



# perfSONAR: Enhancing Data Collection through Adaptive Sampling

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<https://research.cec.sc.edu/cyberinfra/>

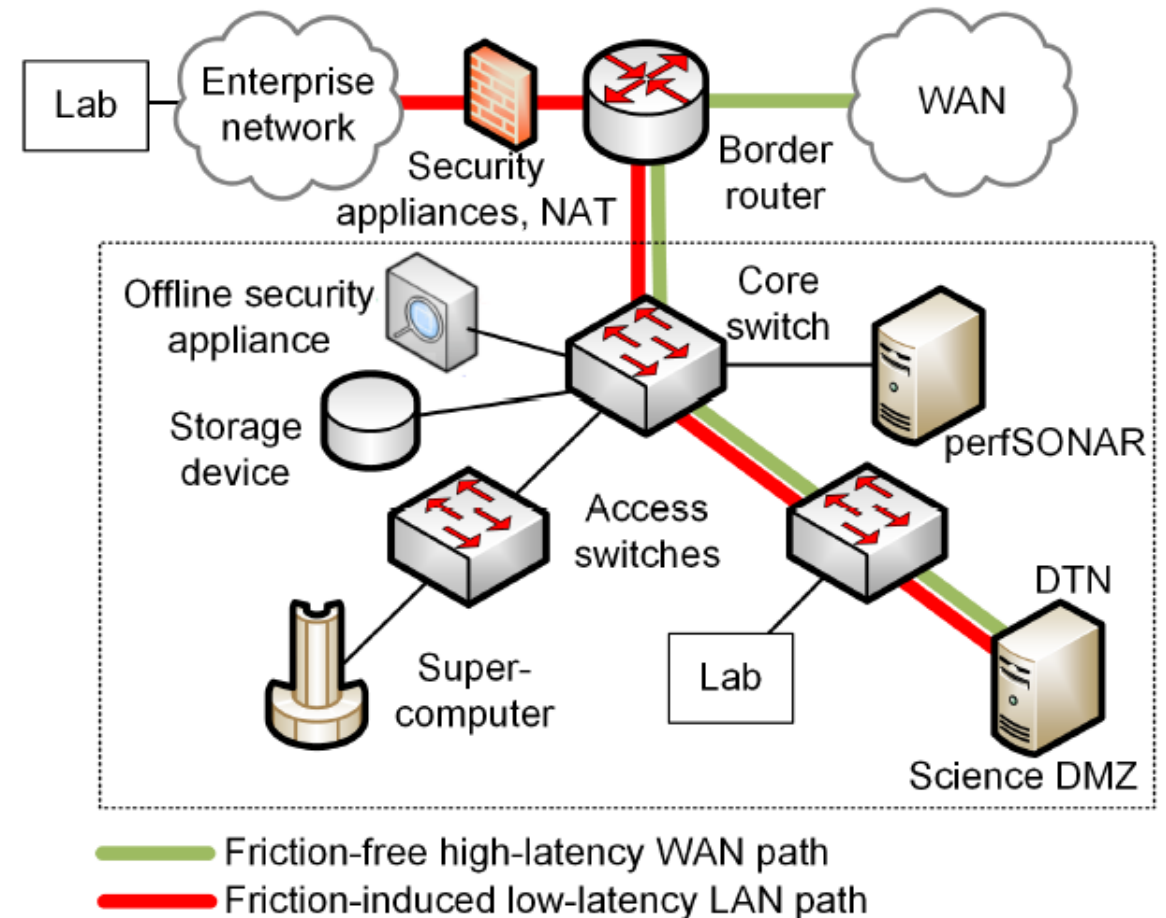
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# Agenda

- Background information on Science DMZ, perfSONAR, P4, Linear Prediction
- Proposed system
- Experimental setup
- Results
- Demo
- Conclusion

