## Annulus: A Dual Congestion Control Loop for Datacenter and WAN Traffic Aggregates

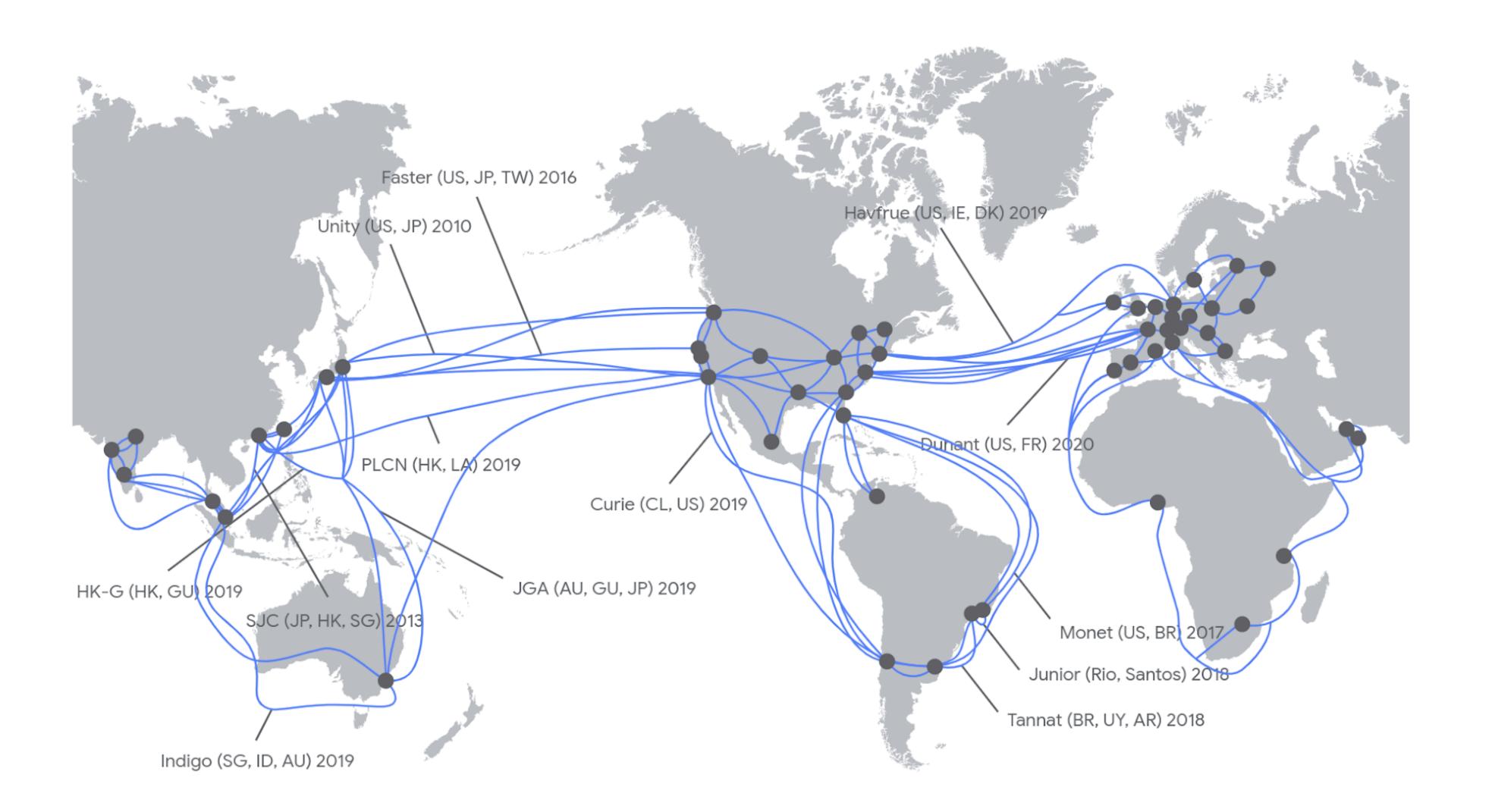
**Ahmed Saeed,** Varun Gupta, Prateesh Goyal, Milad Sharif, Rong Pan, Mostafa Ammar, Ellen Zegura, Keon Jang, Mohammad Alizadeh, Abdul Kabbani, Amin Vahdat



