

# **Enabling Flow-level Latency Measurements across Routers in Data Centers**

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# Latency-critical applications in data centers

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- ▶ **Guaranteeing low end-to-end latency is important**
  - ▶ Web search (e.g., Google's instant search service)
  - ▶ Retail advertising
  - ▶ Recommendation systems
  - ▶ High-frequency trading in financial data centers
  
- ▶ **Operators want to troubleshoot latency anomalies**
  - ▶ End-host latencies can be monitored locally
  - ▶ Detection, diagnosis and localization through a network: no native support of latency measurements in a router/switch



# Prior solutions

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- ▶ **Lossy Difference Aggregator (LDA)**

- ▶ Kompella et al. [SIGCOMM '09]
- ▶ Aggregate latency statistics

- ▶ **Reference Latency Interpolation (RLI)**

- ▶ Lee et al. [SIGCOMM '10]
- ▶ Per-flow latency measurements



More suitable due to more fine-grained measurements



# Deployment scenario of RLI

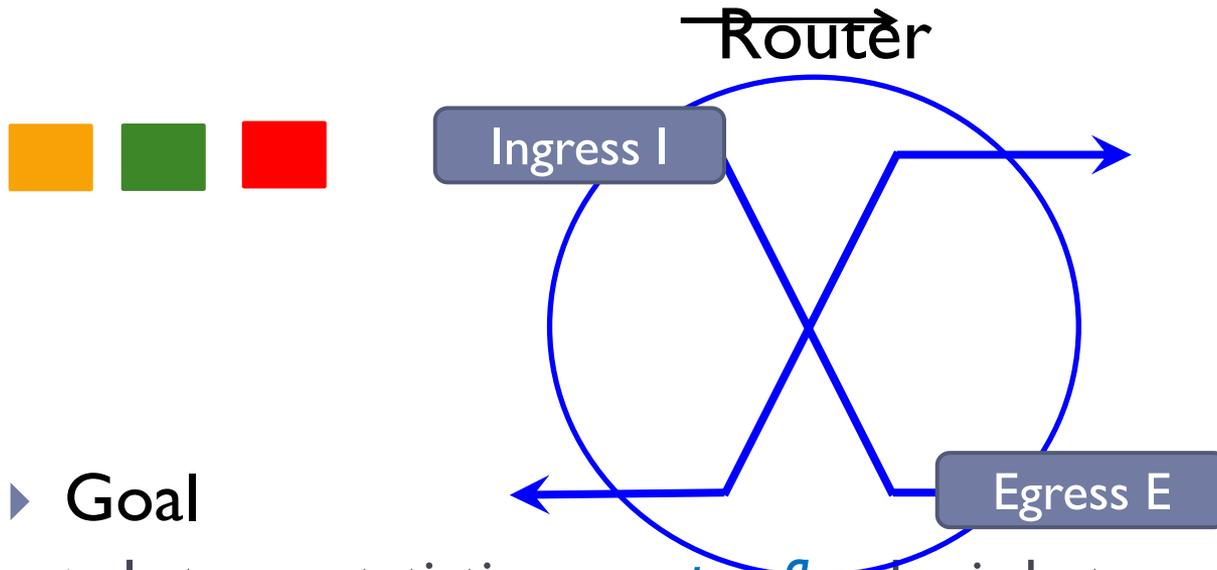
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- ▶ Upgrading all switches/routers in a data center network
- ▶ Pros
  - ▶ Provide finest granularity of latency anomaly localization
- ▶ Cons
  - ▶ Significant deployment cost
  - ▶ Possible downtime of entire production data centers
- ▶ In this work, we are considering partial deployment of RLI
  - ▶ Our approach: *RLI across Routers (RLIR)*



