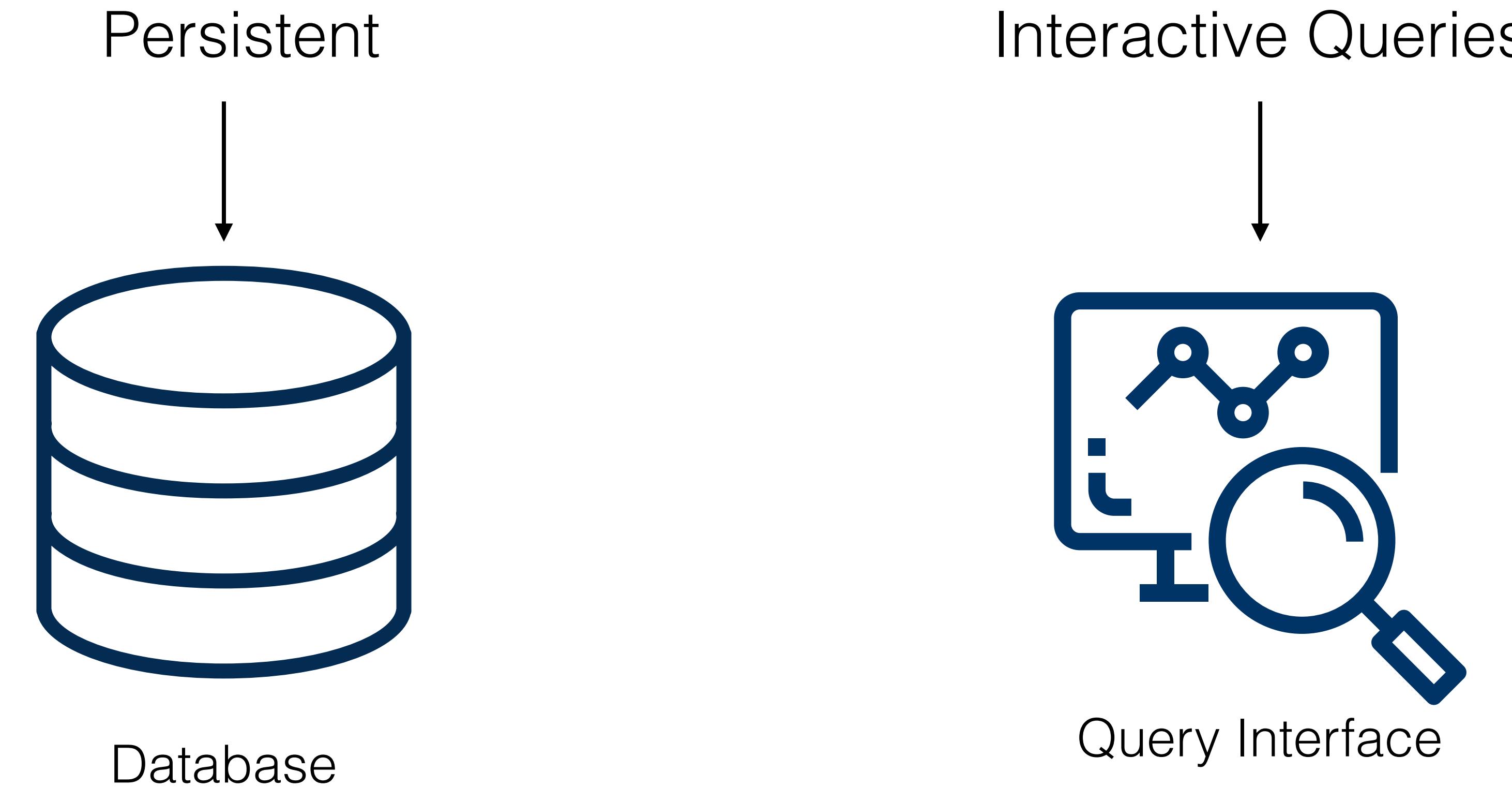
Persistent

Interactive Queries

Retrospective Network Queries



Retrospective Network Queries



Retrospective Network Queries



1. Storing Network Records
2. Injecting Records into a Database
3. Querying the Database

Grouped Packet Vectors

[Sonchack et.al. *Flow, USENIX ATC 2019]

- per-packet header fields
- meta data: *e.g.*, queue depth, ingress/egress timestamps

aggregation keys

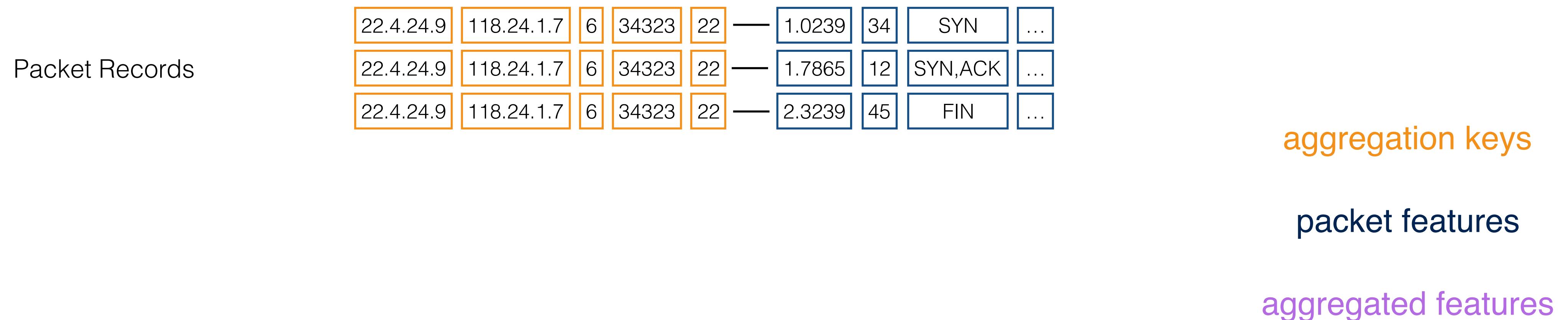
packet features

aggregated features

Grouped Packet Vectors

[Sonchack et.al. *Flow, USENIX ATC 2019]