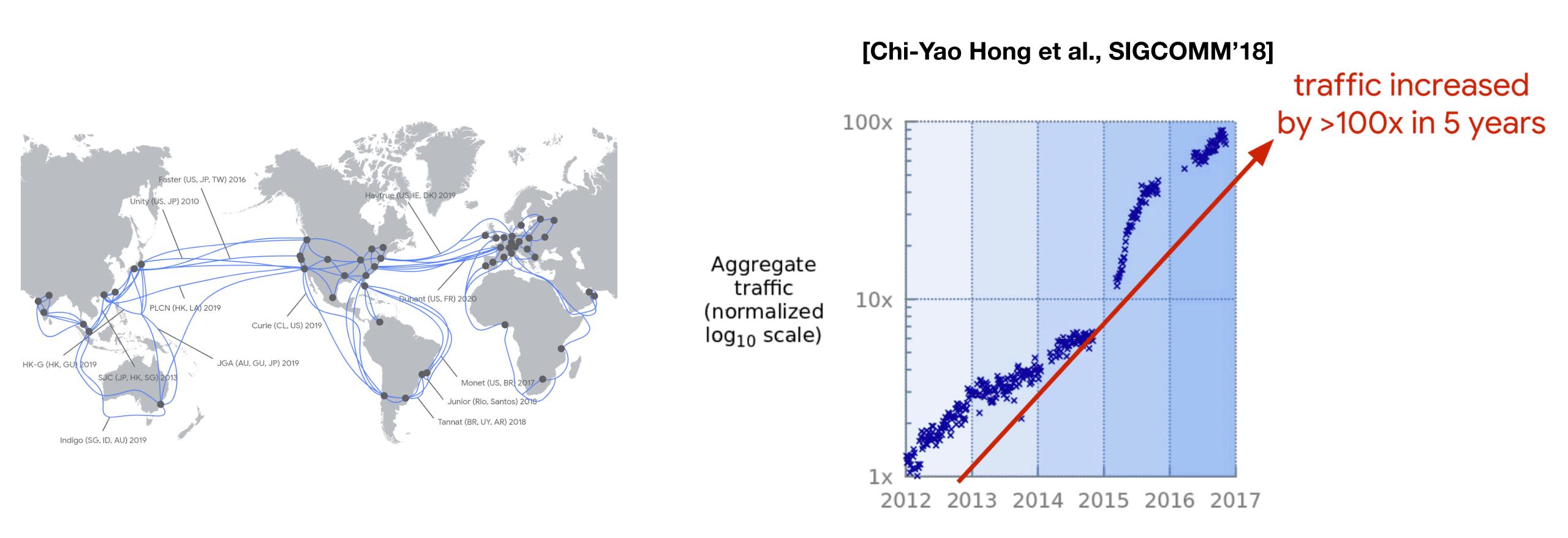




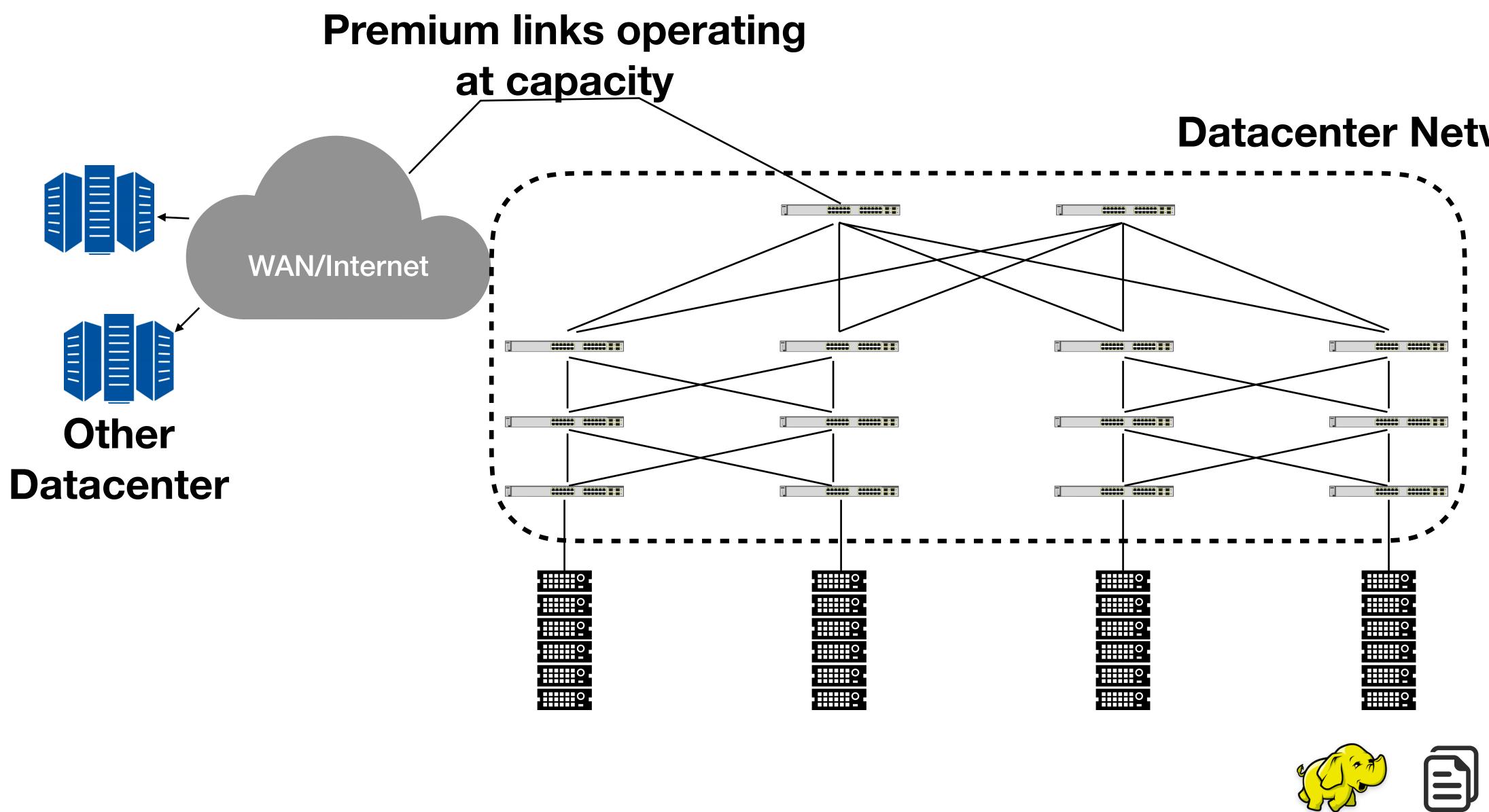




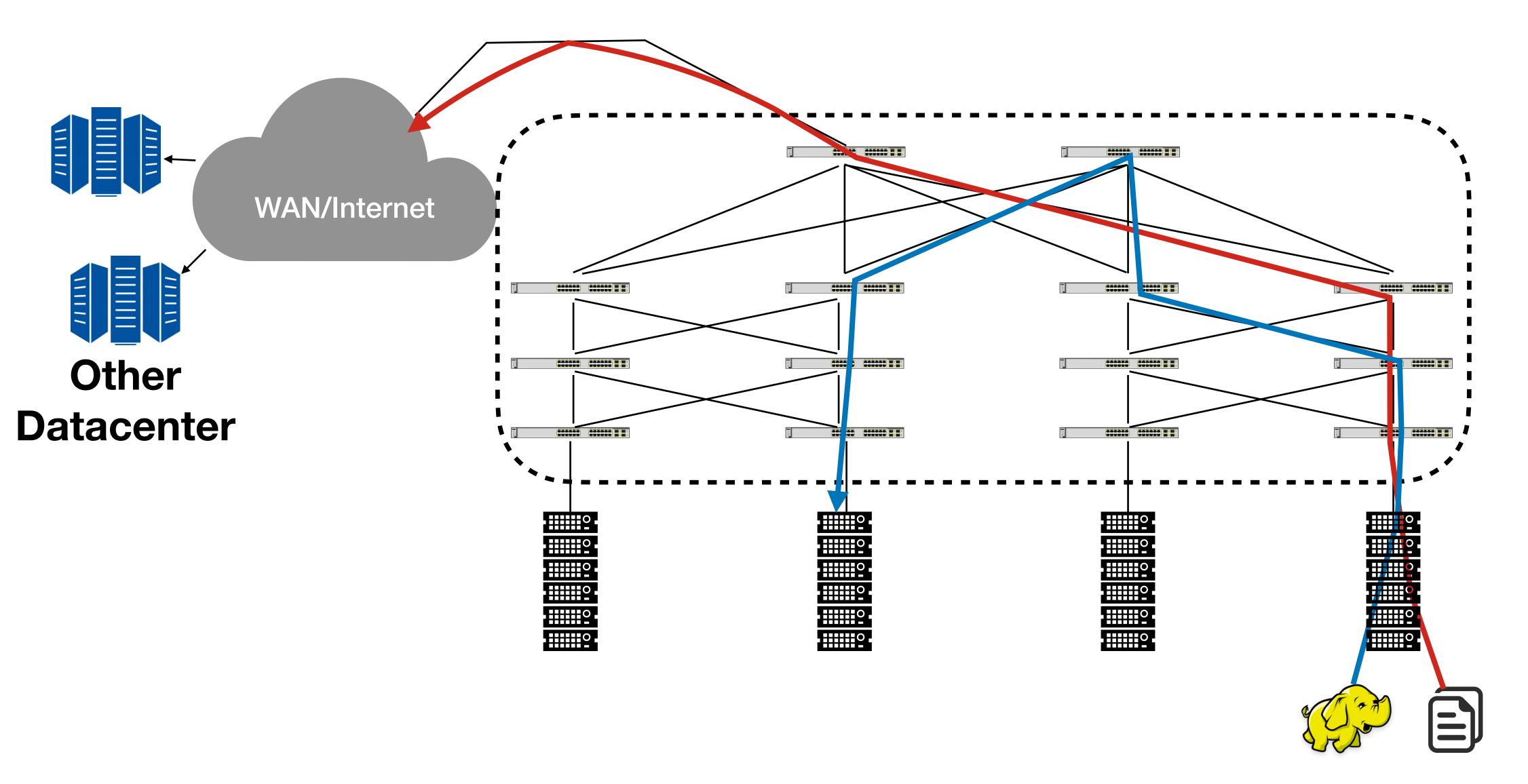
#### Google's WAN connects different regions through high-capacity links

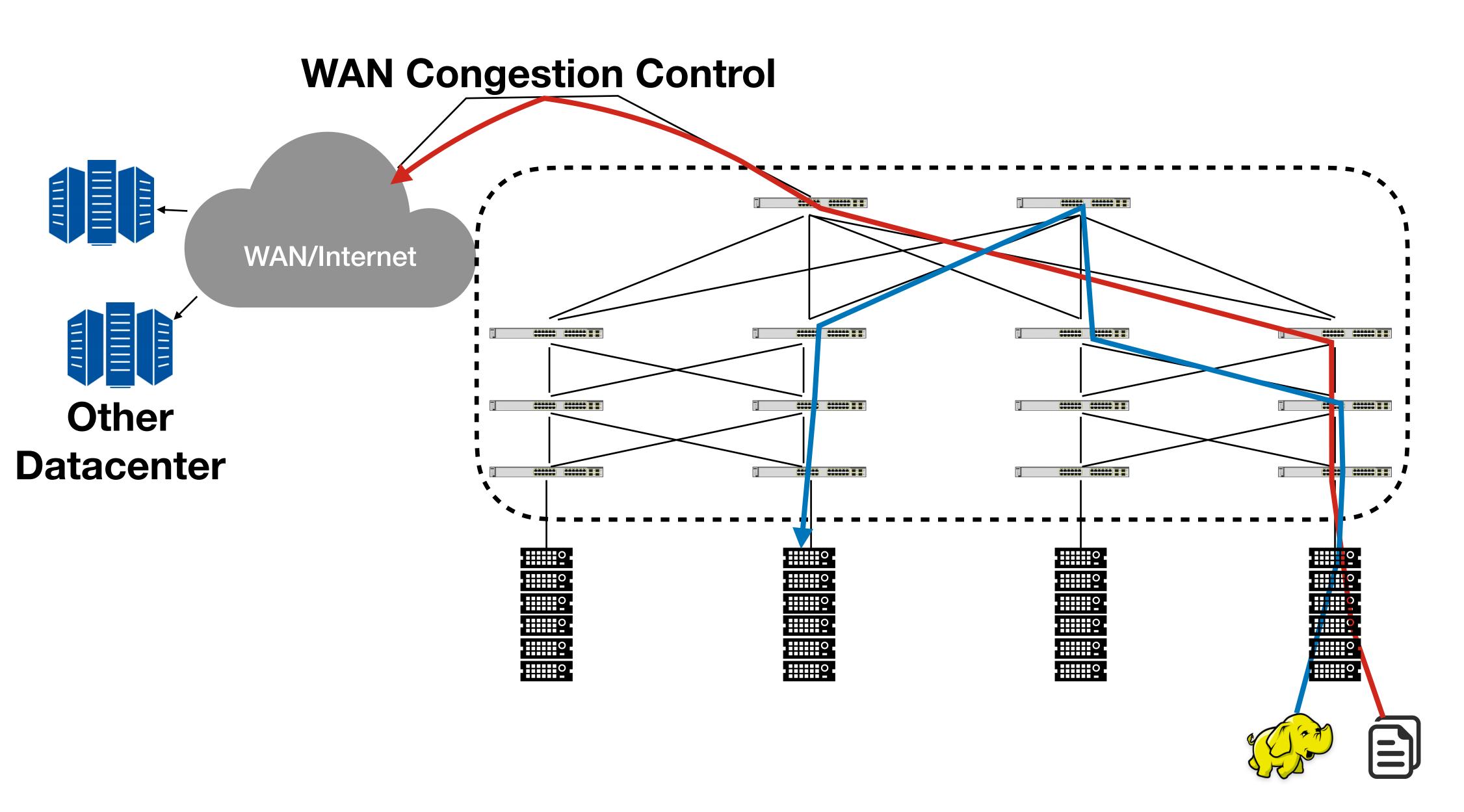


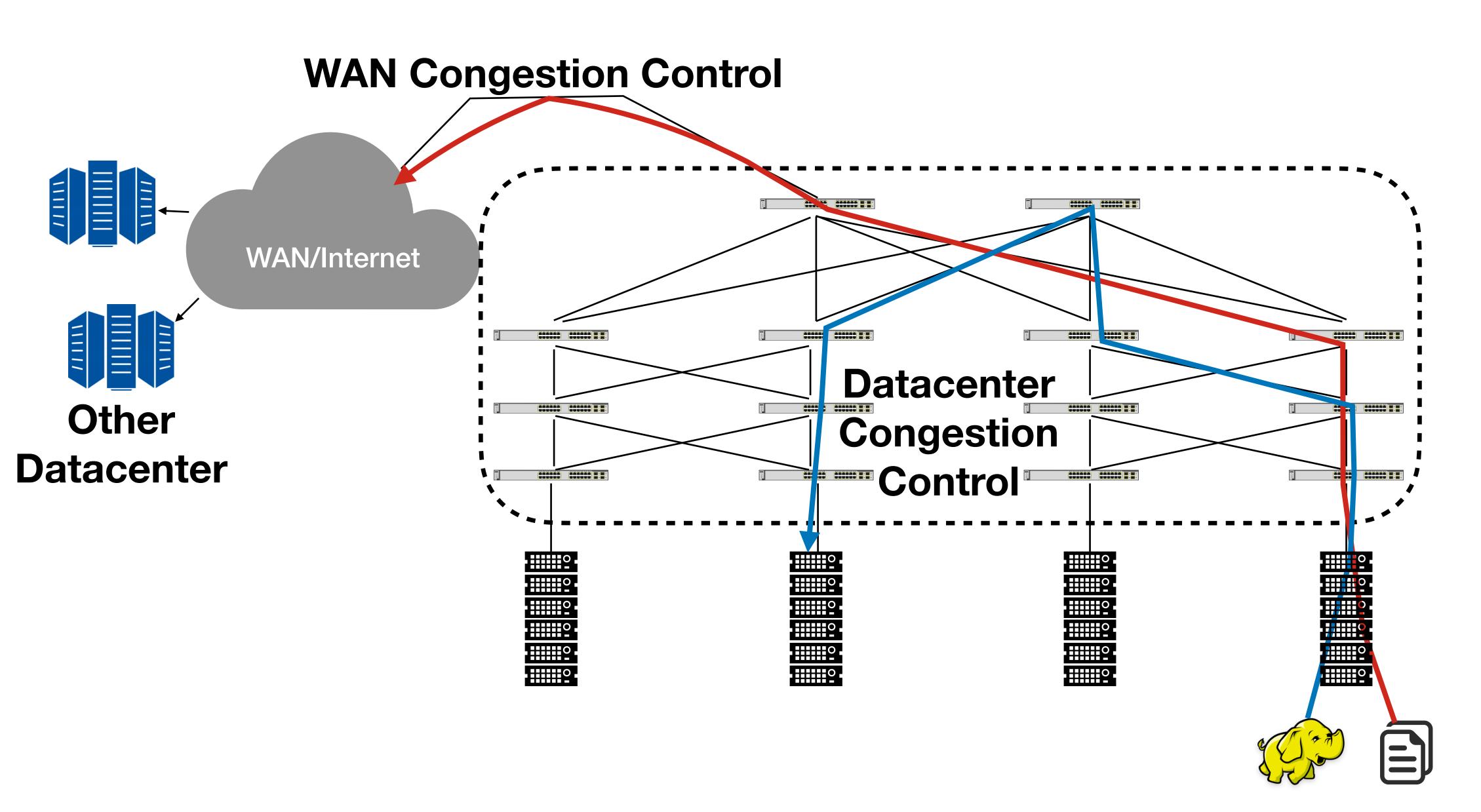
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#### **Datacenter Network**







#### Datacenter

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#### Data Center TCP (DCTCP)

Mohammad Alizadeh<sup>‡†</sup>, Albert Greenberg<sup>†</sup>, David A. Maltz<sup>†</sup>, Jitendra Padhye<sup>†</sup>, Parveen Patel<sup>†</sup>, Balaji Prabhakar<sup>‡</sup>, Sudipta Sengupta<sup>†</sup>, Murari Sridharan<sup>†</sup>

<sup>†</sup>Microsoft Research <sup>‡</sup>Stanford University {albert, dmaltz, padhye, parveenp, sudipta, muraris}@microsoft.com {alizade, balaji}@stanford.edu

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#### **Congestion Control for Large-Scale RDMA** Deployments

Yibo Zhu<sup>1,3</sup> Haggai Eran<sup>2</sup> Daniel Firestone<sup>1</sup> Chuanxiong Guo<sup>1</sup> Marina Lipshteyn<sup>1</sup> Yehonatan Liron<sup>2</sup> Jitendra Padhye<sup>1</sup> Shachar Raindel<sup>2</sup> Mohamad Haj Yahia<sup>2</sup> Ming Zhang<sup>1</sup> <sup>1</sup>Microsoft <sup>2</sup>Mellanox <sup>3</sup>U. C. Santa Barbara

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#### TIMELY: RTT-based Congestion Control for the Datacenter

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Radhika Mittal\*(UC Berkeley), Vinh The Lam, Nandita Dukkipati, Emily Blem, Hassan Wassel, Monia Ghobadi\*(Microsoft), Amin Vahdat, Yaogong Wang, David Wetherall, David Zats

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Measuring bottleneck bandwidth and round-trip propagation time.