# Overview of RLI architecture

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## ▶ Goal

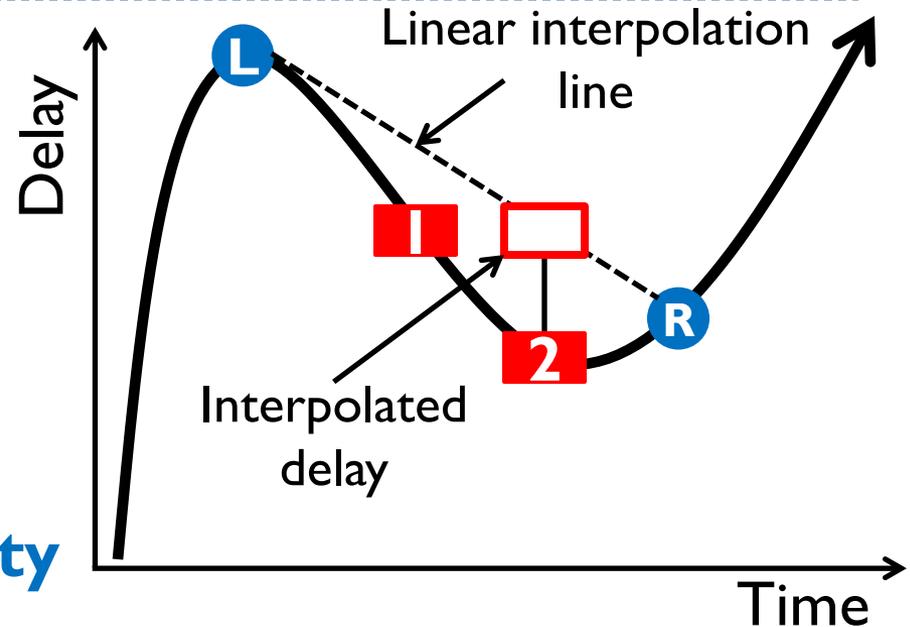
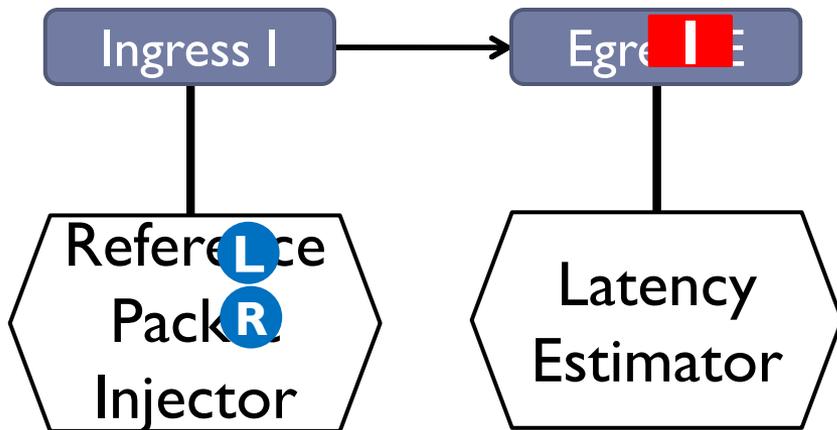
- ▶ Latency statistics on a *per-flow* basis between interfaces

## ▶ Problem setting

- ▶ No storing timestamp for each packet at ingress and egress due to **high storage** and **communication cost**
  - ▶ Regular packets do not carry timestamps
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# Overview of RLI architecture