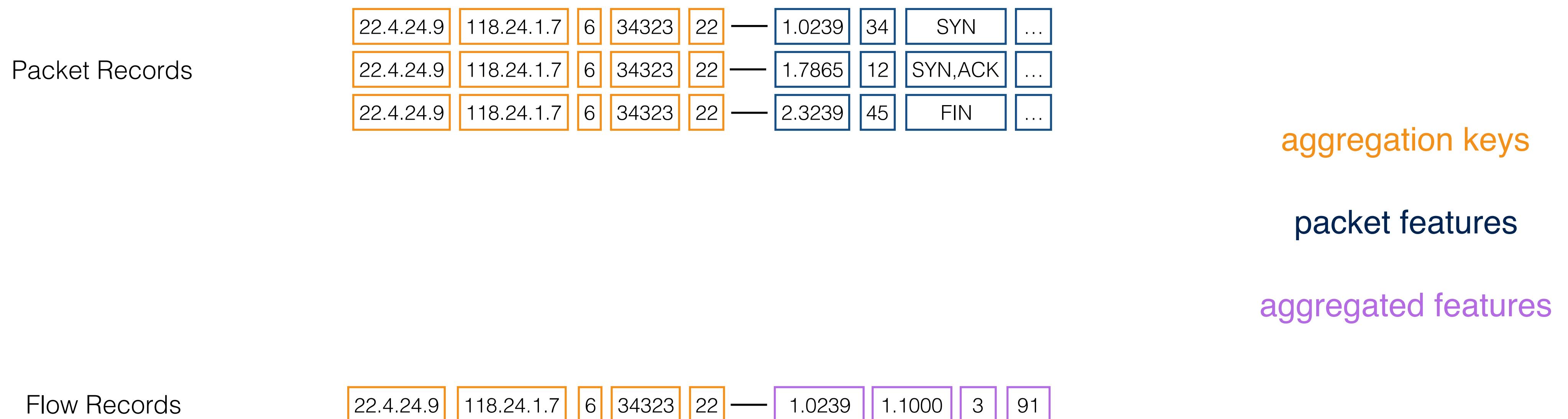
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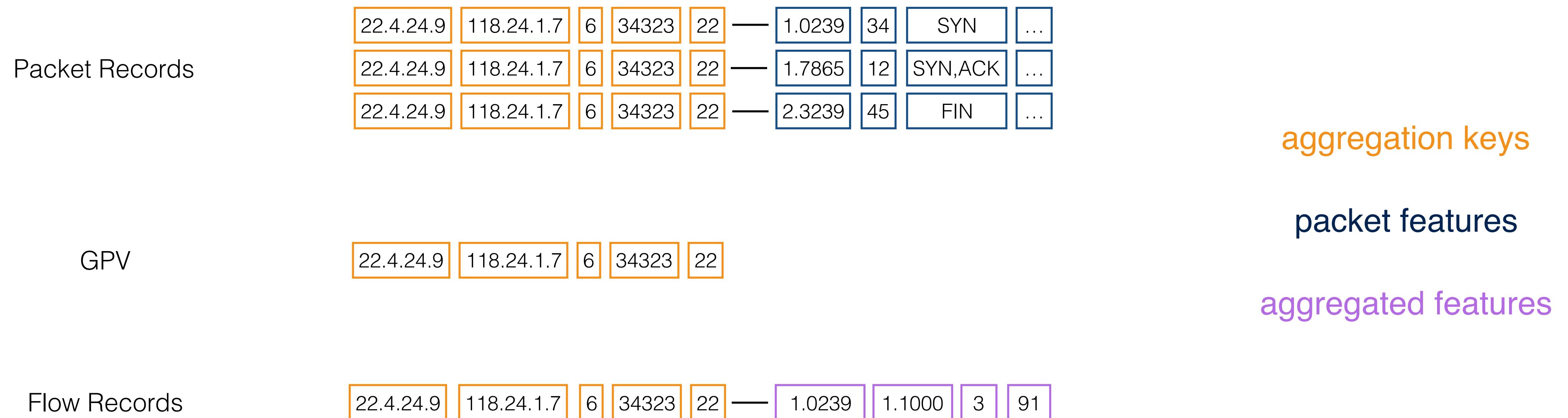
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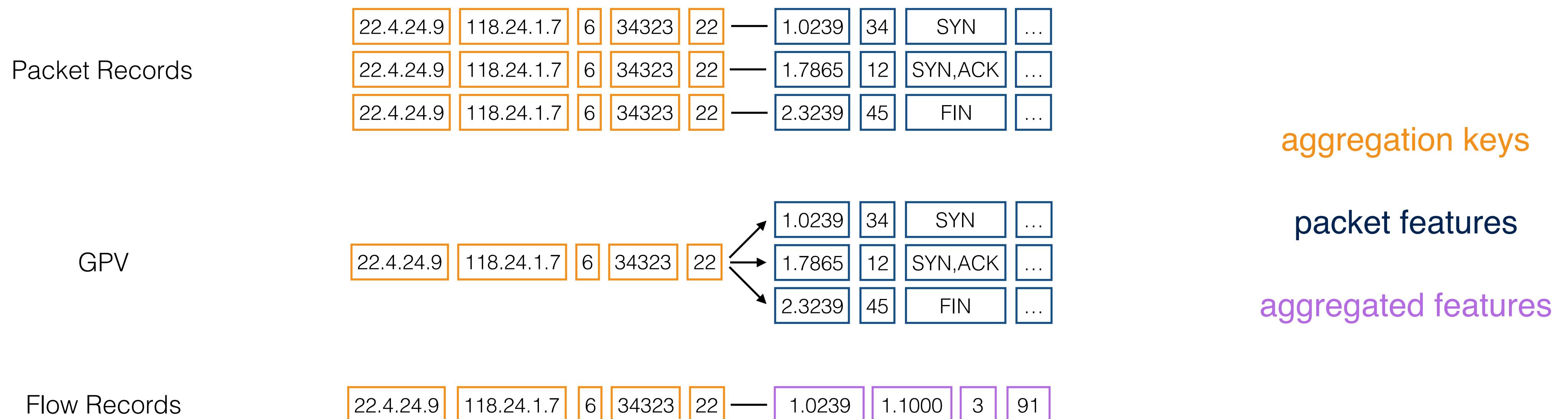
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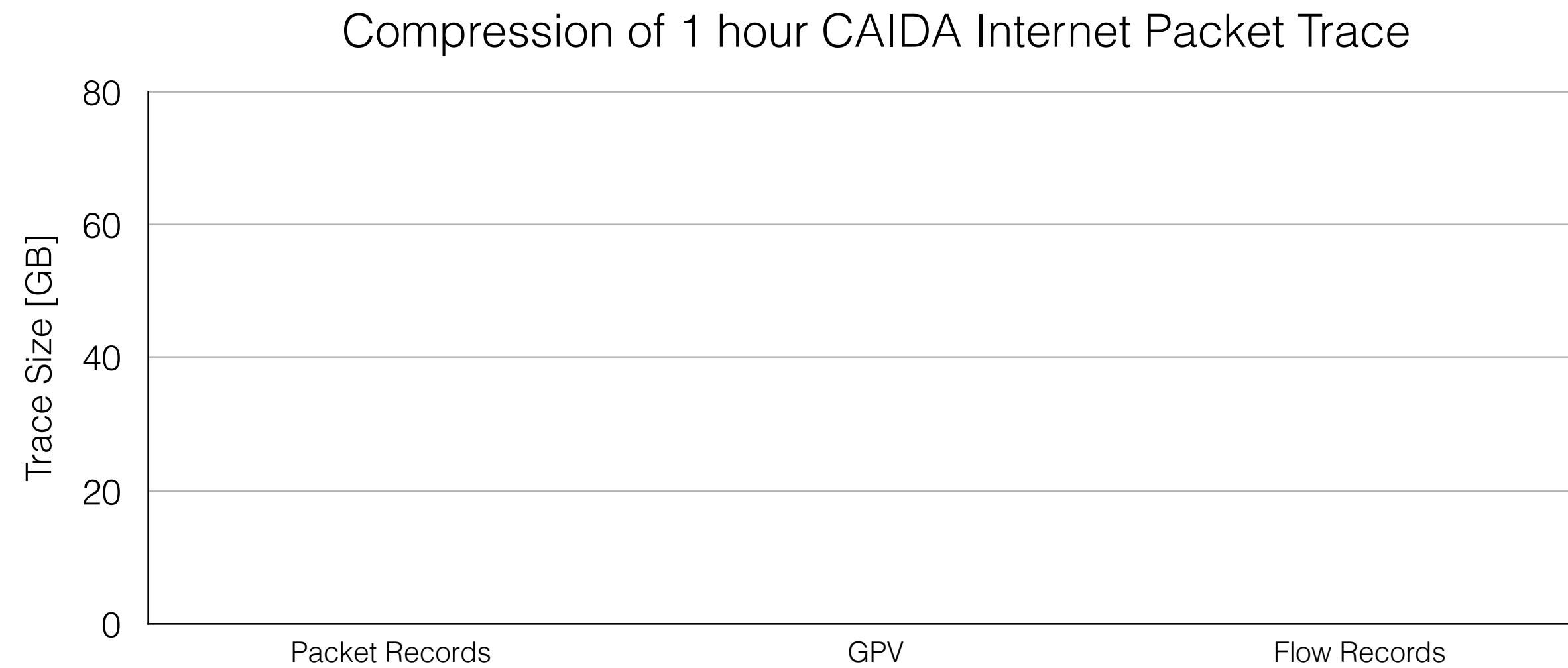