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PCC: Re-architecting Congestion Control for Consistent High Performance

Mo Dong\*, Qingxi Li\*, Doron Zarchy\*\*, P. Brighten Godfrey\*, and Michael Schapira\*\*

\*University of Illinois at Urbana-Champaign \*\*Hebrew University of Jerusalem



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**Copa: Practical Delay-Based Congestion Control for the Internet** 

Venkat Arun and Hari Balakrishnan M.I.T. Computer Science and Artificial Intelligence Laboratory Email: {venkatar,hari}@mit.edu



## What about bottlenecks shared between WAN and datacenter traffic?



## WAN vs LAN in the Wild

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## WAN vs LAN in the Wild

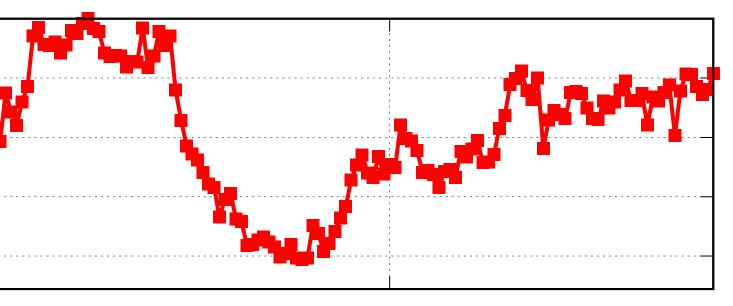
#### **Data Collected from** one of Google's clusters



# WAN vs LAN in the Wild Normalized Throughput 70 0 0 70 30 30

#### WAN Throughput

Day 1



#### Day 2 Time

#### **Data Collected from** one of Google's clusters

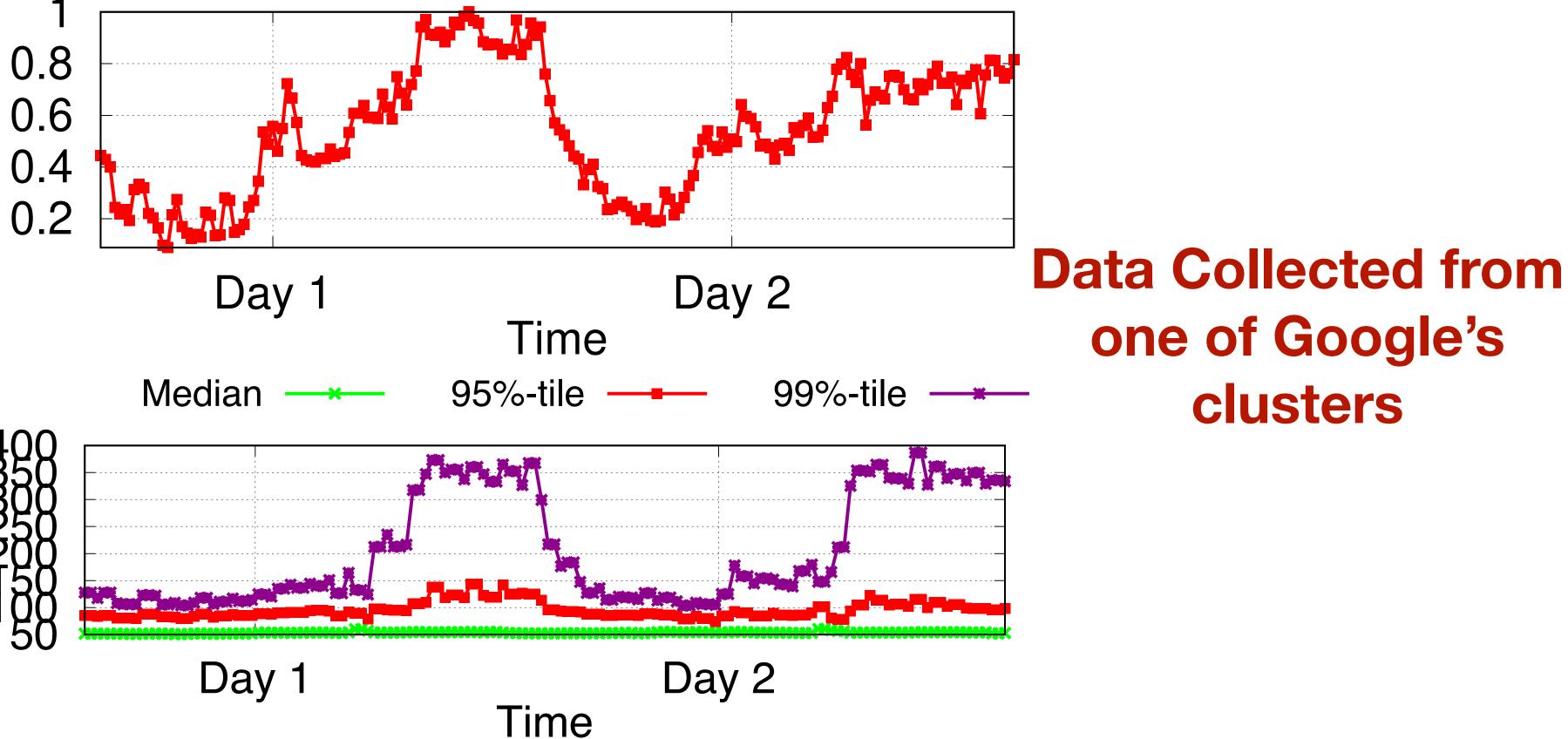


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#### Datacenter Latency

-atency (us)

WAN



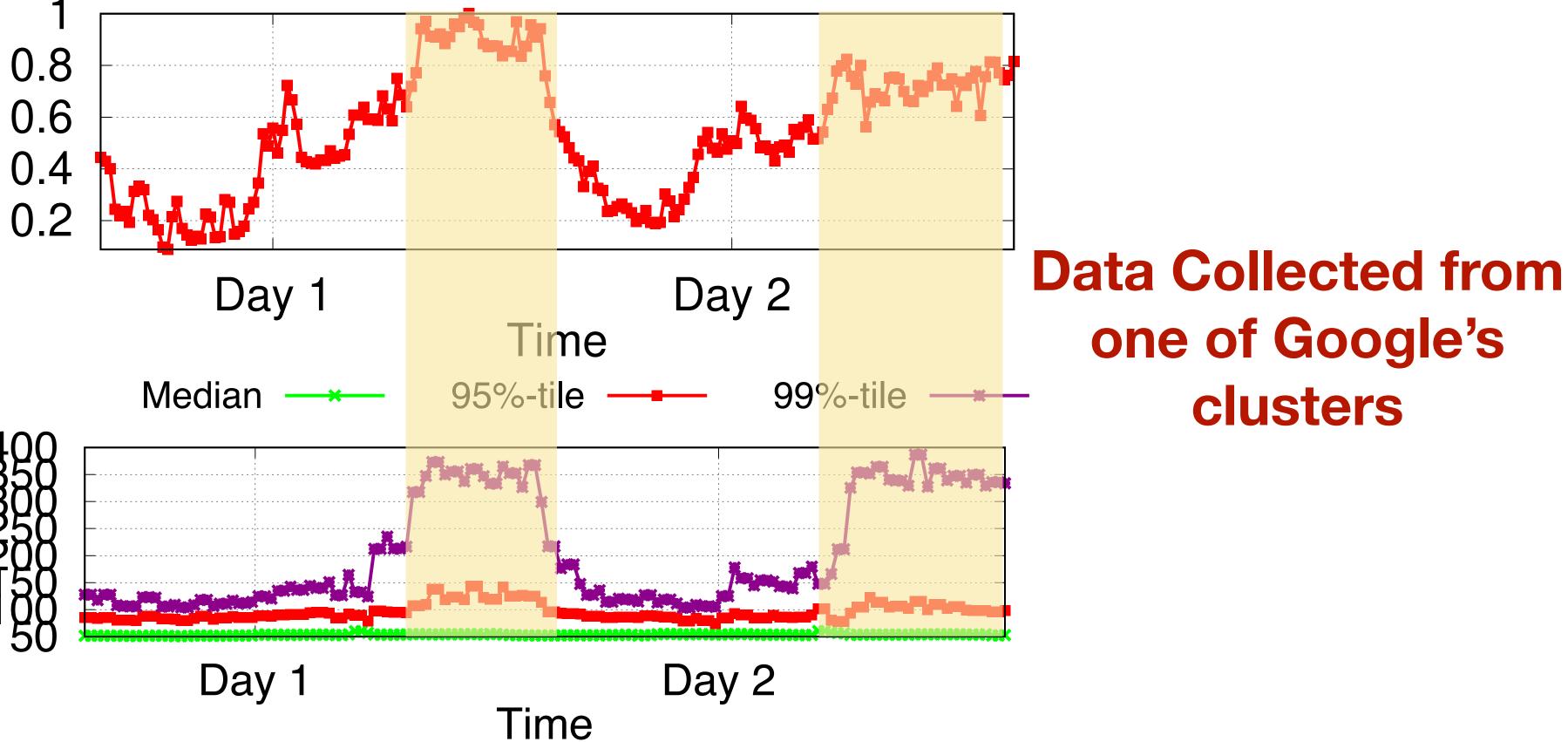


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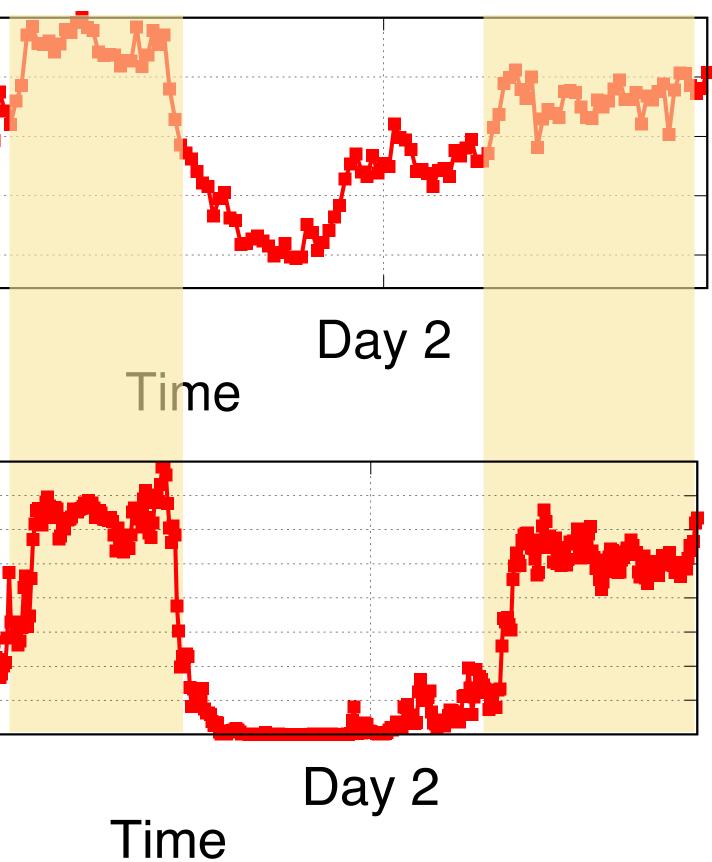
Day 1

0.4

0.2

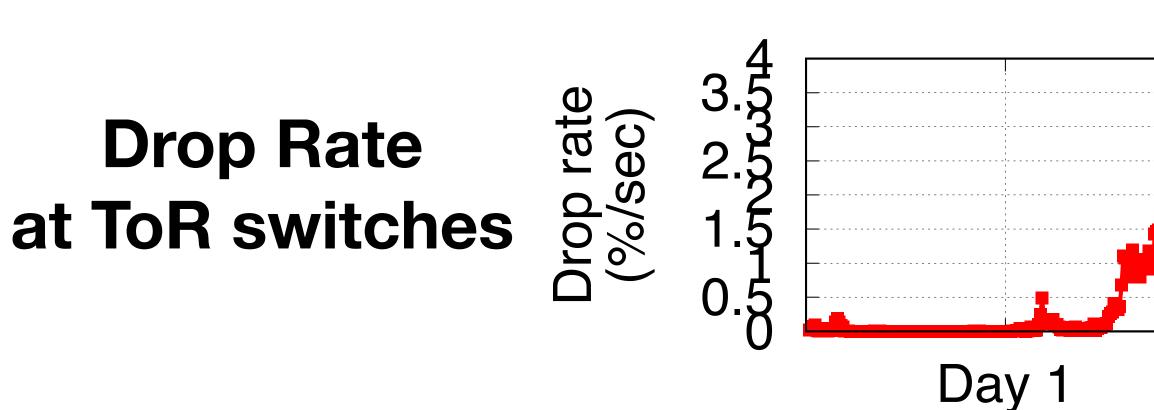
#### 453352 2.52 1.5 Drop rate (%/sec) **Drop Rate** at ToR switches 5 0