▶ Premise of RLI: **delay locality**

▶ Approach

1) The injector sends reference packets *regularly*

2) Reference packet carries *ingress timestamp*

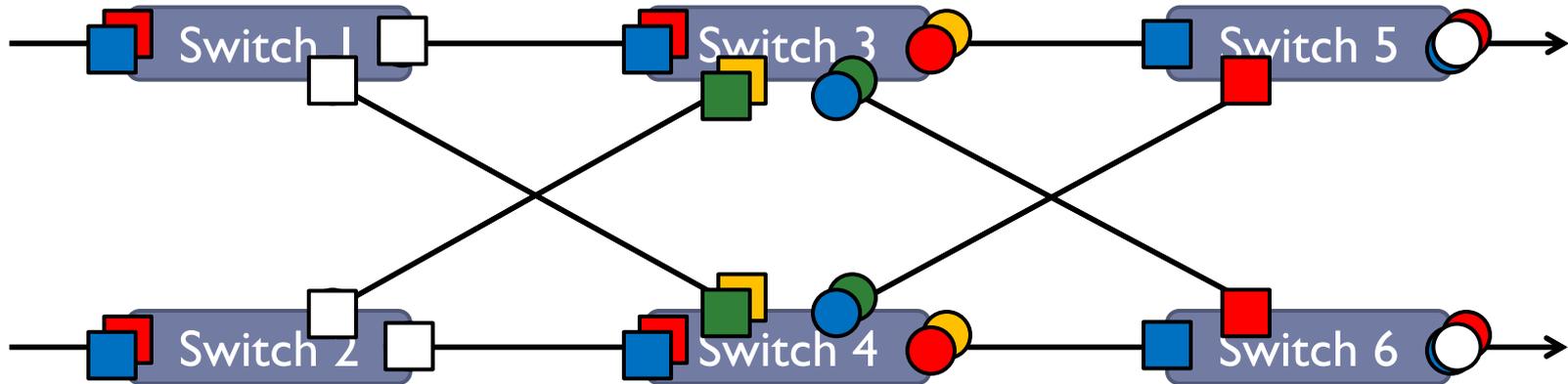
3) *Linear interpolation*: compute per-packet latency estimates at the latency estimator

4) Per-flow estimates by aggregating per-packet estimates



# Full vs. Partial deployment

□ RLI Sender (Reference Packet Injector)    ○ RLI Receiver (Latency Estimator)

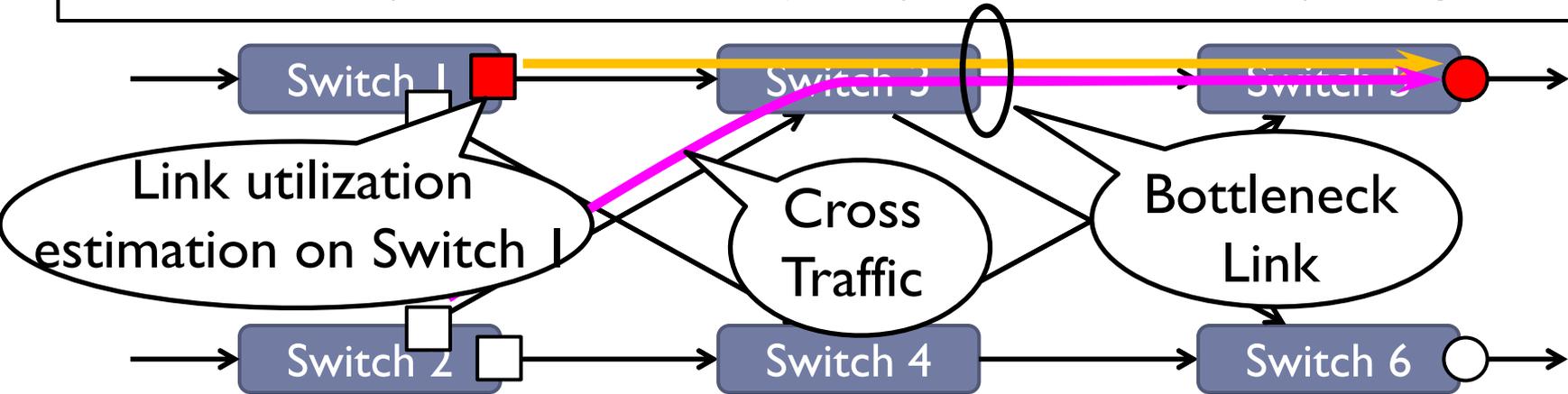


- ▶ Full deployment: 16 RLI sender-receiver pairs
- ▶ Partial deployment: 4 RLI senders + 2 RLI receivers
- ▶ 81.25 % deployment cost reduction



# Case 1: Presence of cross traffic

□ RLI Sender (Reference Packet Injector)    ○ RLI Receiver (Latency Estimator)