# Science DMZ

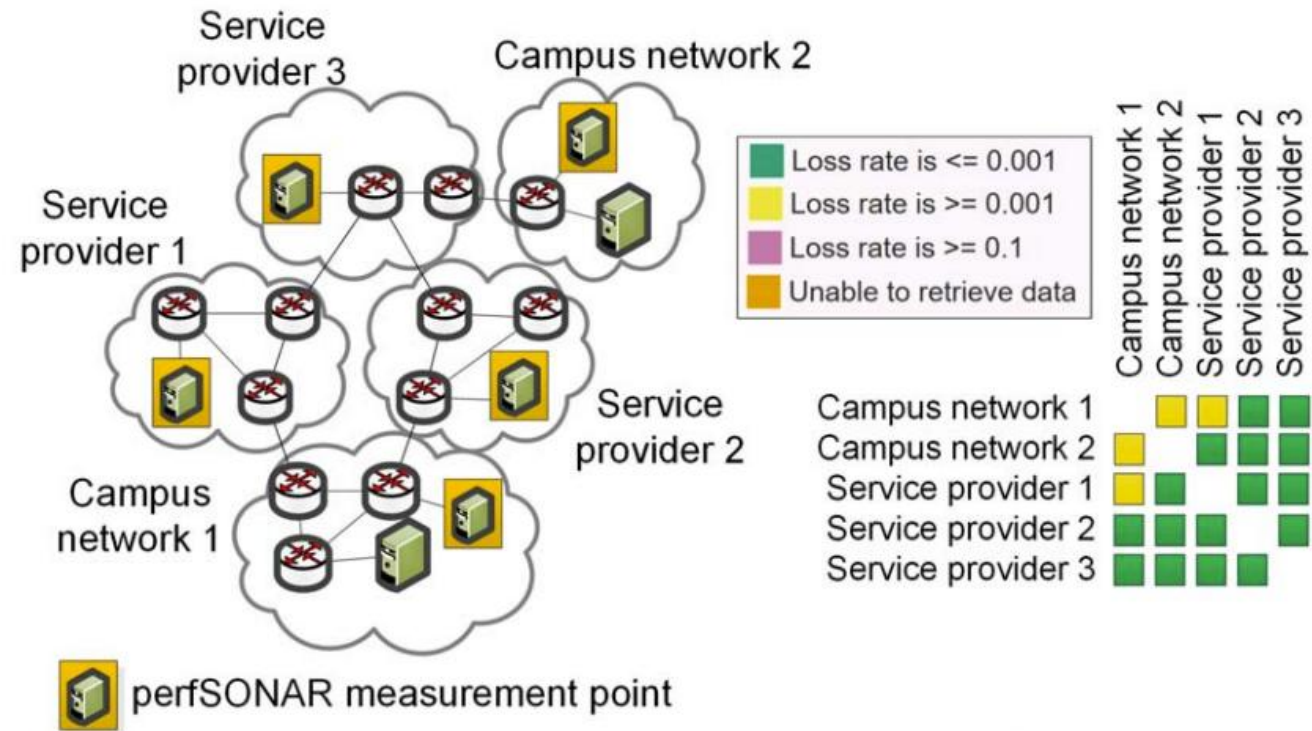
- The Science DMZ is a network designed for big science data transfers on WANs<sup>1</sup>
- Main elements:
  - High throughput, friction-free WAN paths
  - Security tailored for high speeds
  - Data Transfer Nodes (DTNs)
  - **End-to-end monitoring / perfSONAR**



<sup>1</sup>E. Dart, L. Rotman, B. Tierney, M. Hester, J. Zurawski, "The science dmz: a network design pattern for data-intensive science," *International Conference on High Performance Computing, Networking, Storage and Analysis*, Nov. 2013.