Day 1



## WAN vs LAN in the Wild Normalized Throughput 8.0 0.6

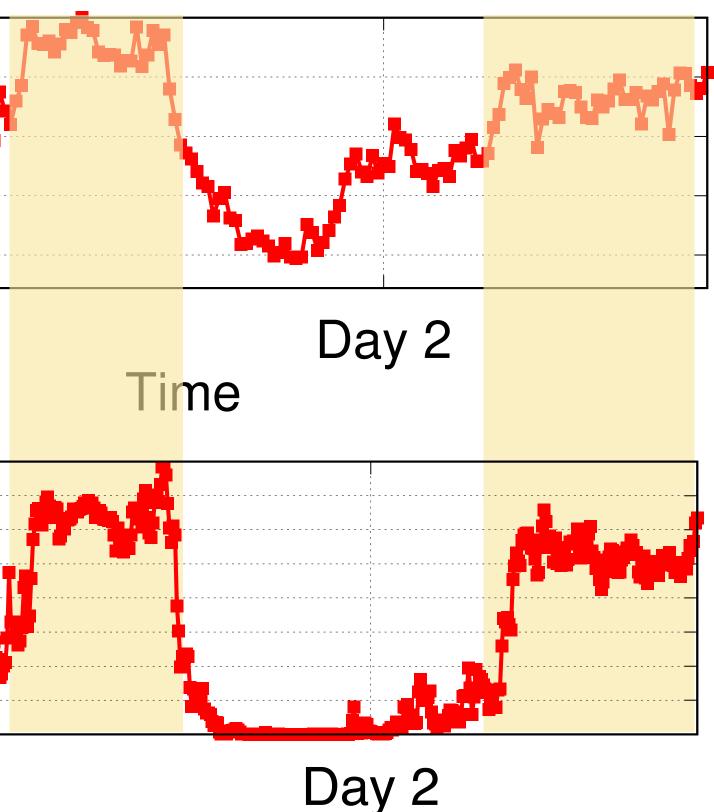
#### **WAN** Throughput



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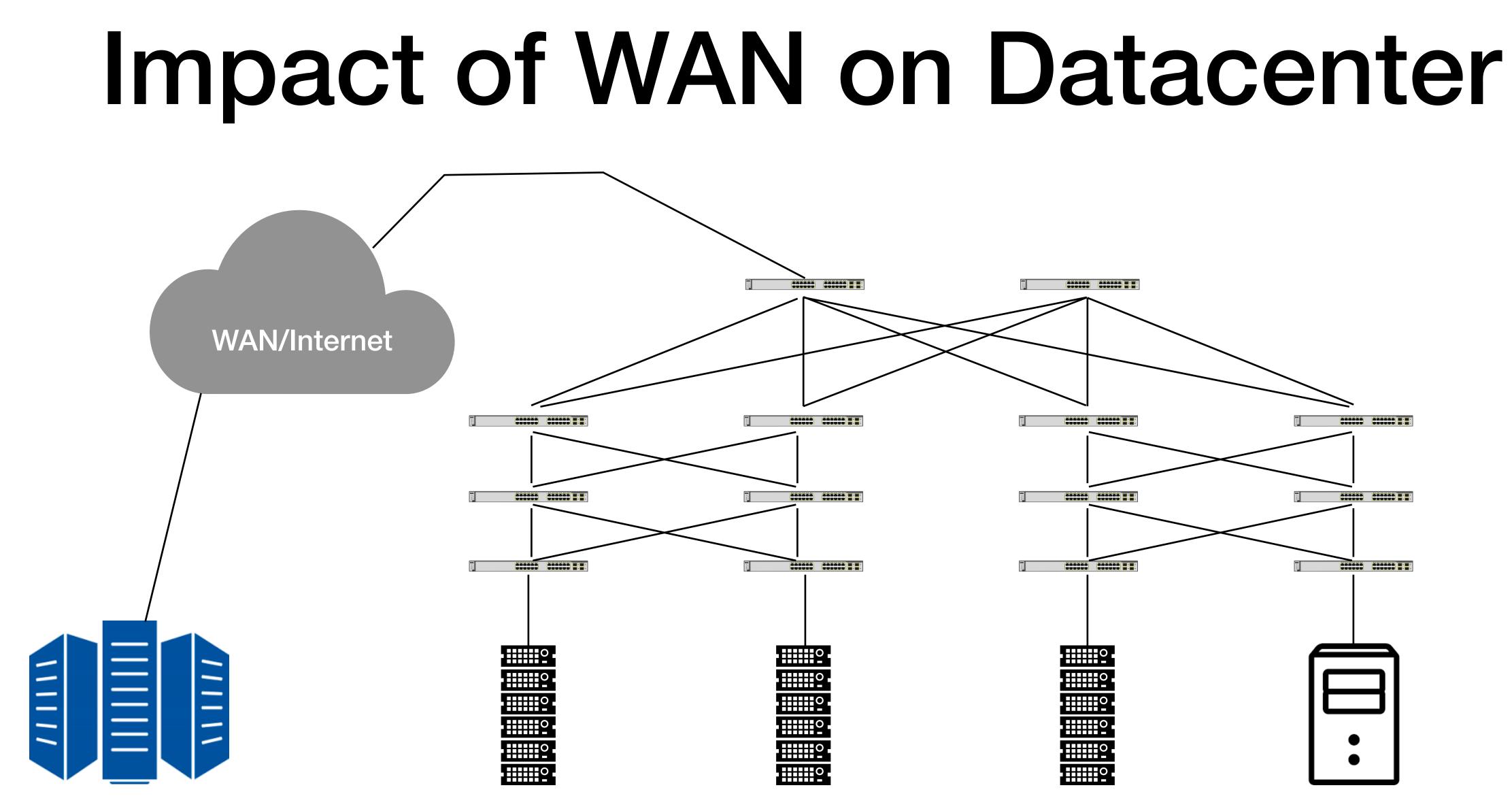
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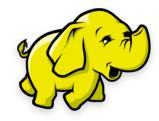


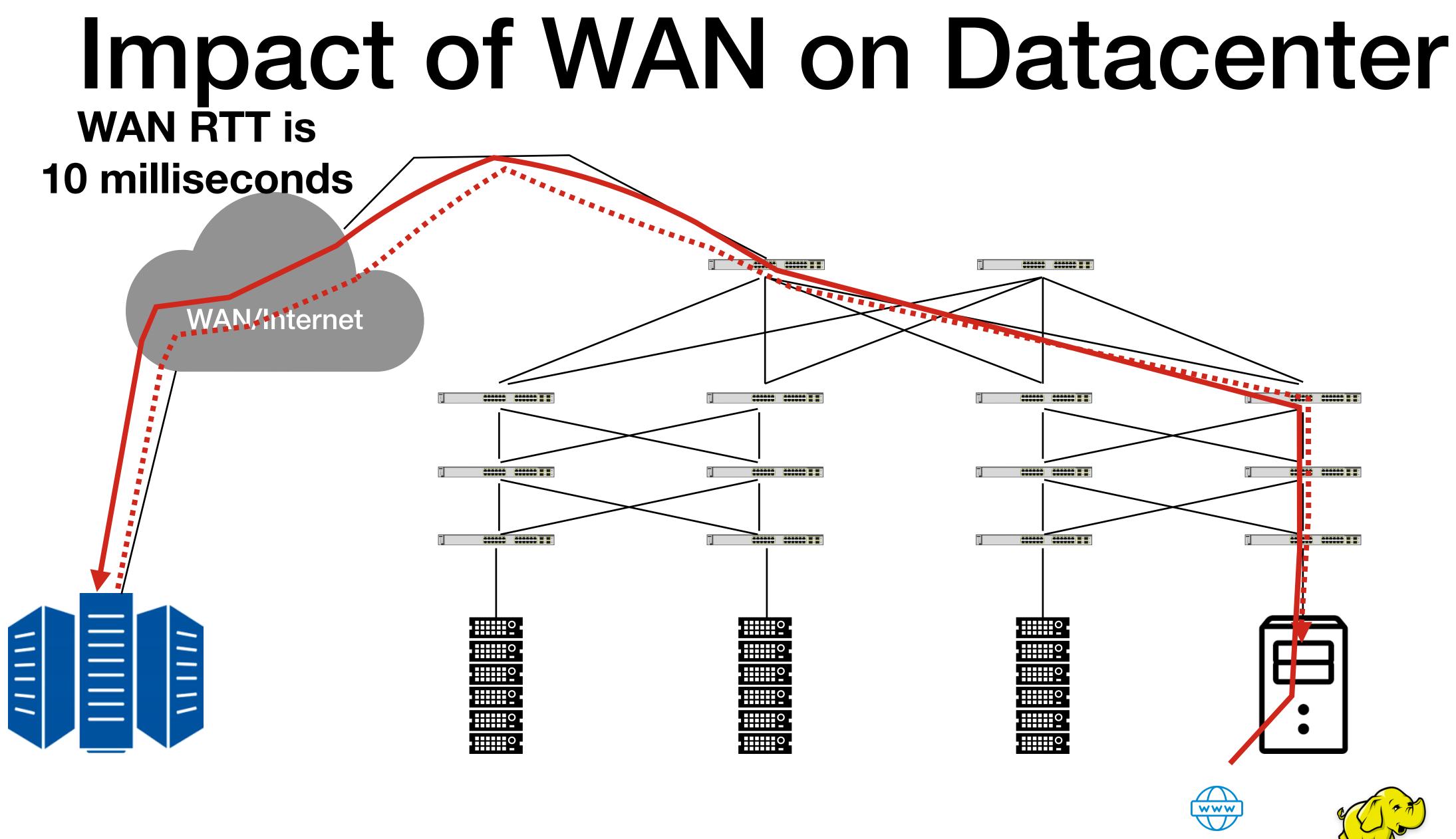
Time

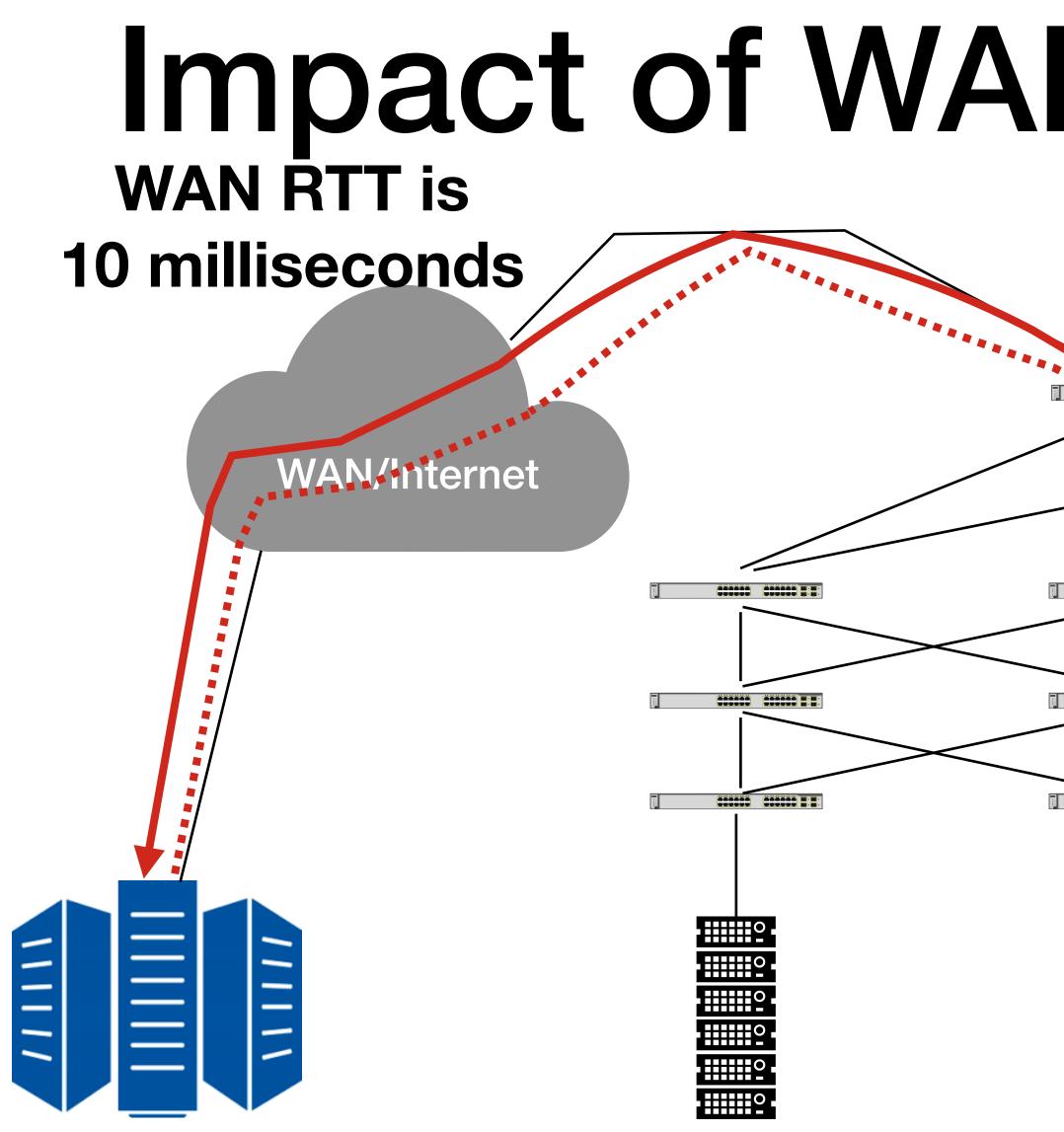
## WAN demand significantly impacts the latency and drop rate of datacenter traffic