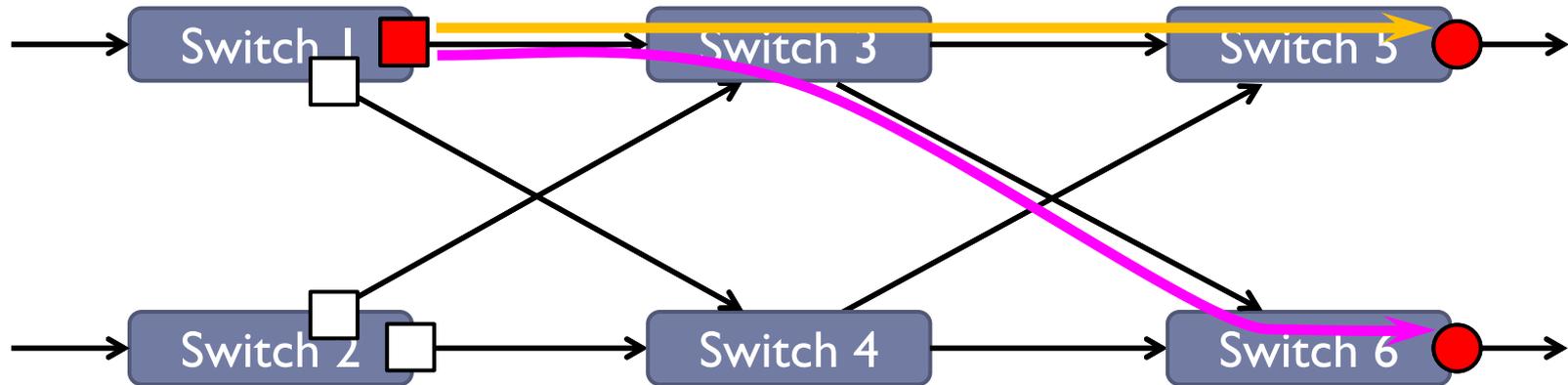


- ▶ **Issue:** Inaccurate link utilization estimation at the sender leads to high reference packet injection rate
- ▶ **Approach**
  - ▶ Not actively addressing the issue
  - ▶ Evaluation shows no much impact on packet loss rate increase
  - ▶ Details in the paper



## Case 2: RLI Sender side

□ RLI Sender (Reference Packet Injector)    ○ RLI Receiver (Latency Estimator)

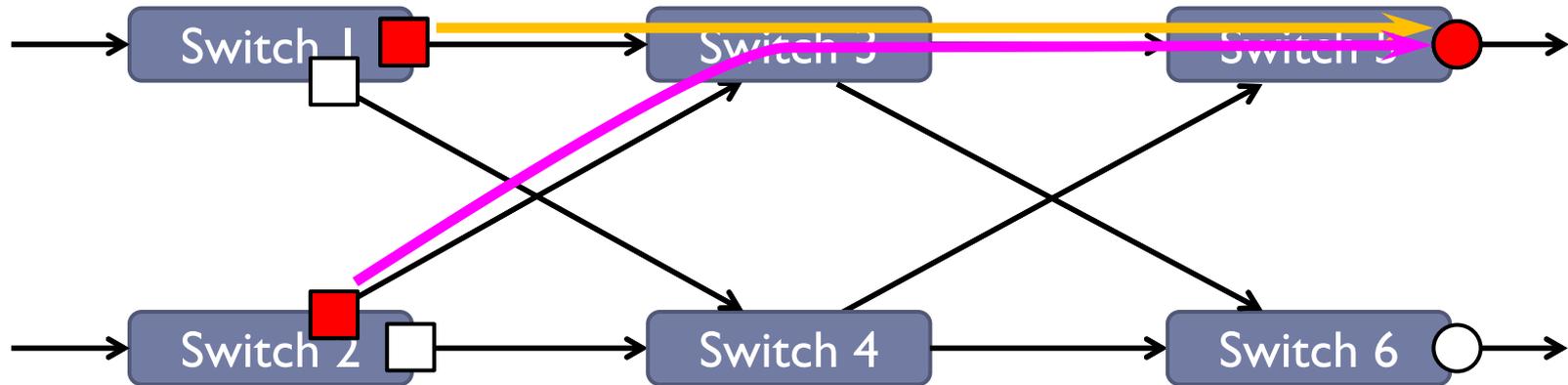


- ▶ **Issue:** Traffic may take different routes at an intermediate switch
- ▶ **Approach:** Sender sends reference packets to all receivers