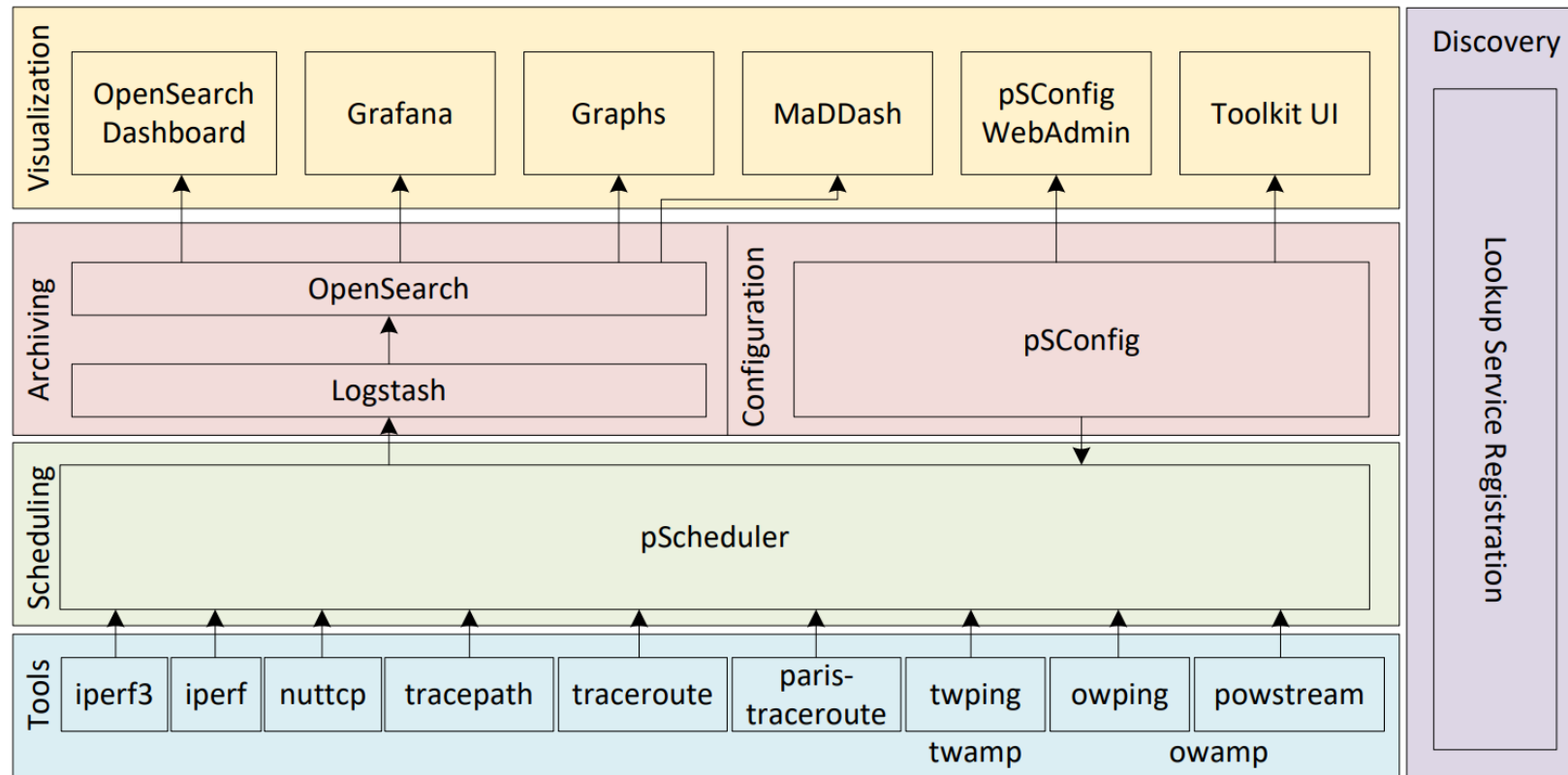
# perfSONAR

- perfSONAR is a measurement tool for end-to-end paths
- It helps troubleshoot performance issues (e.g., finding soft failures)
- perfSONAR is a key component of the Science DMZ



# perfSONAR

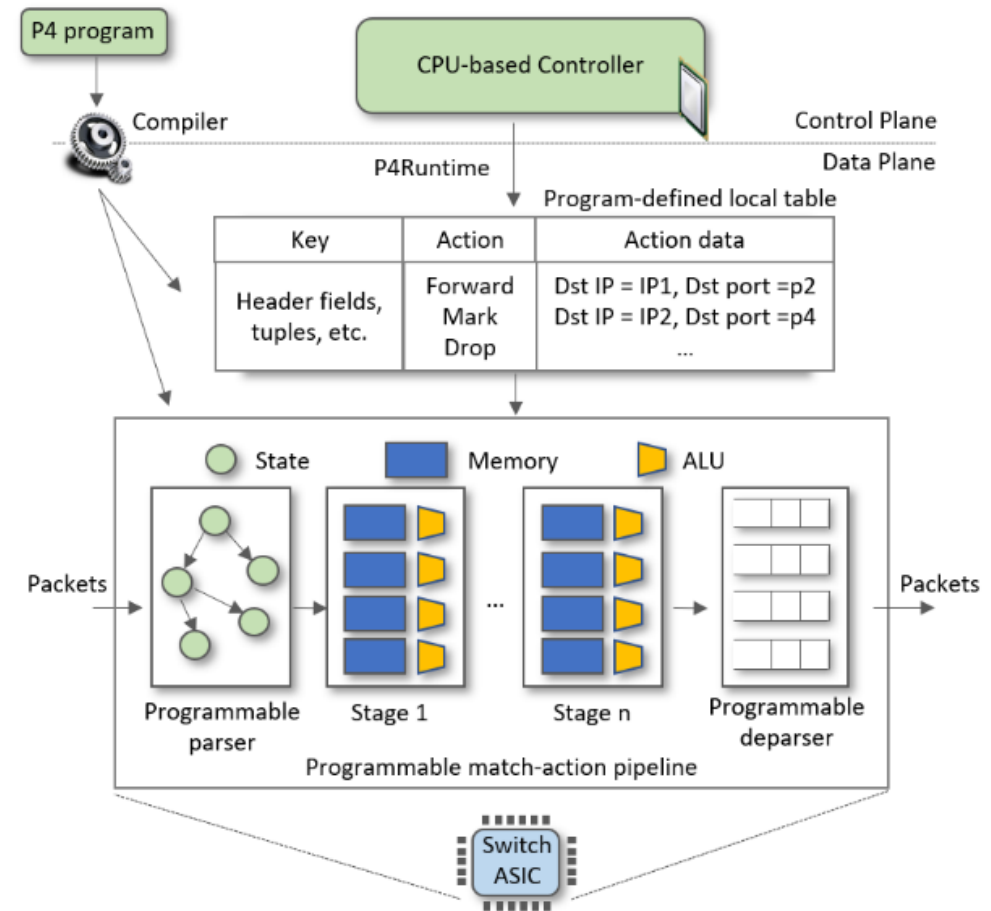
- perfSONAR
  - relies on tools that provide coarse-grained measurements
  - depends on active measurements
  - provides APIs that enable a programmer to extend its functionality



perfSONAR architecture

# P4 Programmable Data Planes

- A P4<sup>1</sup> Programmable Data Planes (PDP) is a domain-specific processor for networking
- It enables the programmer to
  - define and parse new protocols
  - measure events with high precision (nanosecond resolution)
  - run custom applications at line rate



# Linear Prediction Method

- The Linear Prediction method (LP) enables a system to predict the future value of a variable based on the observed values
- A future value is calculated by using the last observed sample and the average rate of change of the last  $N-1$  samples<sup>1</sup>:

$$x_{p_{N+1}} = x_N + \frac{\Delta T_{current}}{N-1} \sum_{i=1}^{N-1} \frac{x_{i+1} - x_i}{t_{i+1} - t_i}$$

Where:

- $x_{p_{N+1}}$  is the predicted value for the next sample
- $x_N$  is the most recent (actual) sample
- $N$  is the number of (actual) samples considered so far
- $x_i$  and  $t_i$  represent the value and arrival time of the  $i$ th sample, respectively
- $\Delta T_{current}$  is the time gap between the most recent sample and the next sample

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<sup>1</sup>E.A. Hernandez, M. C. Chidester, and A. D. George, "Adaptive sampling for network management," Journal of Network and Systems Management, vol. 9, pp. 409–434, 2001

# Goal of the Proposed Application

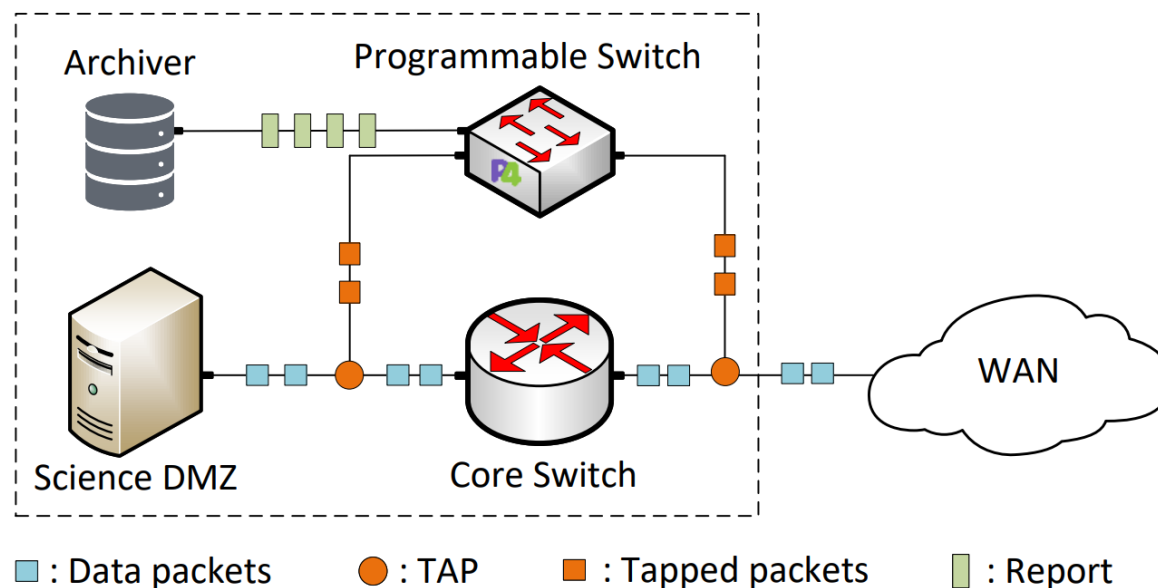
- Extend perfSONAR with P4 switches to
  - enable per-packet visibility
  - track flows individually
  - compatible with current Science DMZ / non-programmable devices
  - produce high-resolution measurements while **minimizing the reporting rate**

	perfSONAR	P4-perfSONAR	Comments
Measurement type	Active measurement	Active and passive measurements	Passive measurements do not introduce overhead
Measurement source	Injected traffic	Real traffic	More accurate measurements are collected with real traffic
Granularity	Limited	Per-flow and per-packet granularity	P4-perfSONAR produces accurate, high-resolution measurements
Visibility	Limited by active tests	Real-time visibility over all data transfers	P4-perfSONAR provides high visibility
Reporting rate	Fixed	Adaptive	Reporting rate adapts according to the input signal