## WAN traffic reaction is too slow to handle the fast dynamics of datacenter traffic

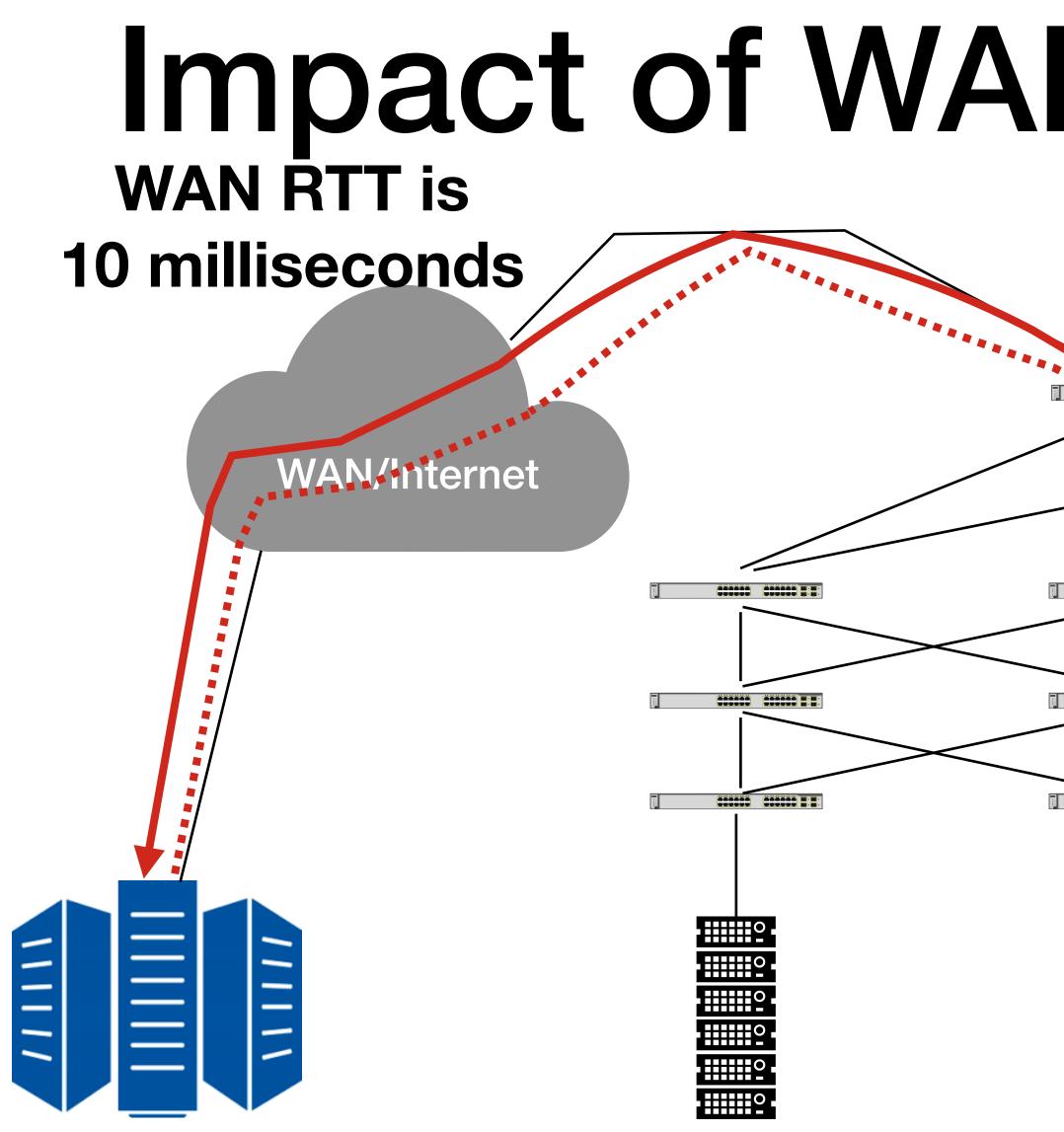




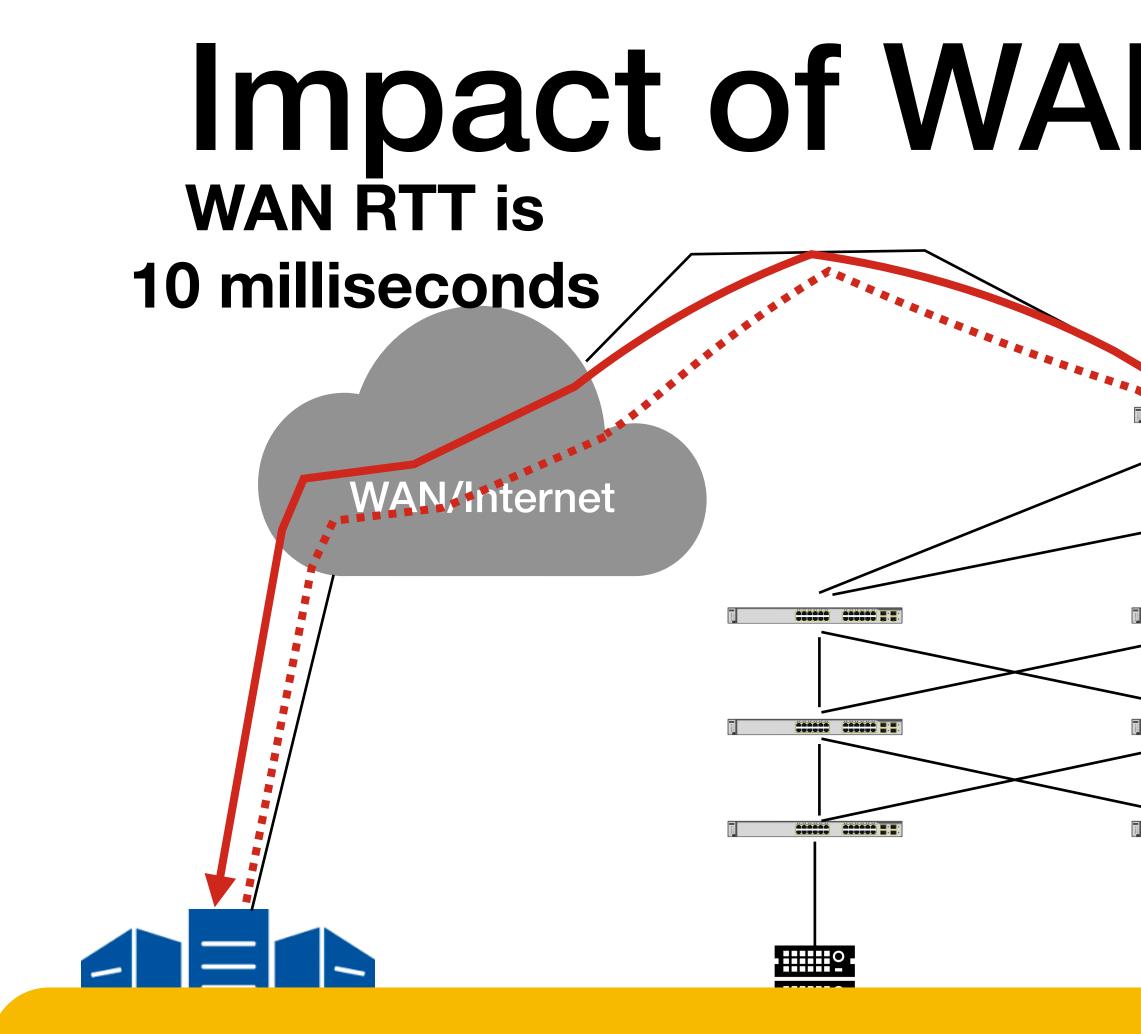




## Impact of WAN on Datacenter **Datacenter RTT is 10 microseconds** www



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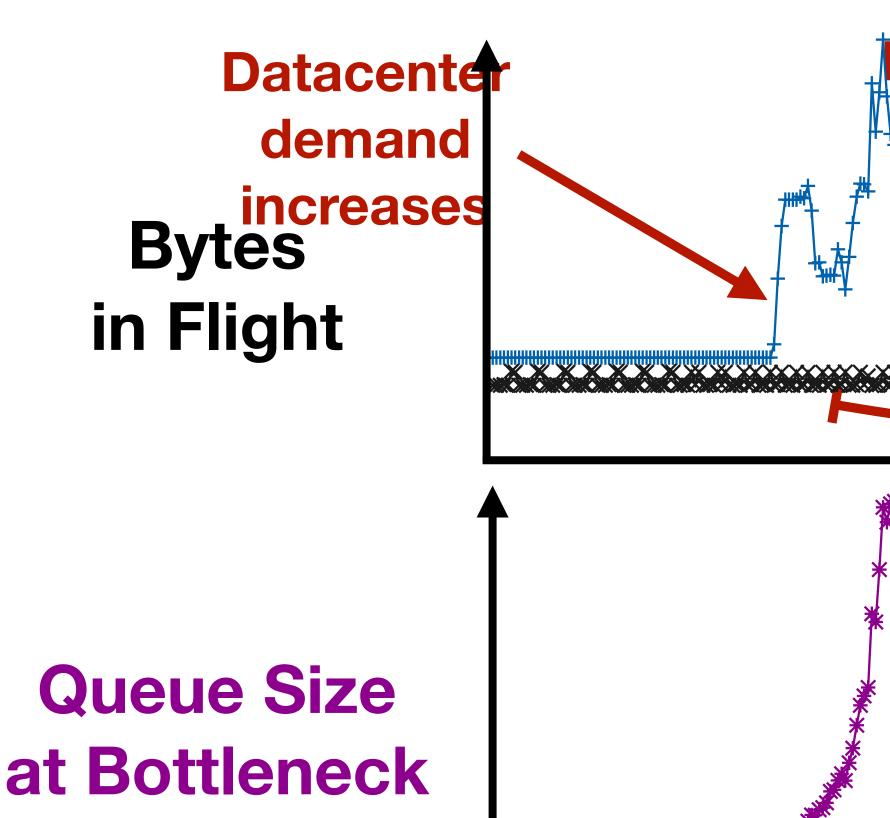
WAN will take a thousand datacenter RTTs to detect the problem, leaving datacenter to solely react to congestion

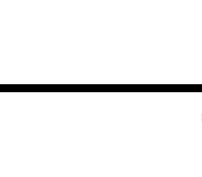


### **Example from Simulations**

Datacenter traffic and WAN traffic share a bottleneck

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### Datacenter traffic and WAN traffic share a bottleneck