Grouped Packet Vectors

- GPVs provide high compression while maintaining information richness

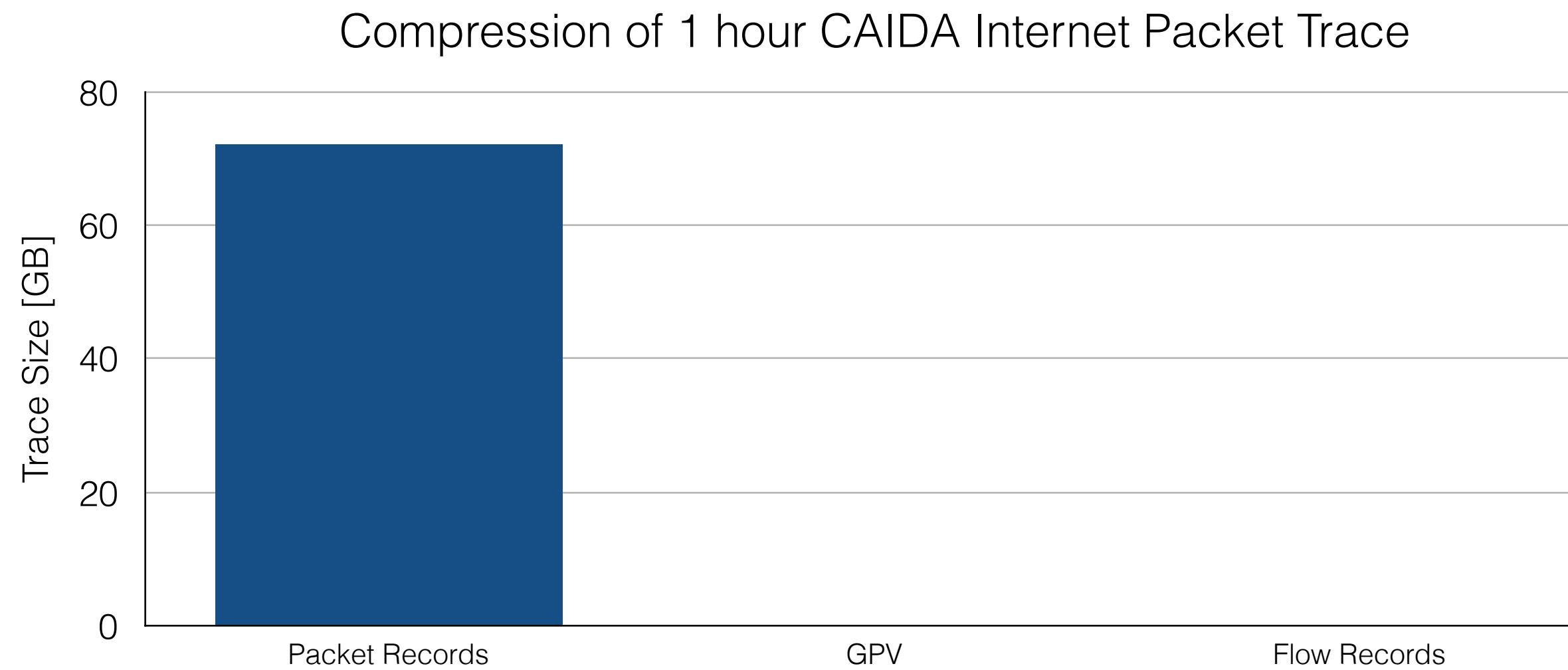
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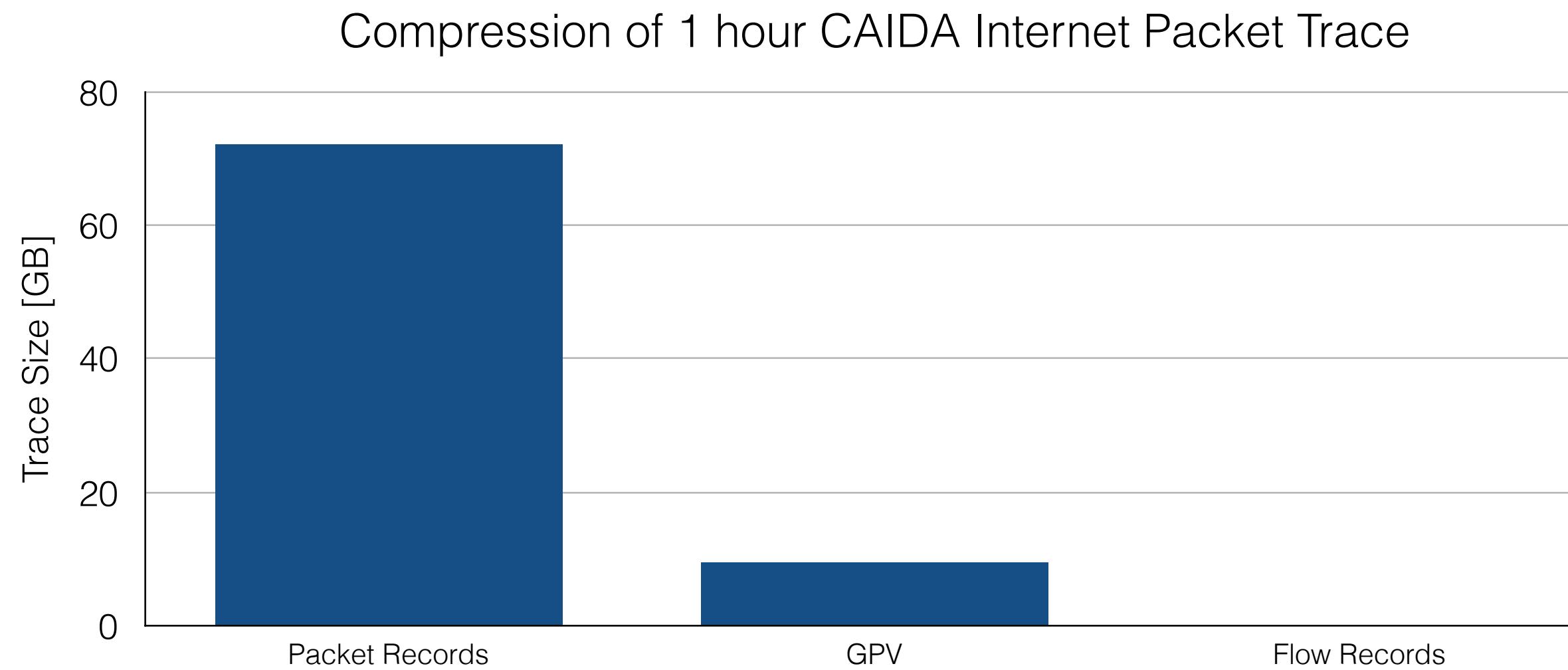
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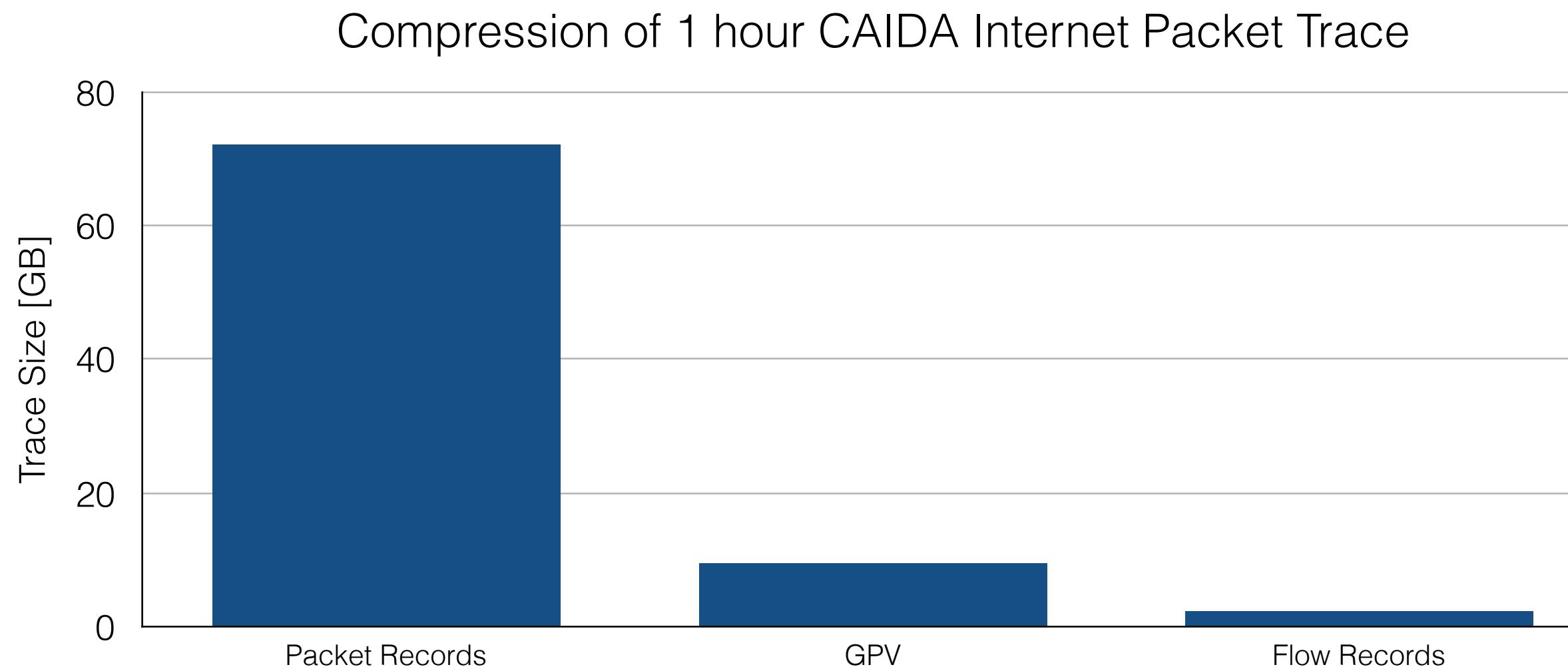
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Grouped Packet Vectors