# Proposed System - Overview

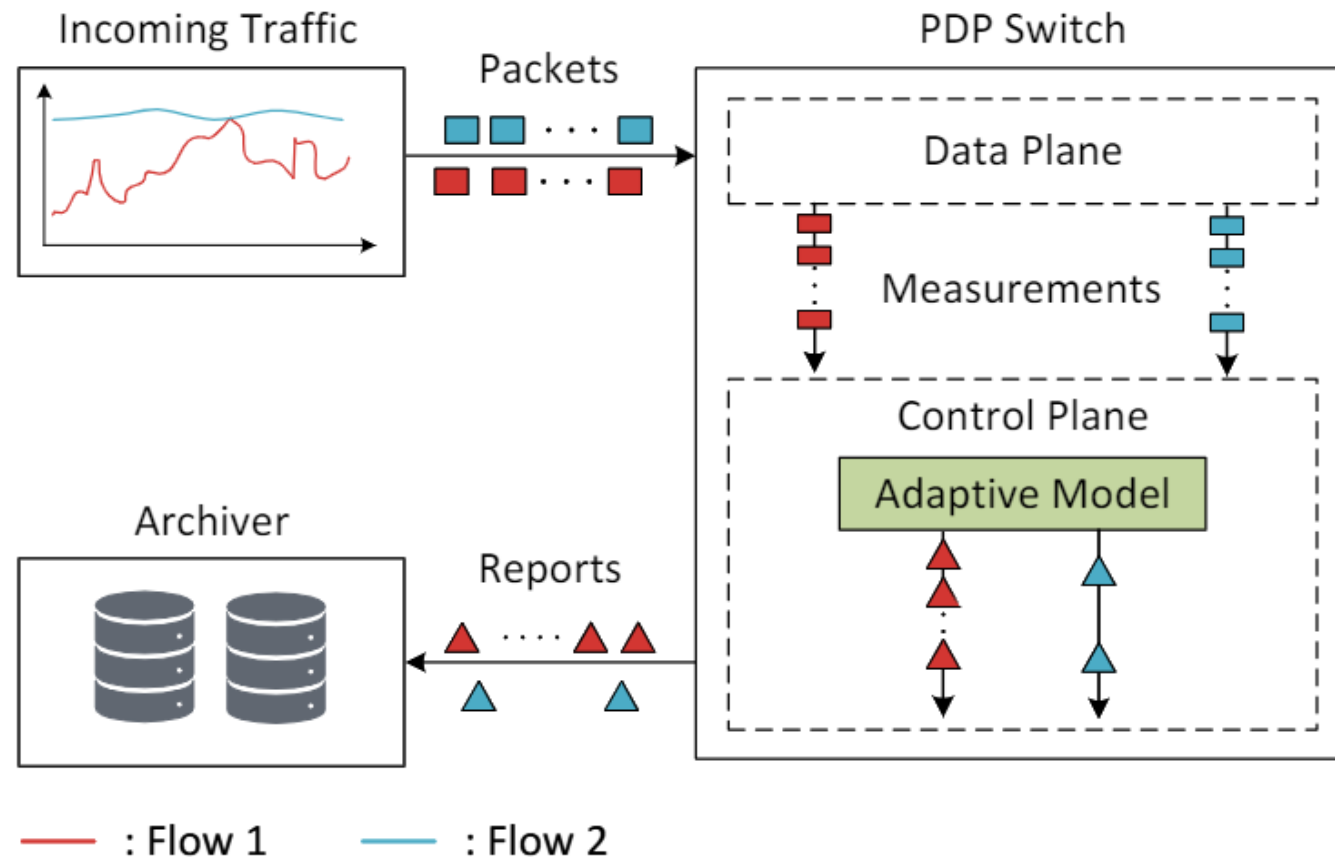
- The scheme uses optical passive taps<sup>1</sup> to mirror traffic which is then forward to a PDP
- The PDP
  - continuously generates fine-grained measurements at line rate (e.g., RTT, loss rate, throughput)
  - selectively reports to the archiver (perfSONAR) on a per-flow basis
  - introduces new measures (e.g., queue occupancy, packet interarrival time)



1. Optical taps operate at the physical layer by splitting the light traveling in the fiber

# Proposed System - Overview

- An adaptive model runs on the control plane and selectively reports the measurements to the archiver
- The higher the variation in the observed samples, the higher the reporting rate



# Proposed System – Adaptive Model

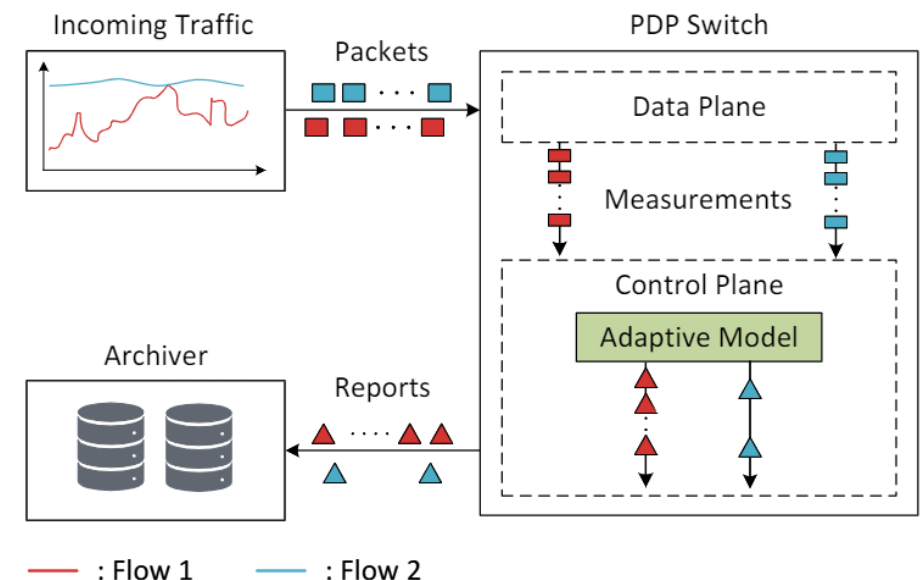
- The control plane is configured to extract measurements at a constant rate
- By considering a constant extraction rate, the prediction can be simplified as:

$$x_{p_{N+1}} = x_N + \frac{x_N - x_1}{N - 1}$$

- After extracting the  $N+1$  sample, the error in prediction is calculated as follows<sup>1</sup>:

$$m = \frac{x_{p_{N+1}}}{x_{N+1}}$$

- A prediction is considered accurate if  $1 - \sigma < m < 1 + \sigma$  such that  $0 < \sigma < 1$



<sup>1</sup>E.A. Hernandez, M. C. Chidester, and A. D. George, "Adaptive sampling for network management," Journal of Network and Systems Management, vol. 9, pp. 409–434, 2001

# Proposed System - Measurements

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- The system computes the following per-flow statistics
  - Packet loss rate
  - RTT
  - Throughput
  - Queueing occupancy and queueing delay
  - Packet interarrival time