**Datacenter congestion control** reacts to drain the queue

### WAN RTT

Queue build up as a result of congestion

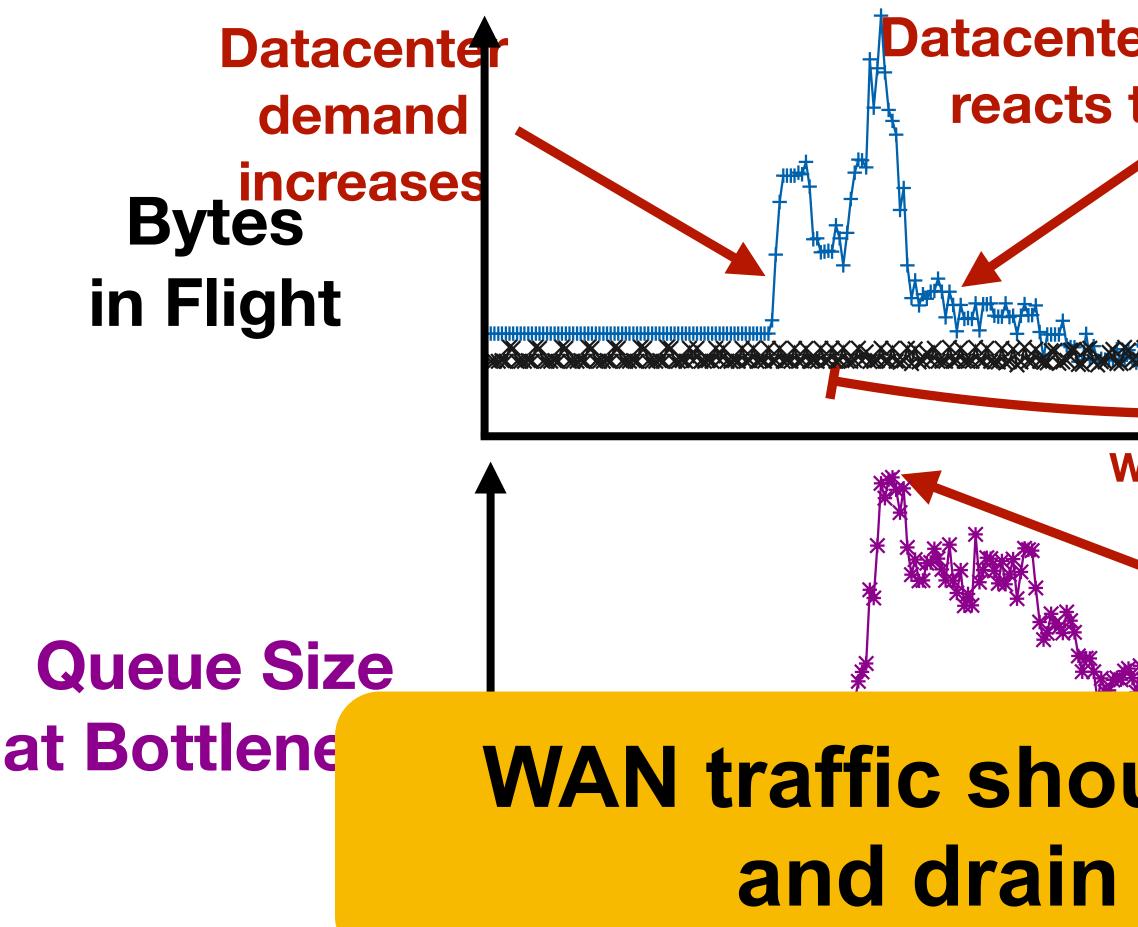






in Flight

### **Example from Simulations**



### Datacenter traffic and WAN traffic share a bottleneck

**Datacenter congestion control** reacts to drain the queue

- WAN RTT
  - Queue build up as a result of congestion

### WAN traffic should react to congestion and drain the queue faster





in Flight

Buffer sizing for WAN flows is proportional to BDP





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  - Short buffers can be problematic



### WAN BDP is **O(megabytes) per flow**



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- Better algorithms have smaller buffer requirements
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  - **BBR or DCTCP** Assuming available bandwidth is stable
- Bandwidth available to WAN flows changes at datacenter RTT timscale

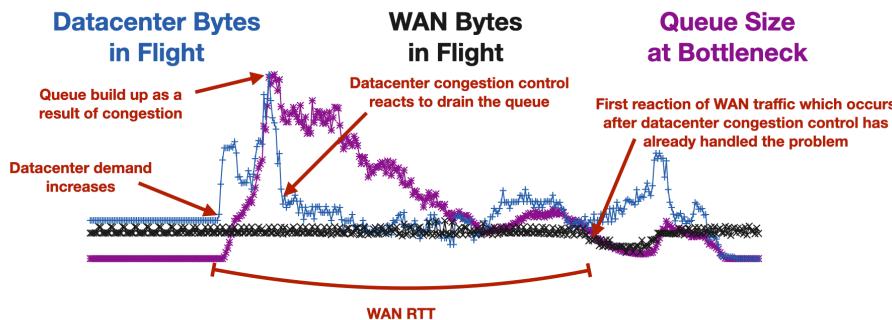


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WAN traffic suffers from excessive loss due to lack of buffering and rapid changes in available bandwidth

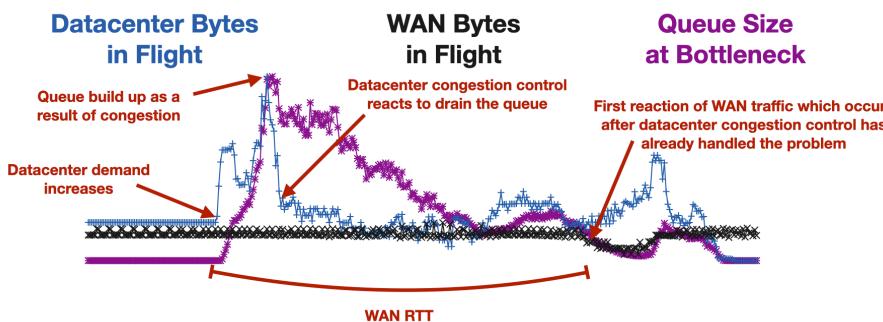




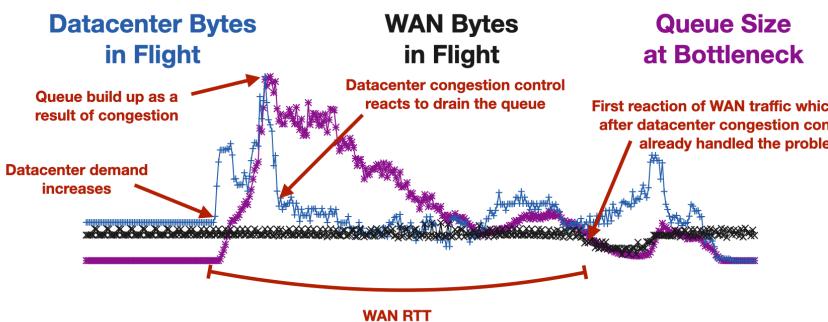


 WAN RTT is too large compared to datacenter dynamics

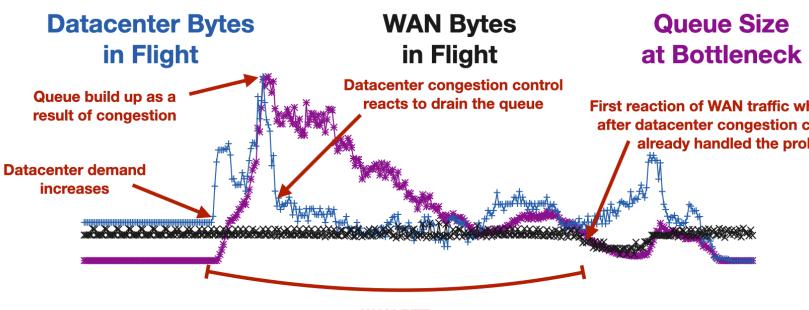
### Summary of Findings



- WAN RTT is too large compared to datacenter dynamics
  - Datacenter throughput suffers as it solely reacts to congestion

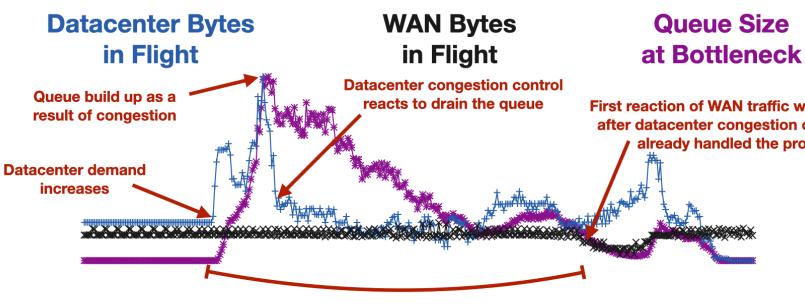


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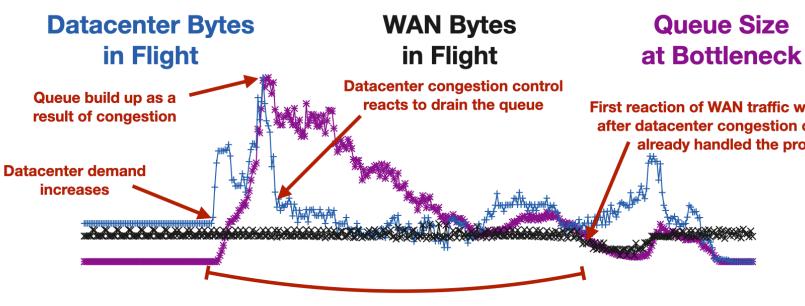
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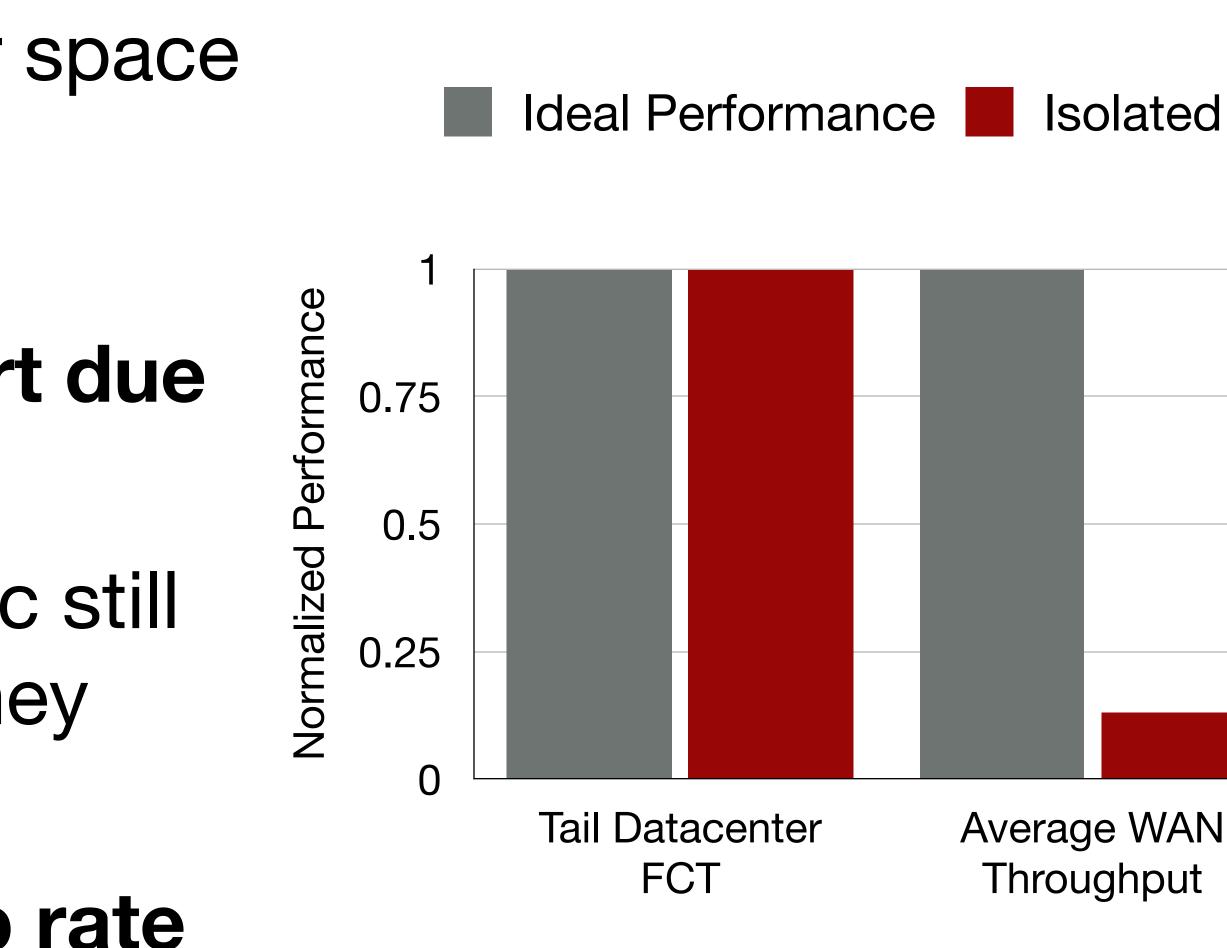
WAN RTT

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- Datacenter and WAN traffic still share bandwidth even if they don't share buffer space
  - Exacerbates WAN drop rate

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### How should we handle bottlenecks shared between WAN and datacenter traffic?