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Database Models

Database Models

Relational



Database Models

Relational



NoSQL



Database Models

Relational



NoSQL



Time-Series



TIMESCALE



Database Models

Relational



NoSQL



Time-Series



TIMESCALE



influxdb



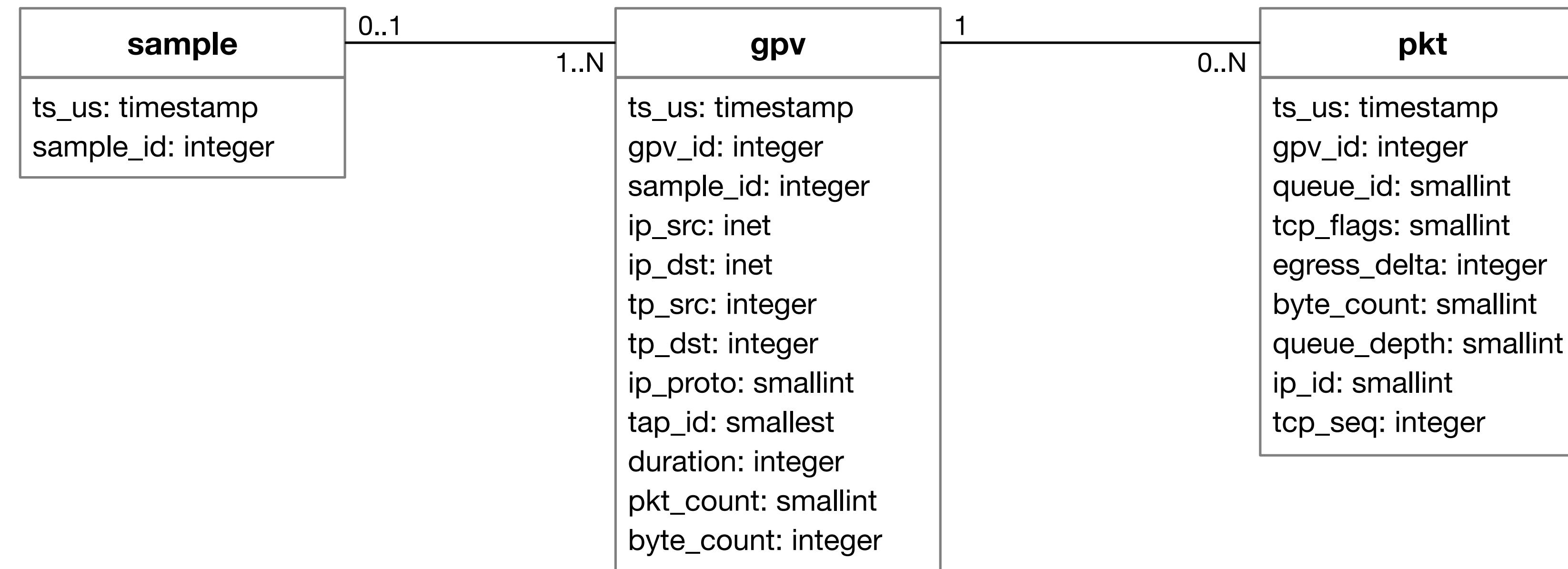
Prometheus

- optimized for time-series data
 - append-heavy workloads
 - grouping functionality based on time
 - timestamps as primary keys for data
 - relational or NoSQL