# Proposed System - Measurements

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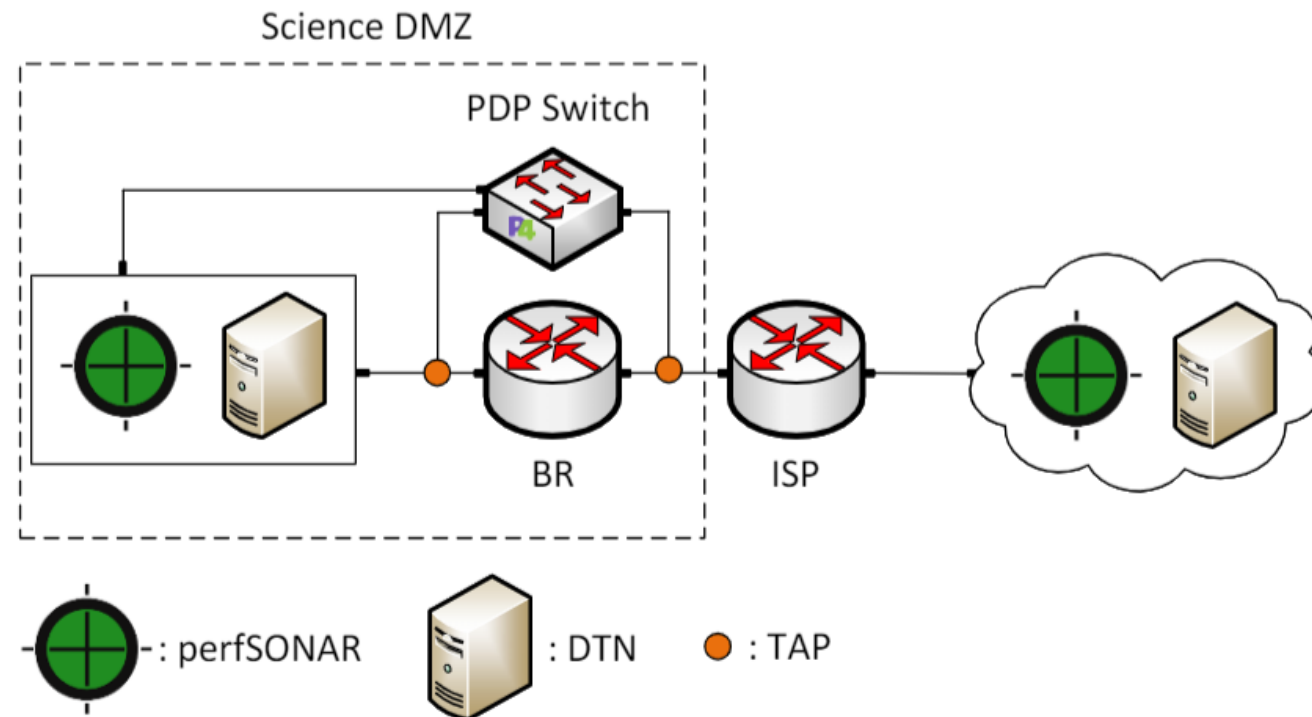
- The system computes the following per-flow statistics
  - Packet loss rate
  - RTT
  - Throughput
  - Queueing occupancy and queueing delay
  - Packet interarrival time
- Based on the above statistics, other computations are executed in the control plane
  - Jain's fairness index<sup>1</sup>
  - Link utilization

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1. R. Jain, A. Durrezi, and G. Babic, "Throughput fairness index: An explanation," in ATM Forum contribution, vol. 99, 1999.