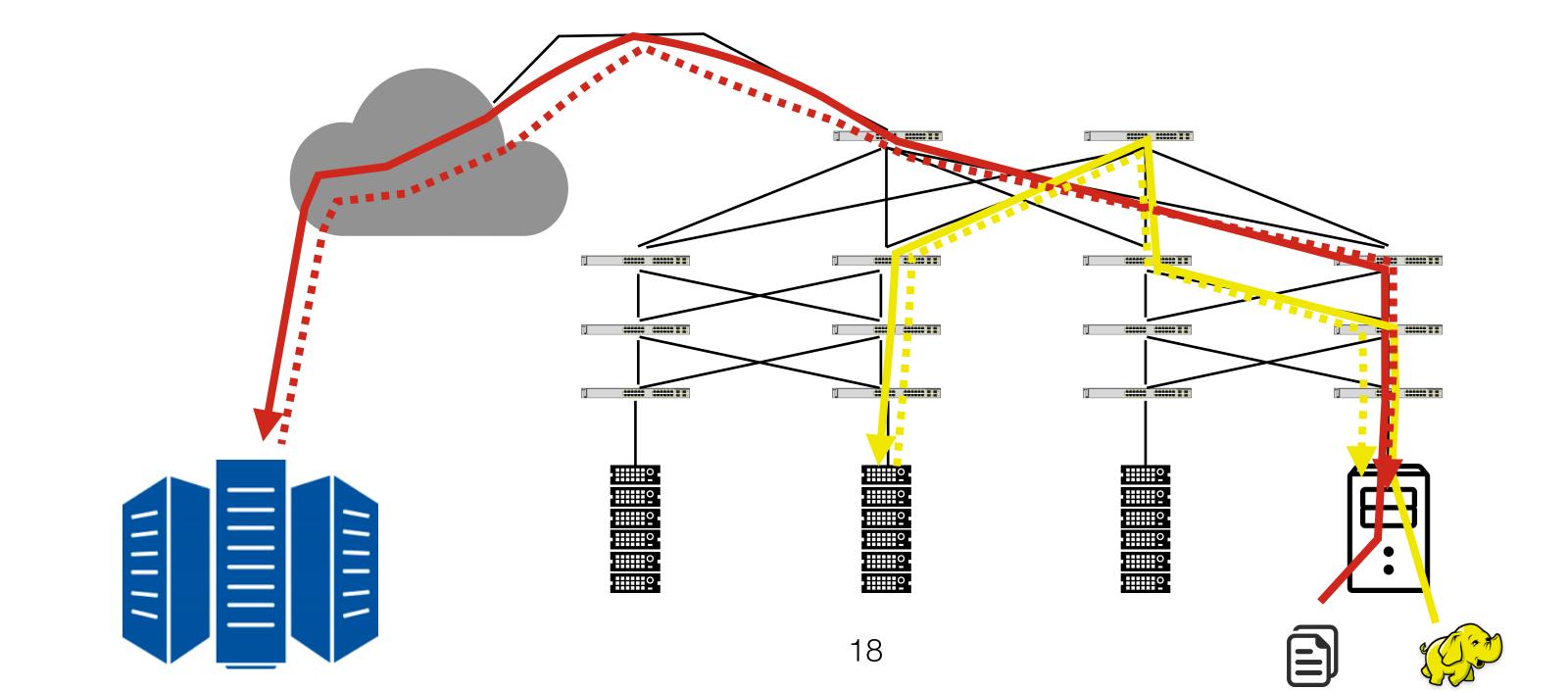
### How should we handle bottlenecks shared between WAN and datacenter traffic?

### How should we handle the rest of the bottlenecks?

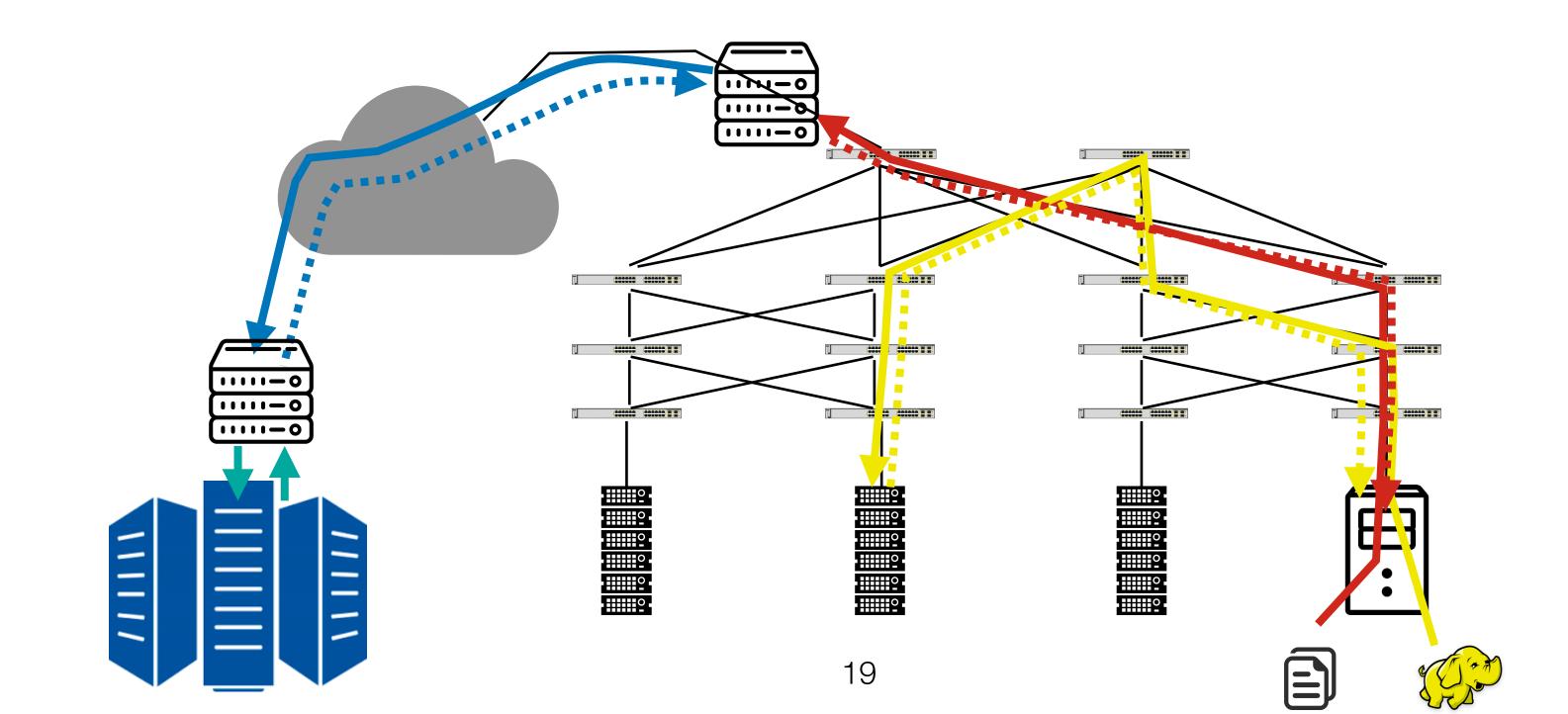


### Main Idea 🖌 Reduce WAN feedback delay

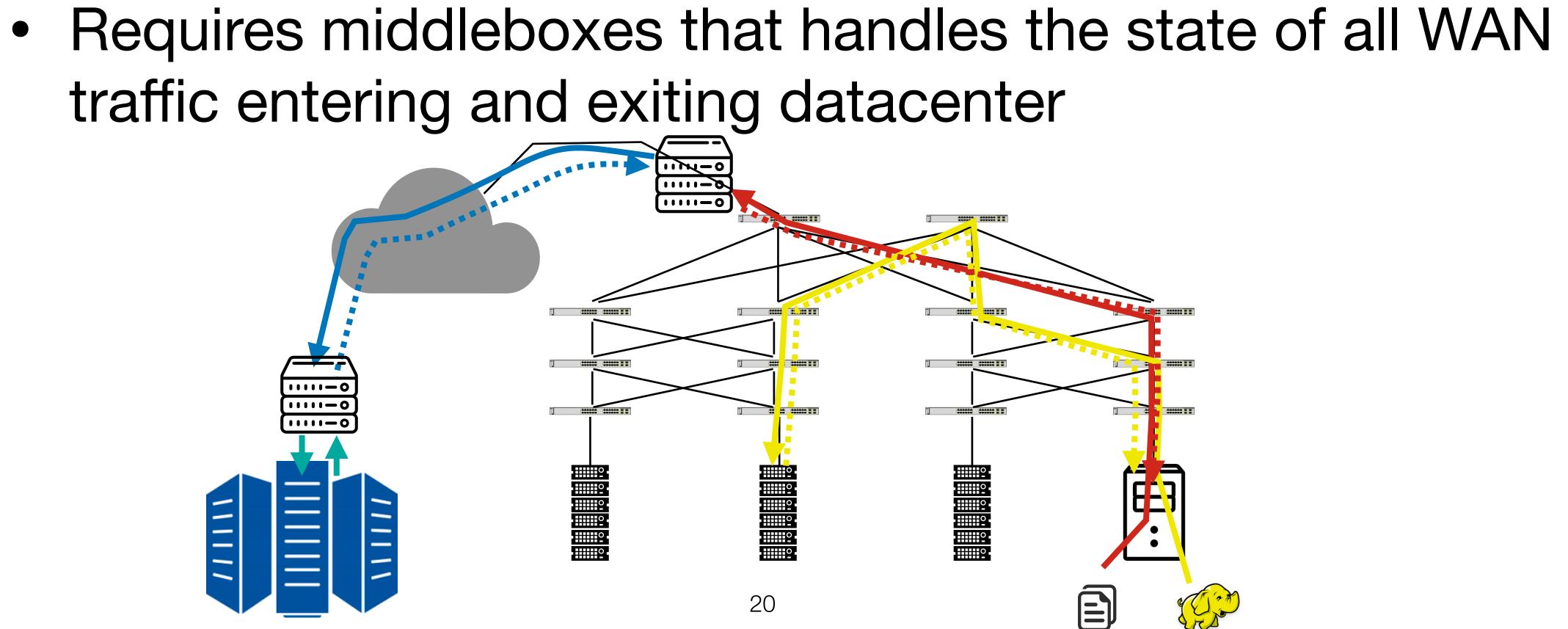
 Connection termination at the border of the datacenter



 Connection termination at the border of the datacenter



- Connection termination at the border of the datacenter

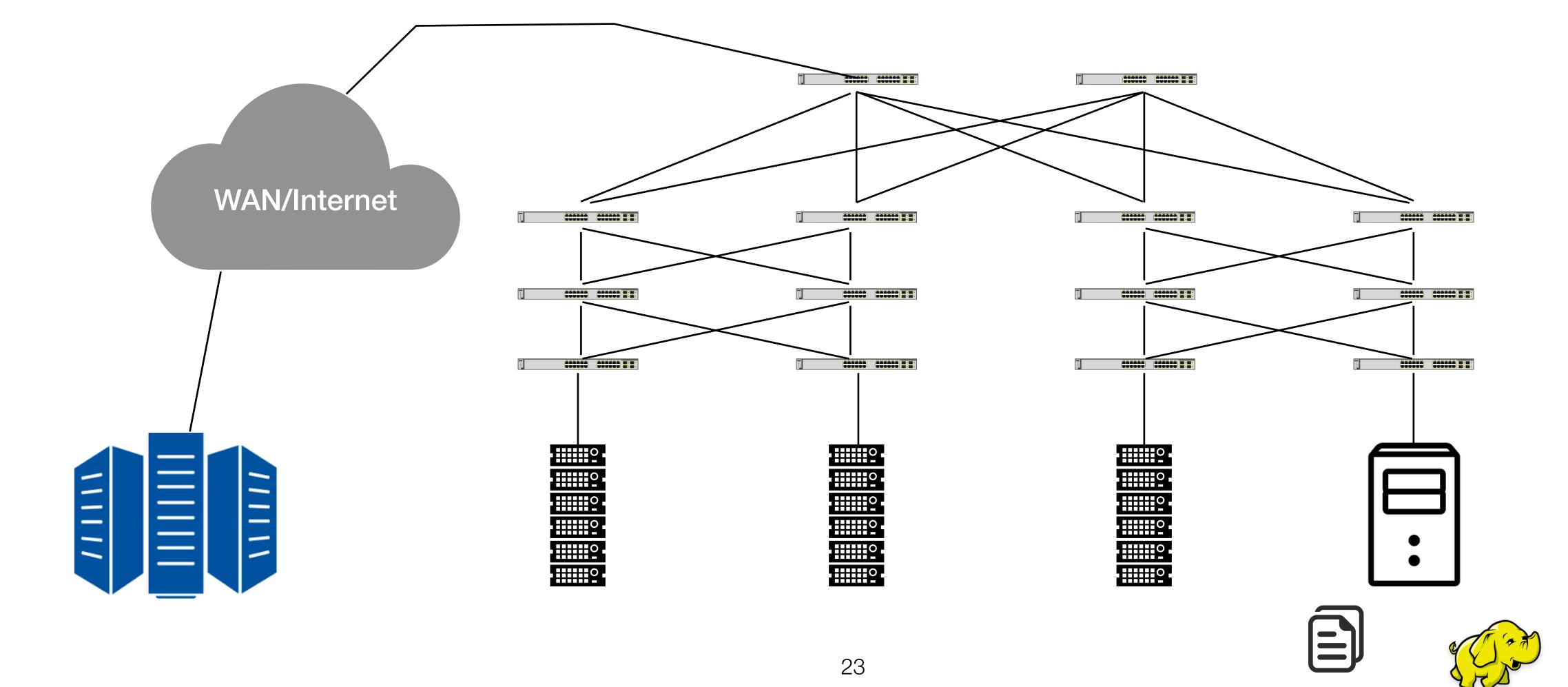


- Connection termination at the border of the datacenter
  - Requires middleboxes that handles the state of all WAN traffic entering and exiting datacenter
- Direct signal from the bottleneck