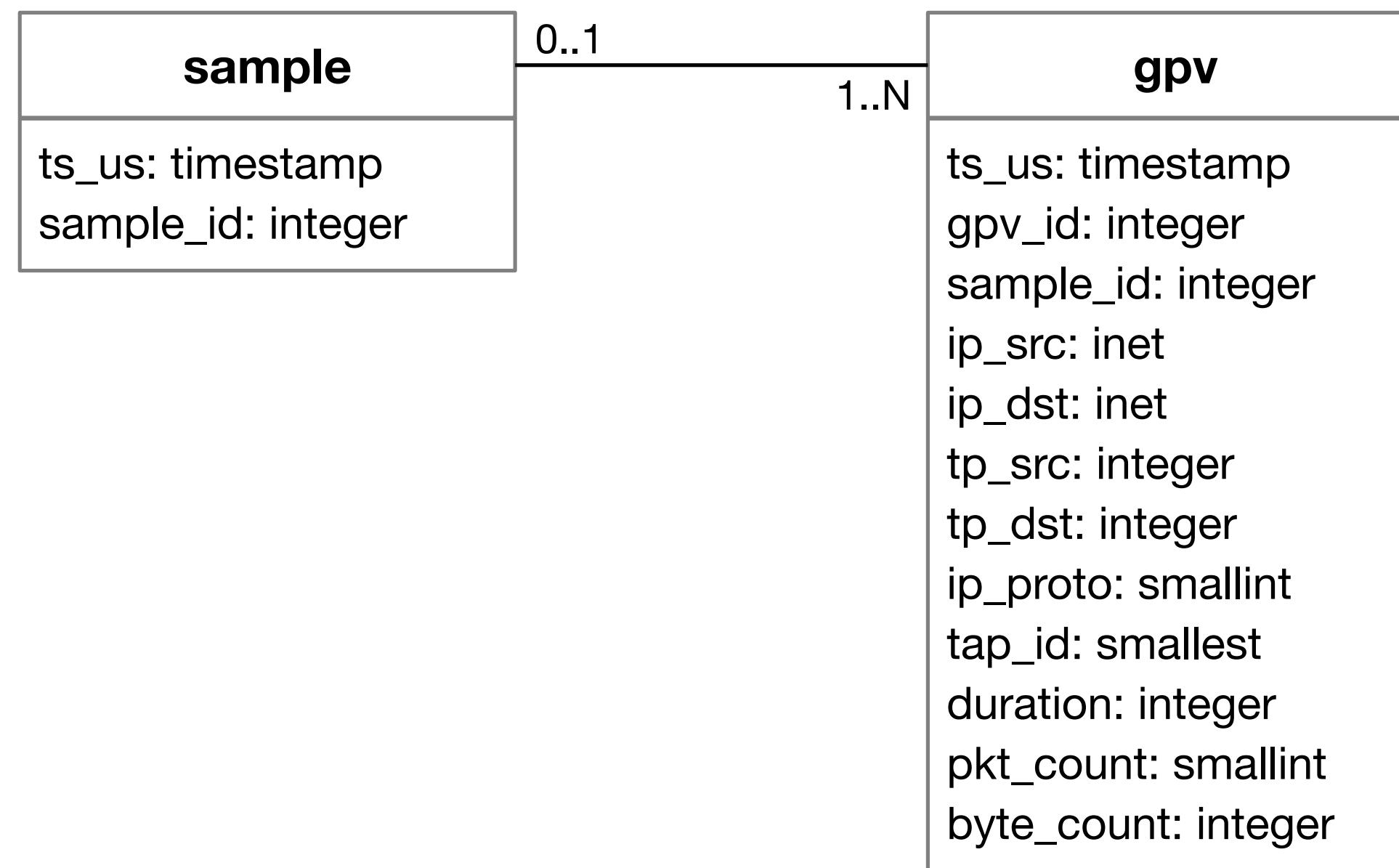
Storing Network Records



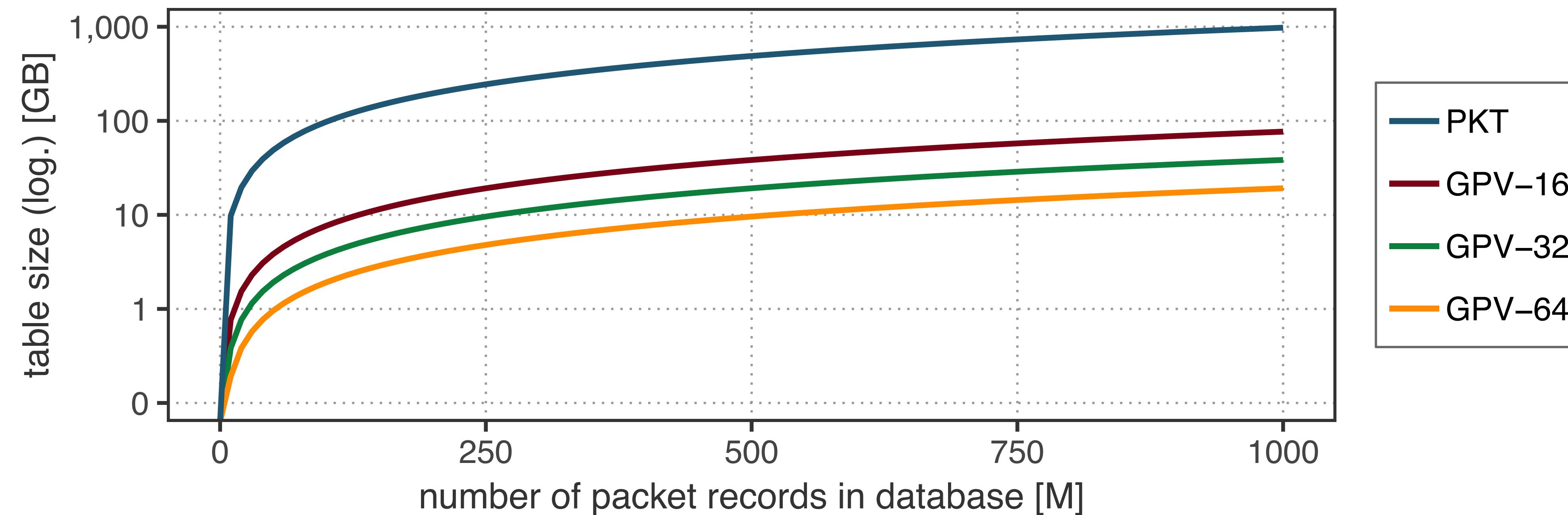
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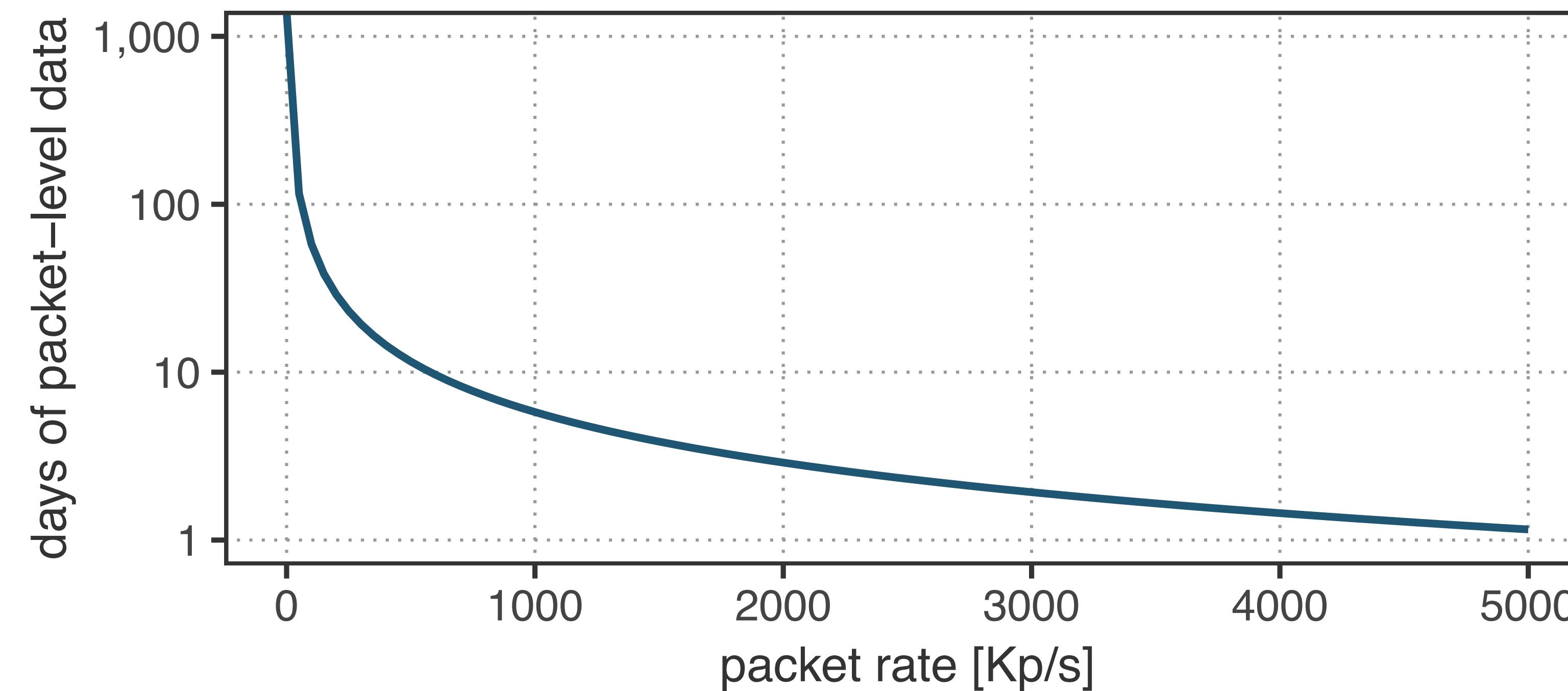
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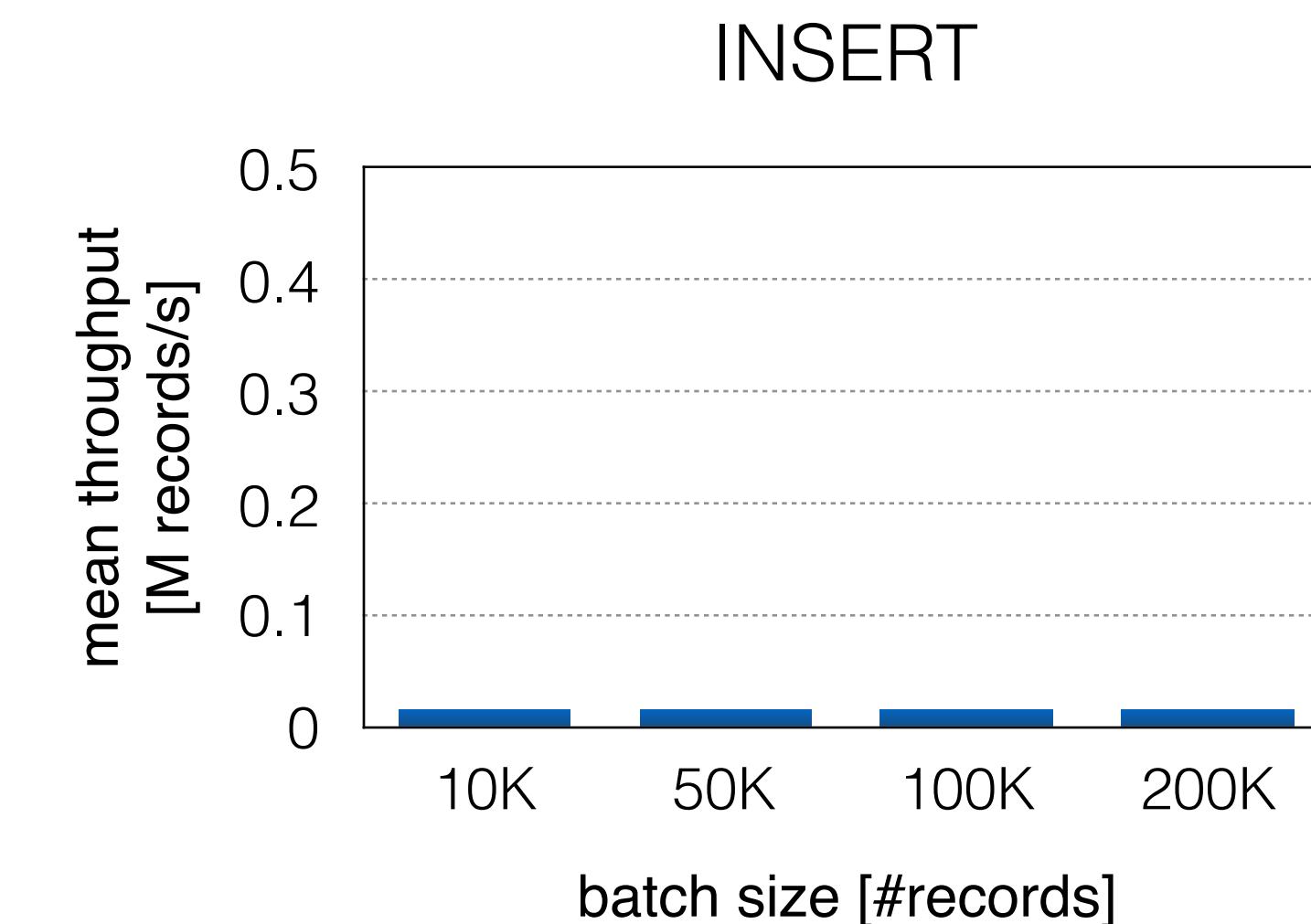
Injecting Network Records