# Case 3: RLI Receiver side

□ RLI Sender (Reference Packet Injector)    ○ RLI Receiver (Latency Estimator)

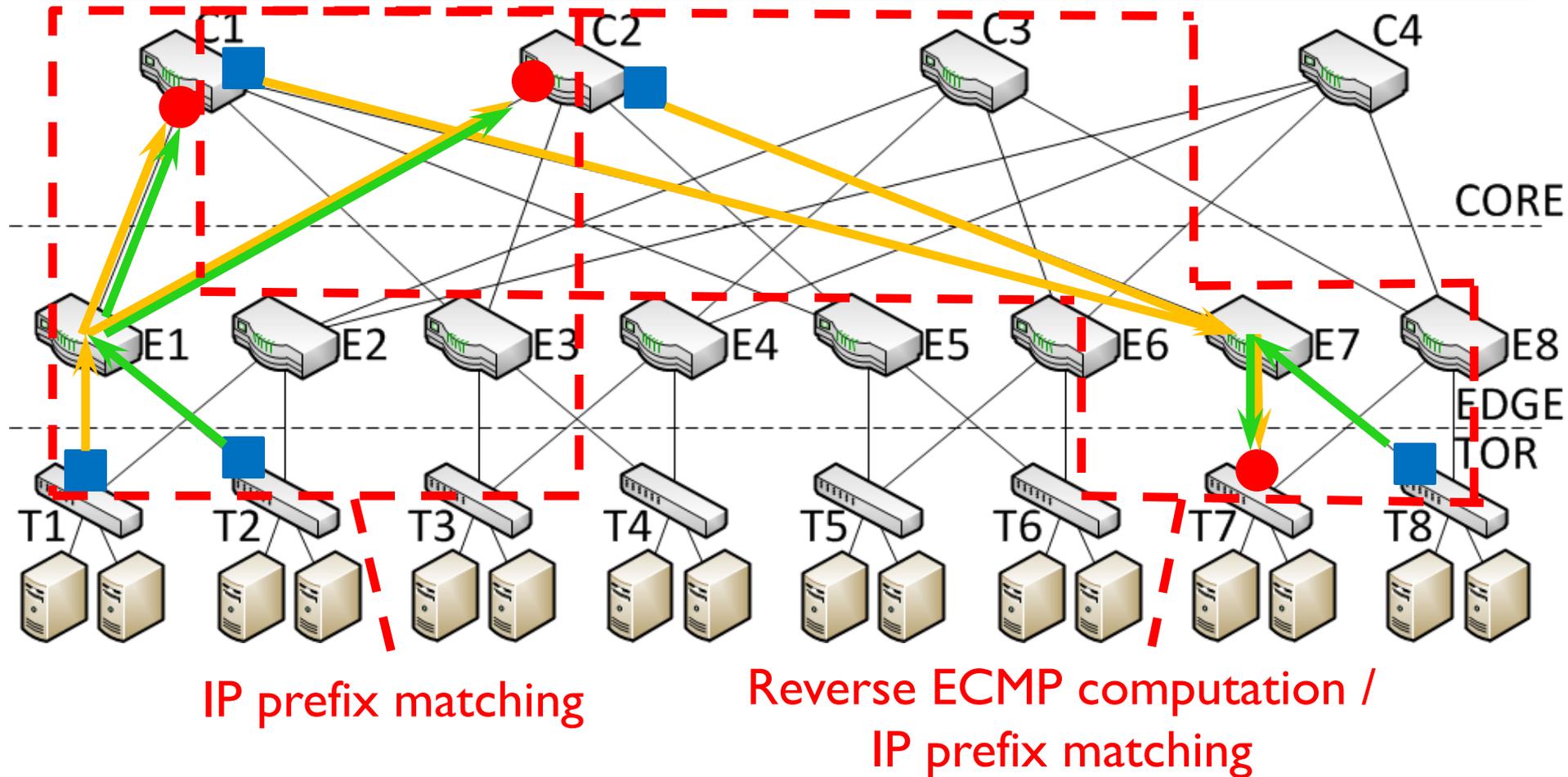


- ▶ **Issue:** Hard to associate reference packets and regular packets that traversed the same path
- ▶ **Approaches**
  - ▶ **Packet marking:** requires native support from routers
  - ▶ **Reverse ECMP computation:** 'reverse' engineer intermediate routes using ECMP hash function
  - ▶ **IP prefix matching** at limited situation