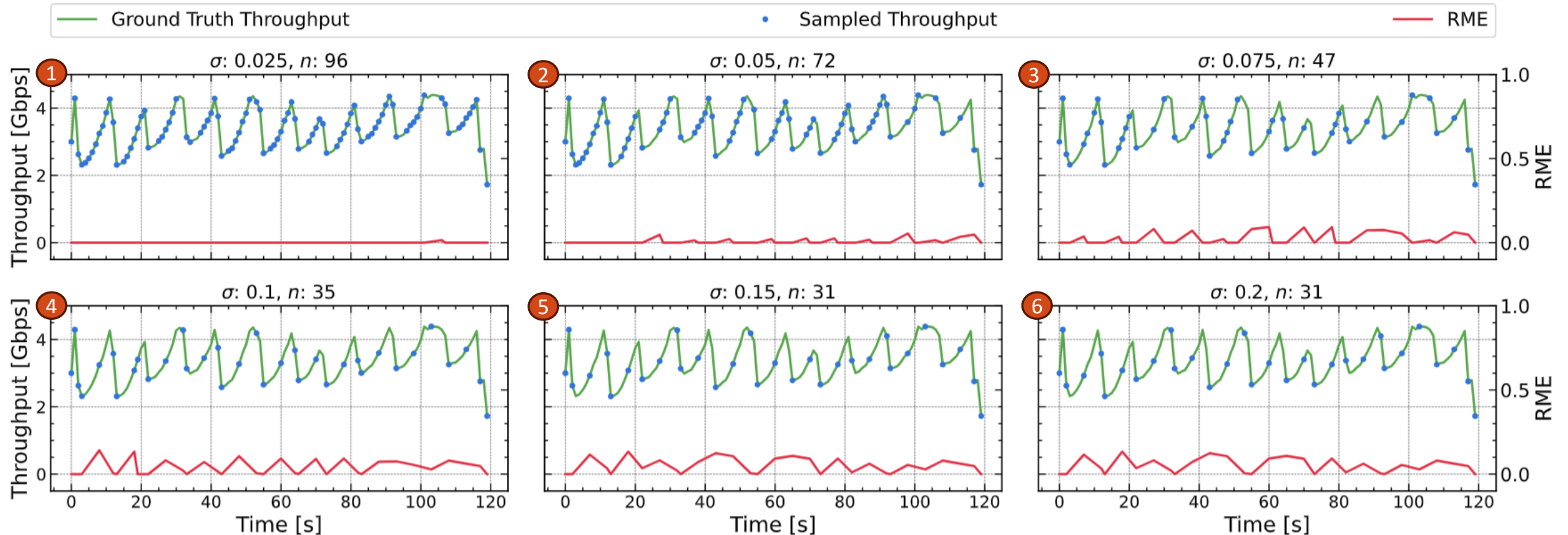
# Experimental Setup

- The topology consists of a Science DMZ connected to a WAN (emulated w/ NETEM)
- The BR and ISP routers are Juniper MX 204
- The optical TAPs copy the traffic at the ingress and egress interfaces of the BR, and forward the copy to a PDP switch



# Results – Evaluating the Impact of $\sigma$

- This experiment aims to evaluate the impact of  $\sigma$  on the RME and the number of reported samples
- The larger the value of  $\sigma$ , the larger the tolerance to error
- A two-minute test is performed between the DTNs, and six values of  $\sigma$  are used



Demo 1  
Throughput Measurements





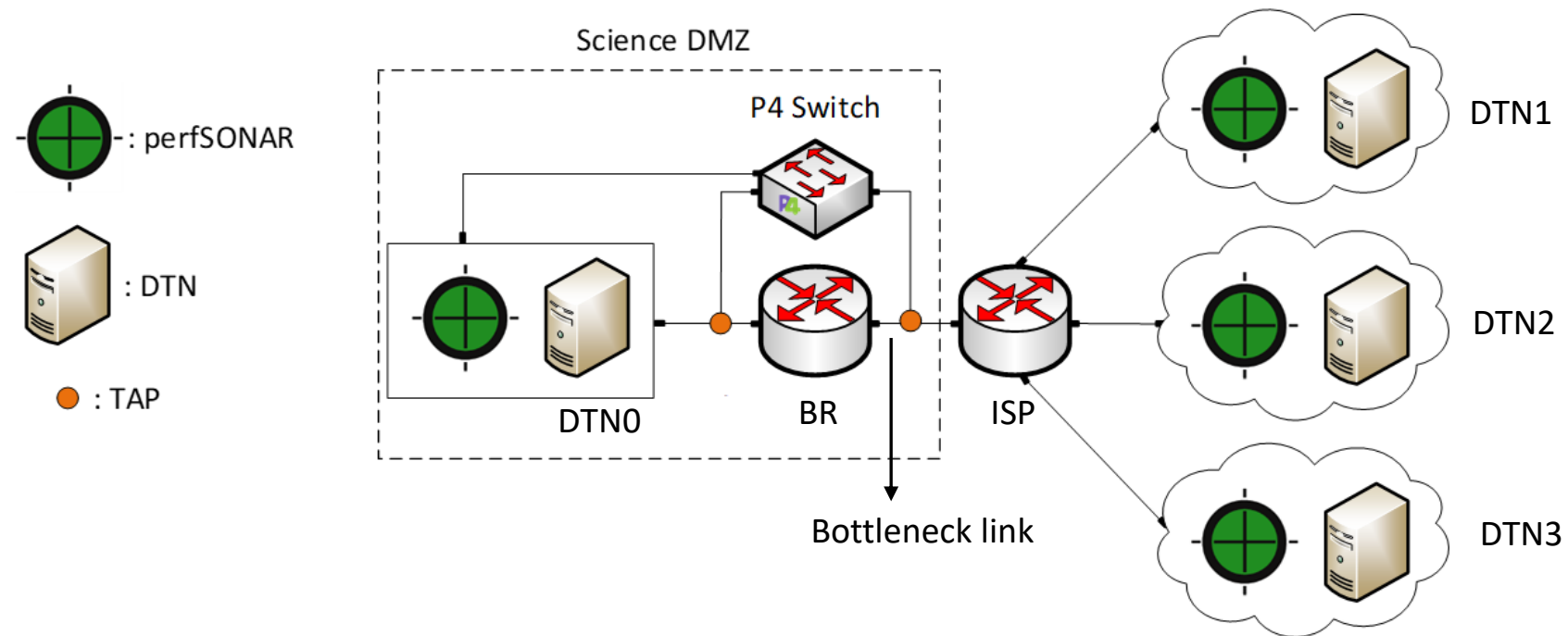
Demo 2  
Throughput and RTT Measurements

```
[root@perfSONAR2 admin]# iperf3 -s
```

```
[root@perfSONAR2 admin]# tc qdisc change dev ens224 root netem delay 30ms
```