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INSERT INTO packets VALUES  
('2018-11-25 19:02:23.023219',  
'123.213.123.4', '213.11.23.23', ...)
```

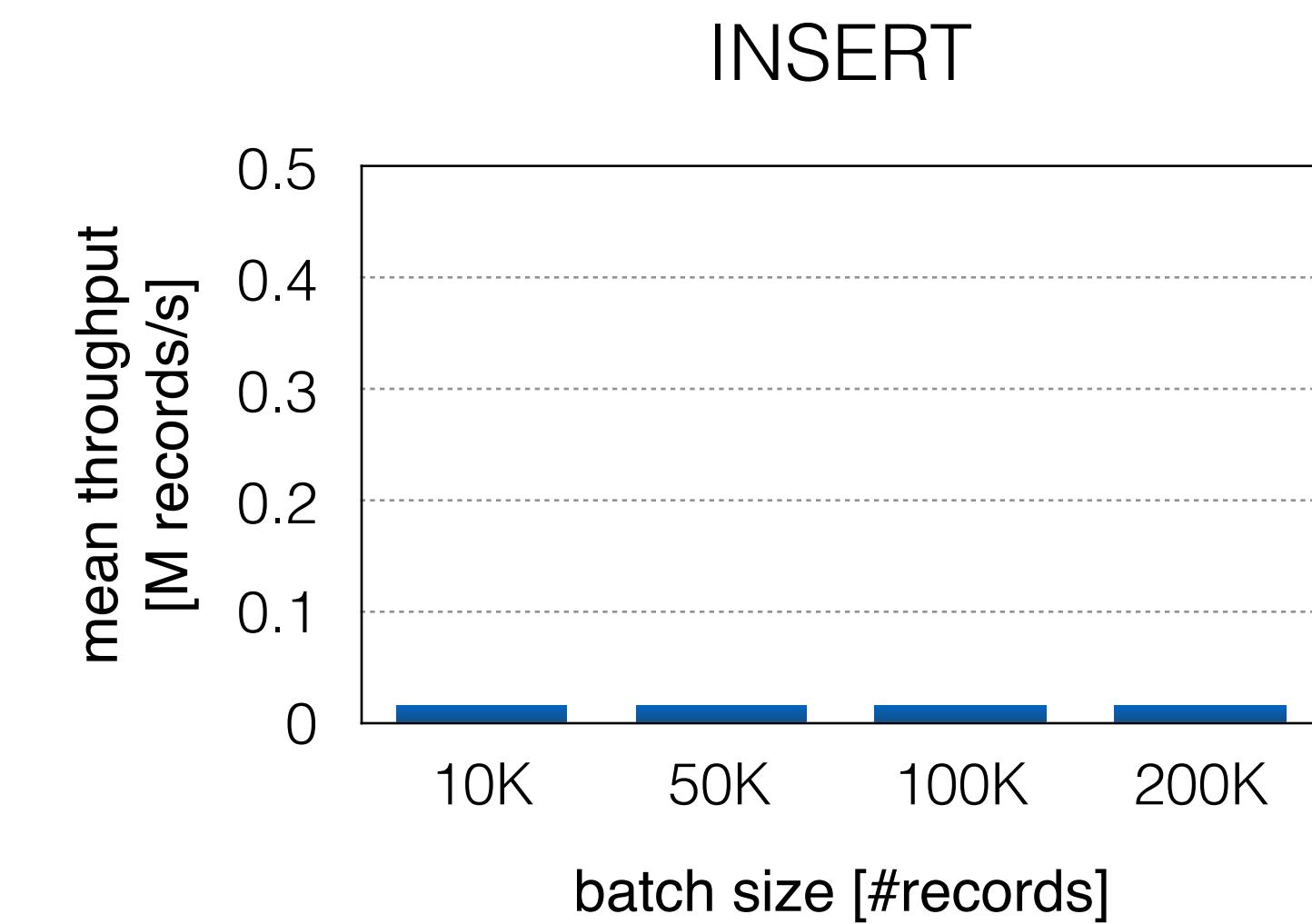
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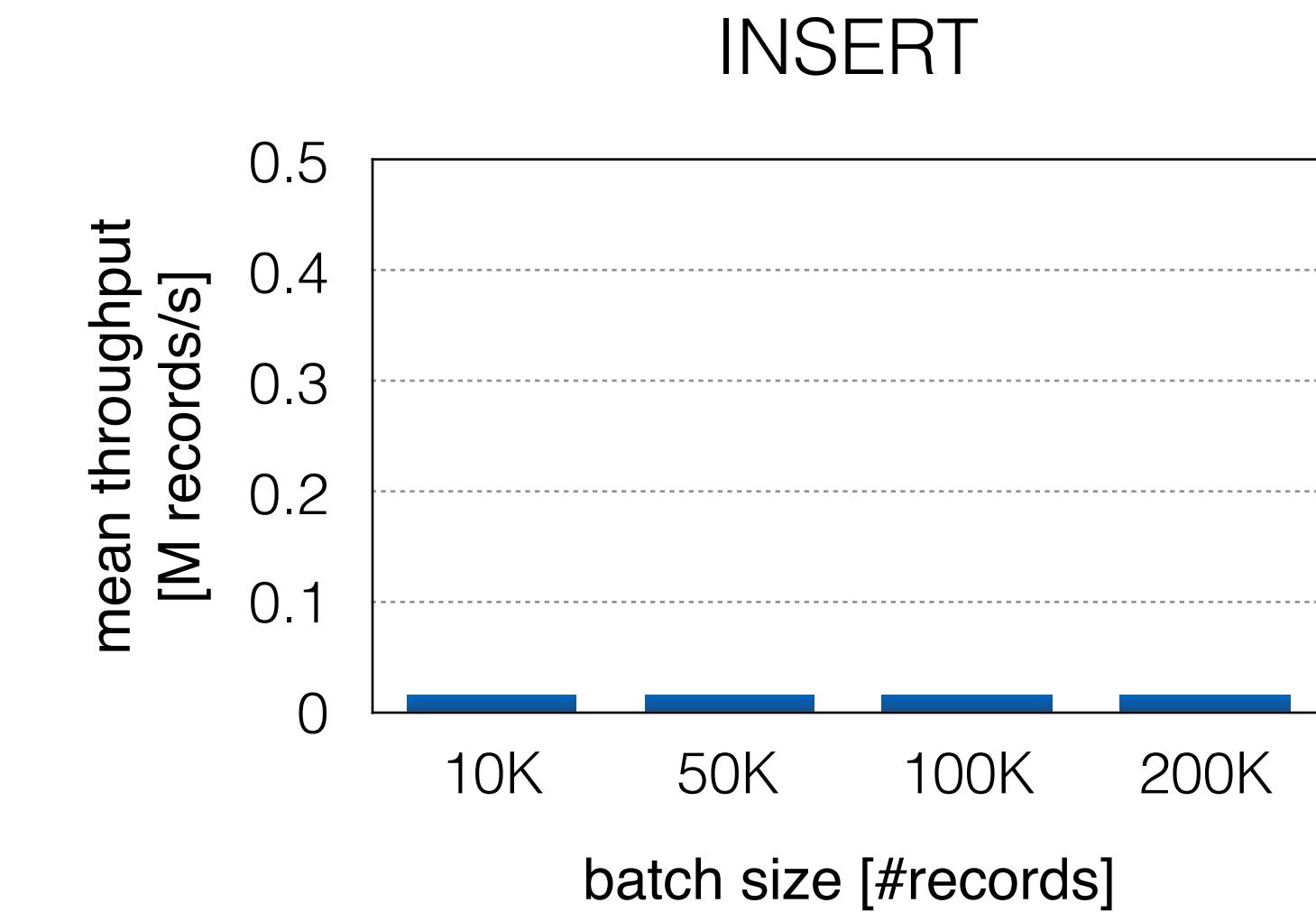
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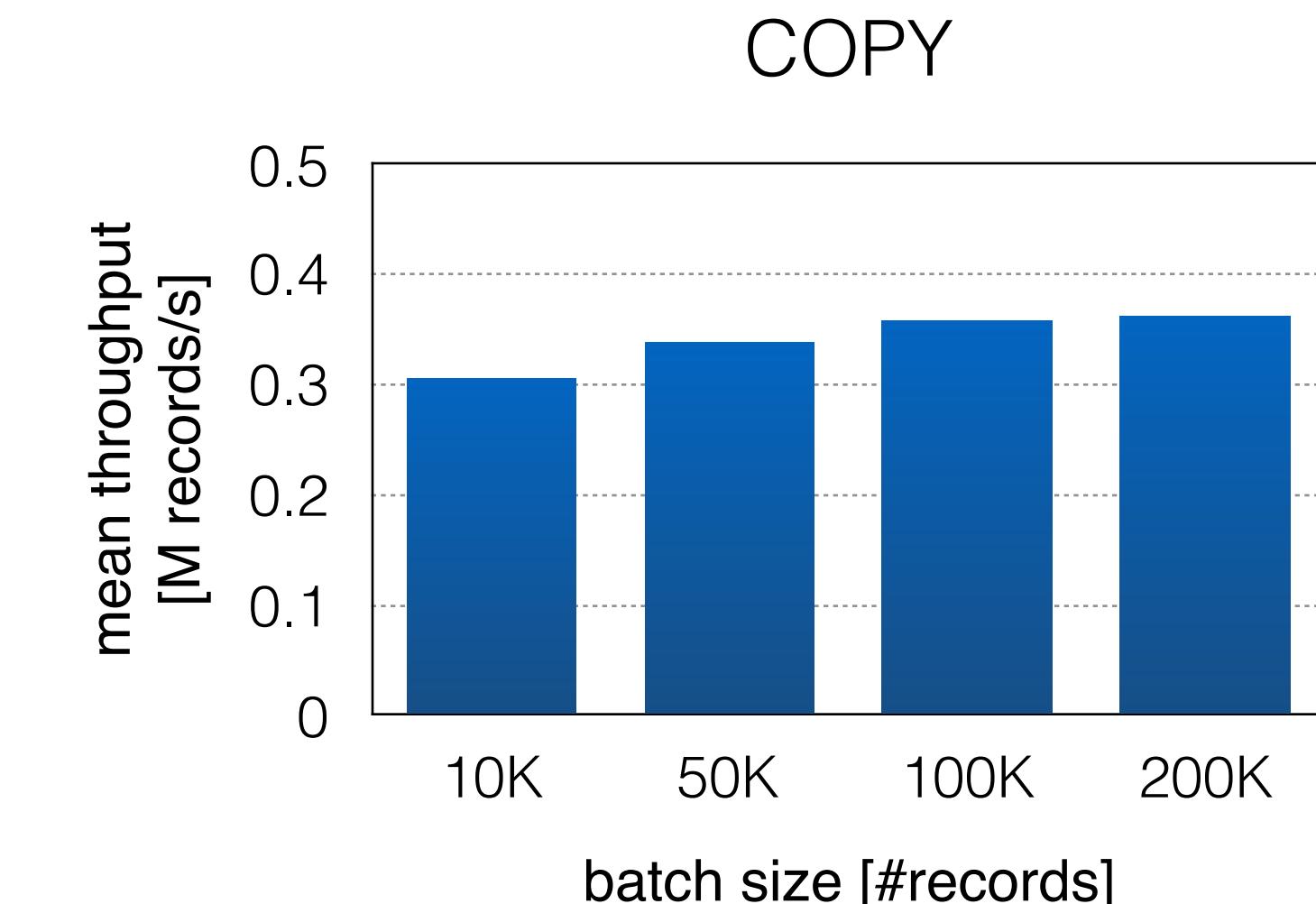
```
1 auto buf = new char[h_len + 10000  
2     * rec_len + t_len];  
3  
4 // 10000 times  