# Deployment example in fat-tree topology

□ RLI Sender (Reference Packet Injector)    ○ RLI Receiver (Latency Estimator)

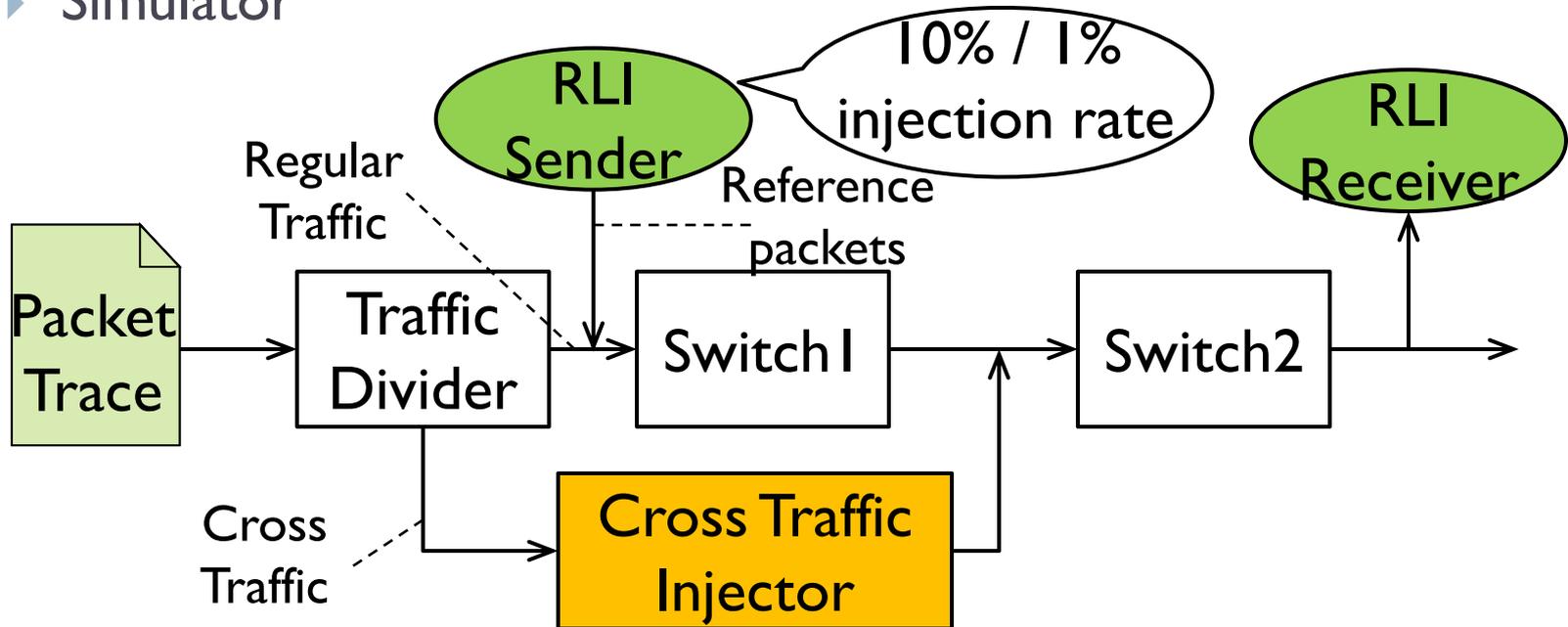


# Evaluation

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## ▶ Simulation setup

- ▶ Trace: regular traffic (22.4M pkts) + cross traffic (70M pkts)
- ▶ Simulator



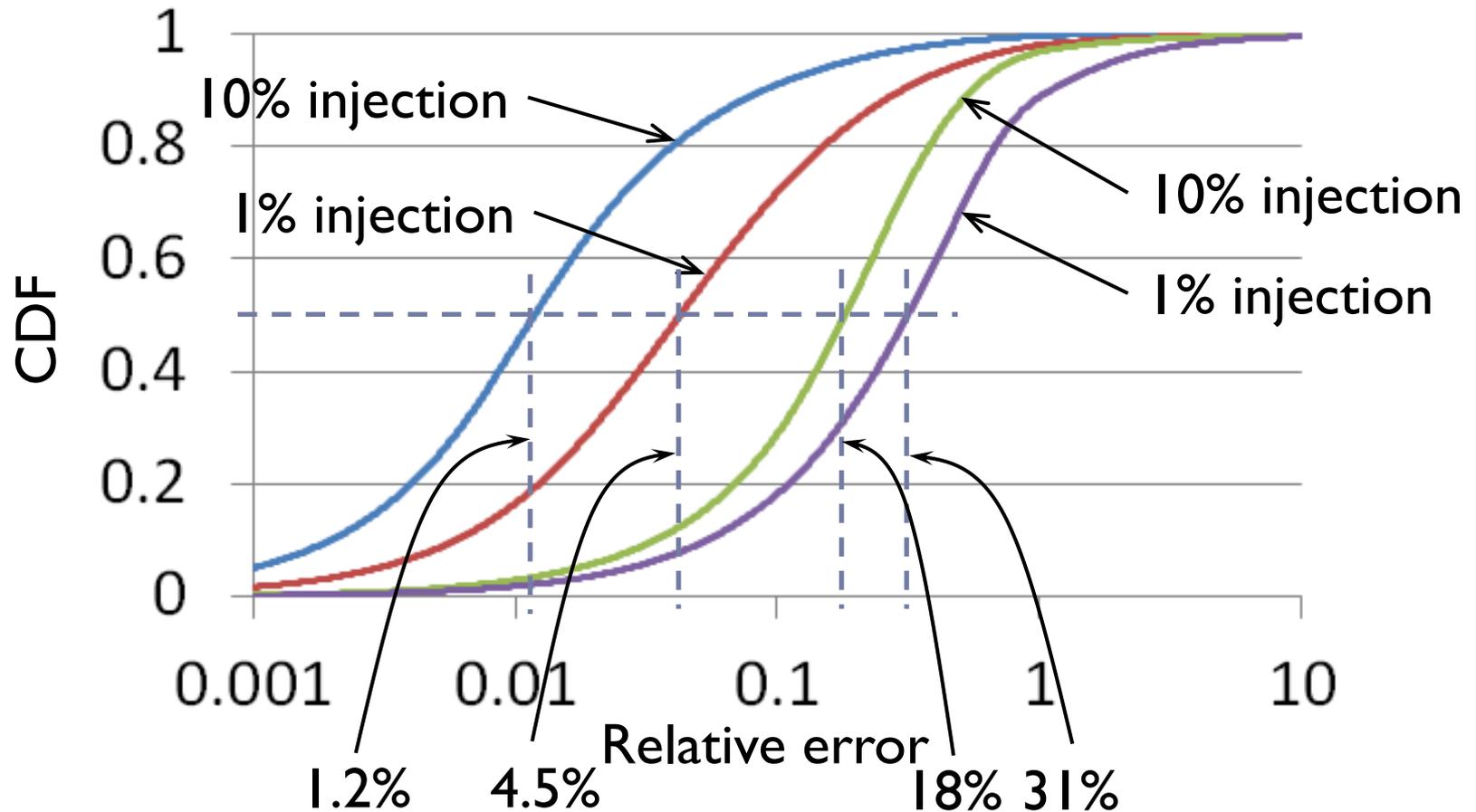
## ▶ Results

- ▶ Accuracy of per-flow latency estimates
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# Accuracy of per-flow latency estimates

Bottleneck link utilization: ~~83%~~ 83%



# Summary

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- ▶ **Low latency applications in data centers**
  - ▶ Localization of latency anomaly is important
- ▶ **RLL provides flow-level latency statistics, but full deployment (i.e., all routers/switches) cost is expensive**
- ▶ **Proposed a solution enabling partial deployment of RLL**
  - ▶ No too much loss in localization granularity (i.e., every other router)



Thank you! Questions?

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