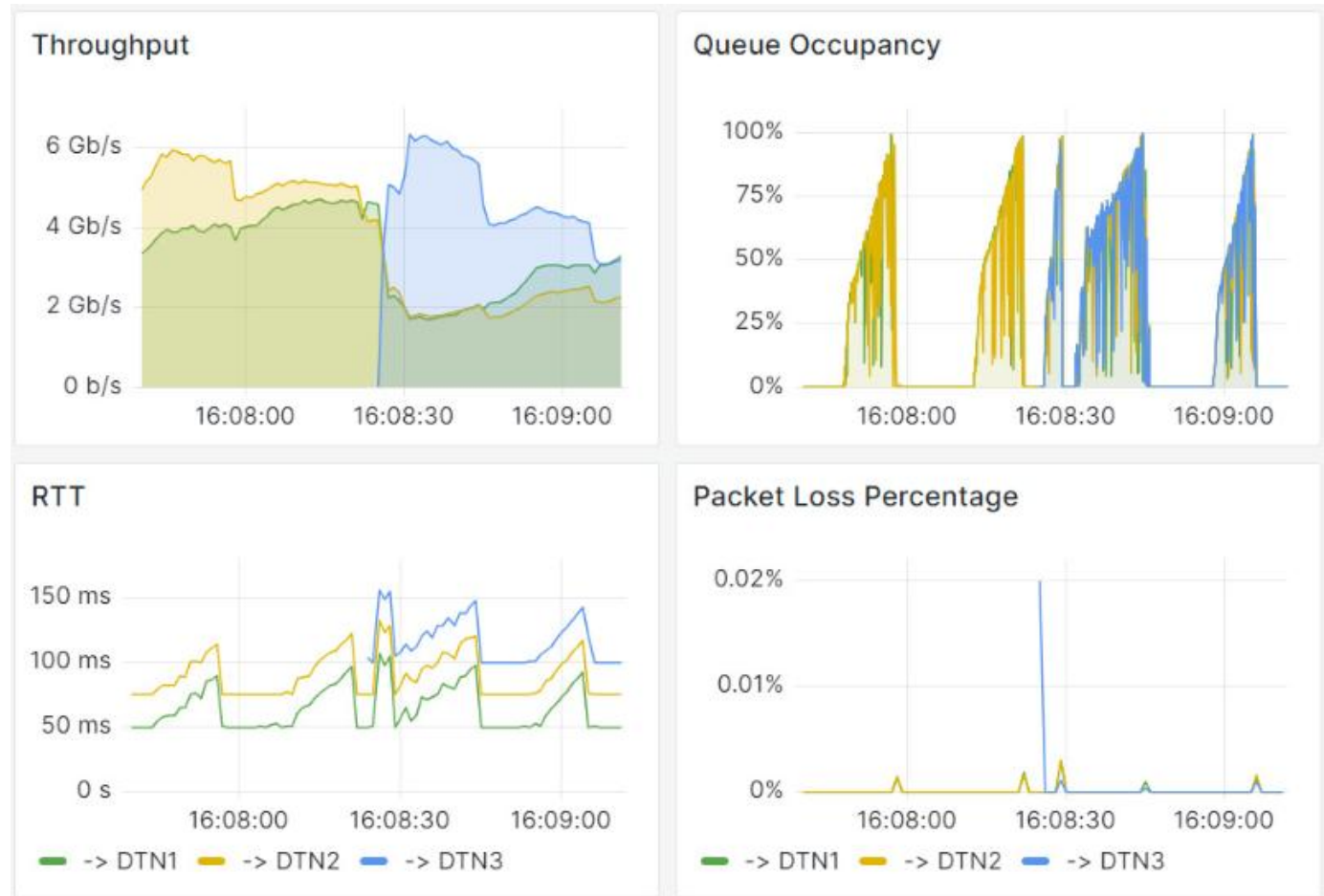
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- The BR and ISP routers are Juniper MX 204
- The optical TAPs copy the traffic at the ingress and egress interfaces of the BR, and forward the copy to a P4 switch
- The capacity of the bottleneck link is 10 Gbps



# Results – Per-flow Monitoring

- At t=0, there are two flows: between DTN0 and DTN1, and between DTN0 and DTN2
- At t=16:08:25, another flow is introduced, between DTN0 and DTN3
- The propagation delays are:
  - DTN0-DTN1: 50ms
  - DTN0-DTN2: 75ms
  - DTN0-DTN3: 100ms



# Results – Fairness and Link Utilization

- Link utilization is computed as the aggregate throughput over the link capacity, in percentage (this measure is for the bottleneck link)
- Fairness is given by the Jain's fairness index<sup>1</sup>
  - A totally fair system has an index of 1 and a totally unfair system has an index of 0



1. R. Jain, A. Duresi, and G. Babic, "Throughput fairness index: An explanation," in ATM Forum contribution, vol. 99, 1999.

# Conclusion

- This presentation described an extension of perfSONAR with P4 switches
- The P4 switches provide per-packet visibility and line-rate computation
- The scheme augments perfSONAR by tracking flows individually, providing high-resolution measurements, and operating over passive traffic
- The system uses an adaptive model that selectively reports measurements

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