5 pkt.write_to_pg_buf(buf, offset);  
6  
7 pg_conn.copy("pkt", buf, sizeof(buf));
```

Injecting Network Records

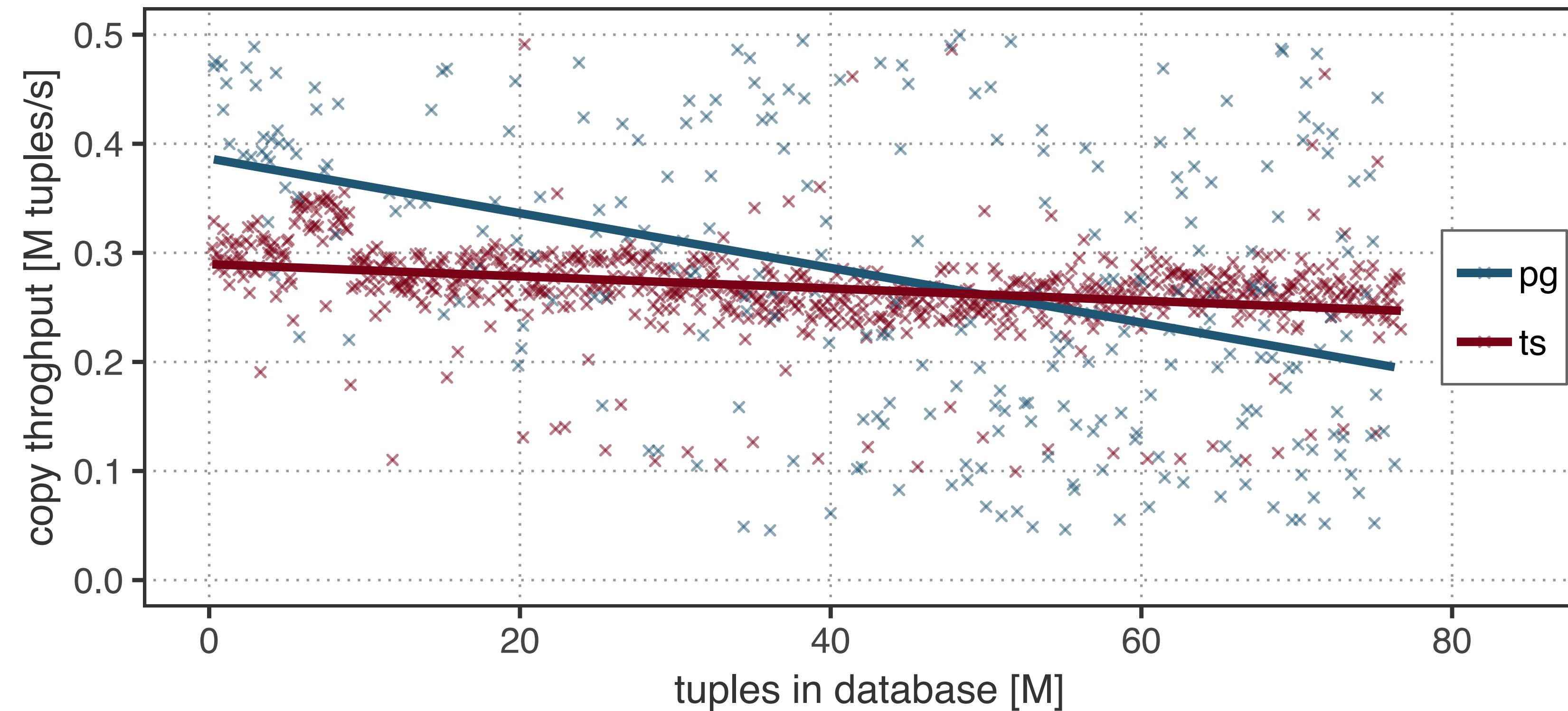
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SELECT time_bucket('1 seconds', ts_us) AS interval, SUM(pkt_count), SUM(byte_count)
FROM gpv GROUP BY interval ORDER BY interval ASC
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```
SELECT * FROM (gpv RIGHT JOIN pkt ON gpv.gpv_id = pkt.gpv_id)
WHERE gpv.ip_src << inet '60.70.0.0/16'
```

Querying Network Records

Querying Network Records

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SELECT DISTINCT gpv.ip_src, gpv.ip_dst, gpv.ip_proto, gpv.tp_src, gpv.tp_dst
FROM (gpv RIGHT JOIN pkt ON gpv.gpv_id = pkt.gpv_id)
WHERE pkt.ingress_ts >= '2018-02-19 12:59:11.595'
    AND pkt.ingress_ts < '2018-02-19 12:59:11.600'
    AND pkt.queue_id = '23'
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    AND pkt.queue_id = '23'
```

```
SELECT pkt.queue_id, COUNT(pkt.queue_id)
FROM (gpv RIGHT JOIN pkt ON gpv.gpv_id = pkt.gpv_id)
WHERE gpv.ip_dst << inet '53.231/16'
    AND pkt.queue_id IN (23,24,25,26)
GROUP BY pkt.queue_id;
```

Conclusion

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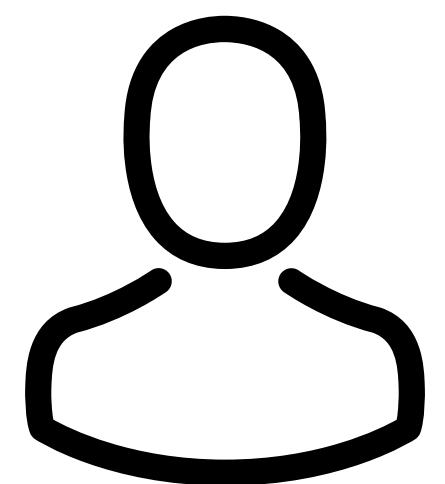


identify the need for retrospective network analytics

Conclusion



identify the need for retrospective network analytics

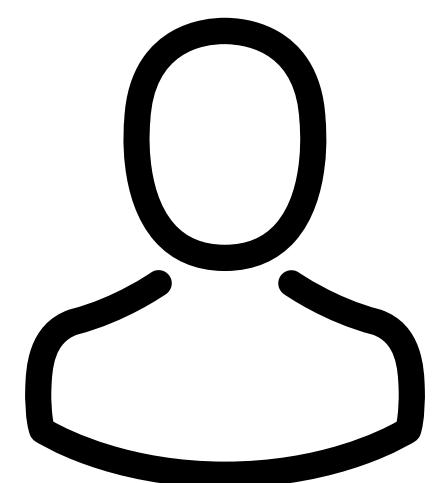


show using example queries how retrospective analytics can be used to get better insight into what happened in the network

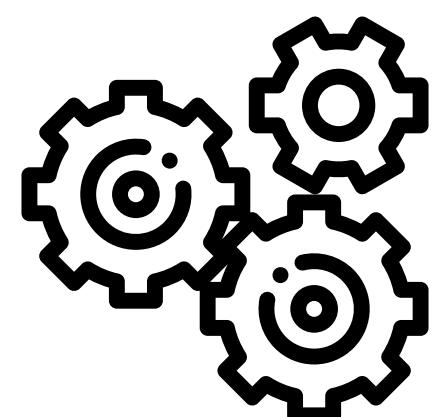
Conclusion



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implement a prototype application demonstrating technical feasibility

Q&A / DISCUSSION

Oliver Michel

oliver.michel@colorado.edu
<http://nsr.colorado.edu/oliver>



University of Colorado **Boulder**



BACKUP SLIDES

Example SQL Queries

Example SQL Queries

```
SELECT ip_src, SUM(pkt_count)
  FROM gpv WHERE ip_src << inet '60.70.0.0/16'
    AND gpv.ts_us > now() - interval '1 hours'
 GROUP BY ip_src
```