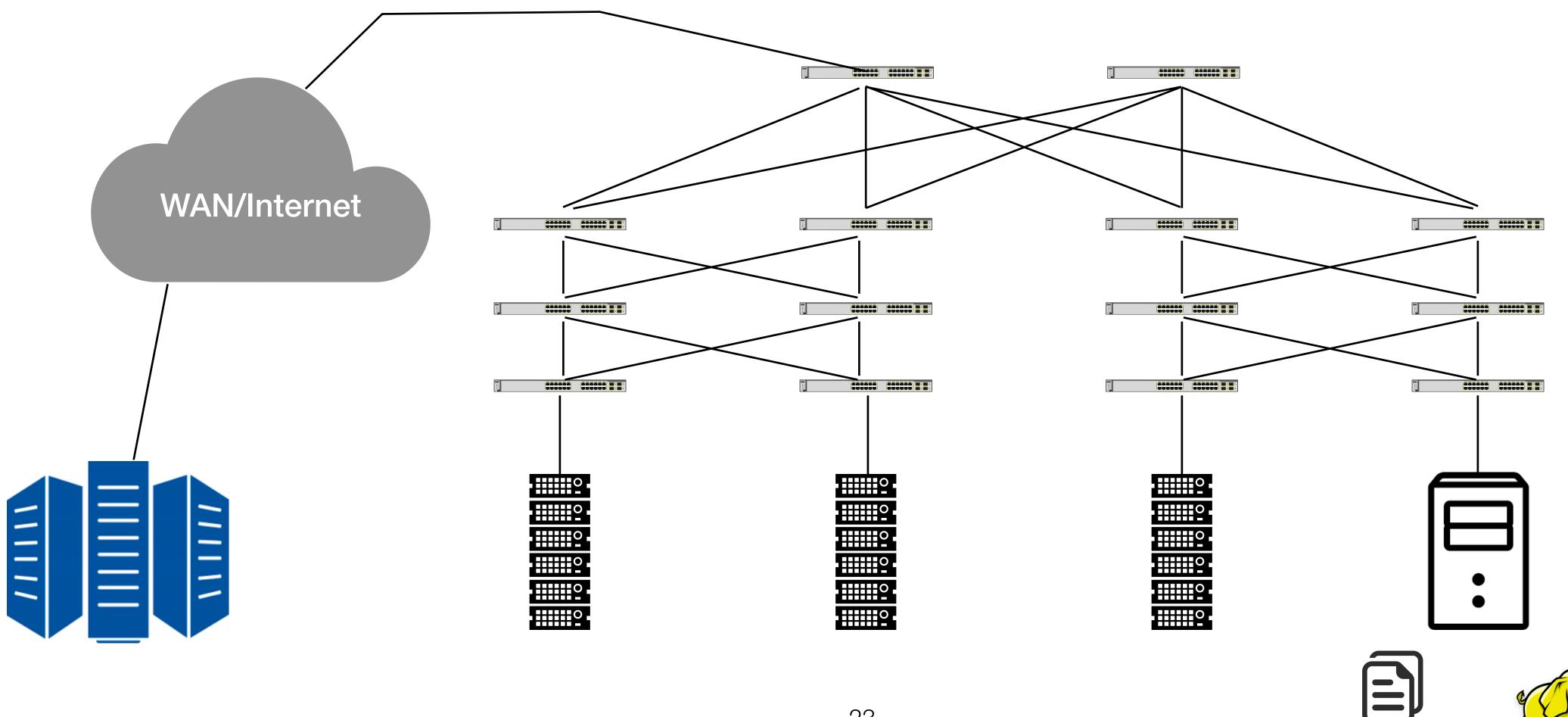
- Connection termination at the border of the datacenter
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- Direct signal from the bottleneck
  - Requires switches that support direct congestion feedback

What about bottlenecks that can't generate a direct signal?

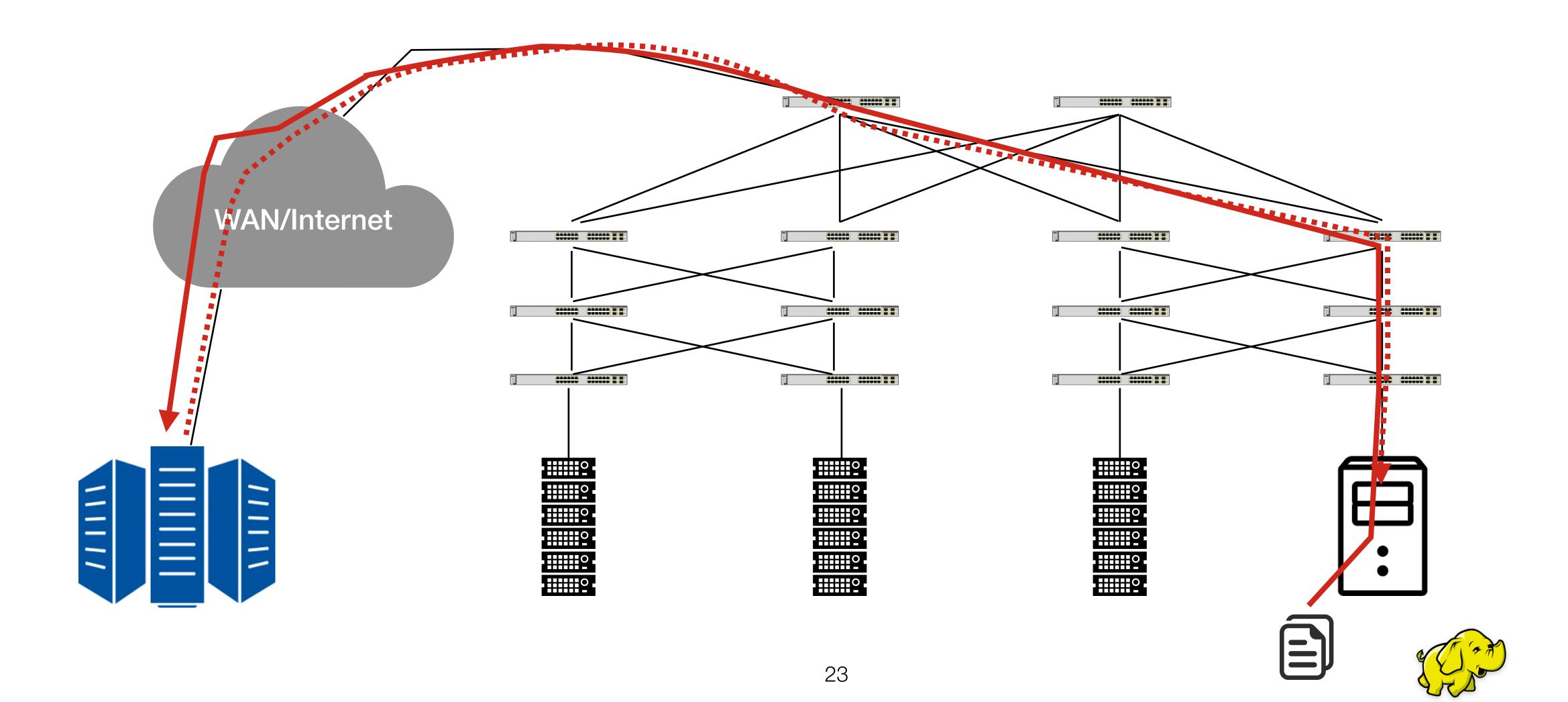
### Introducing Annulus



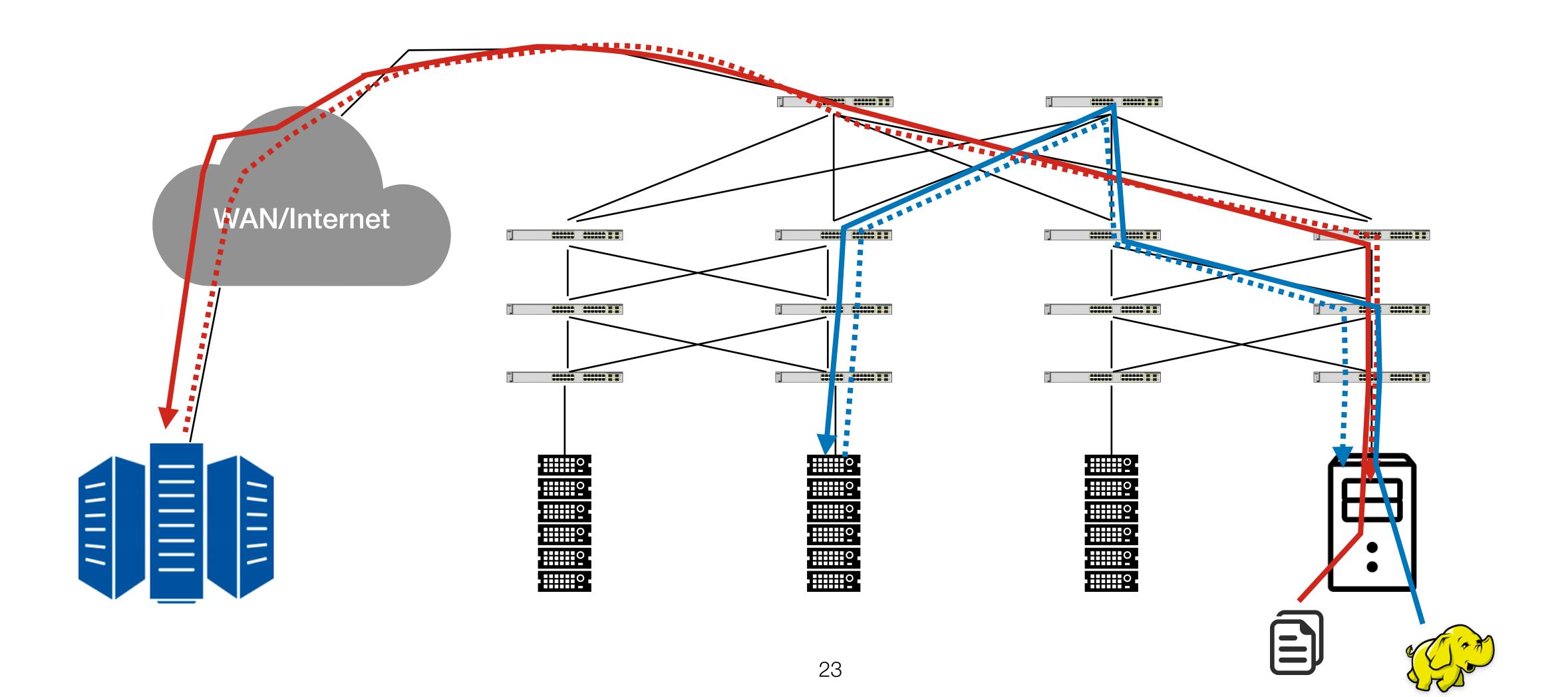
## Introducing Annulus Existing congestion control for WAN and datacenter



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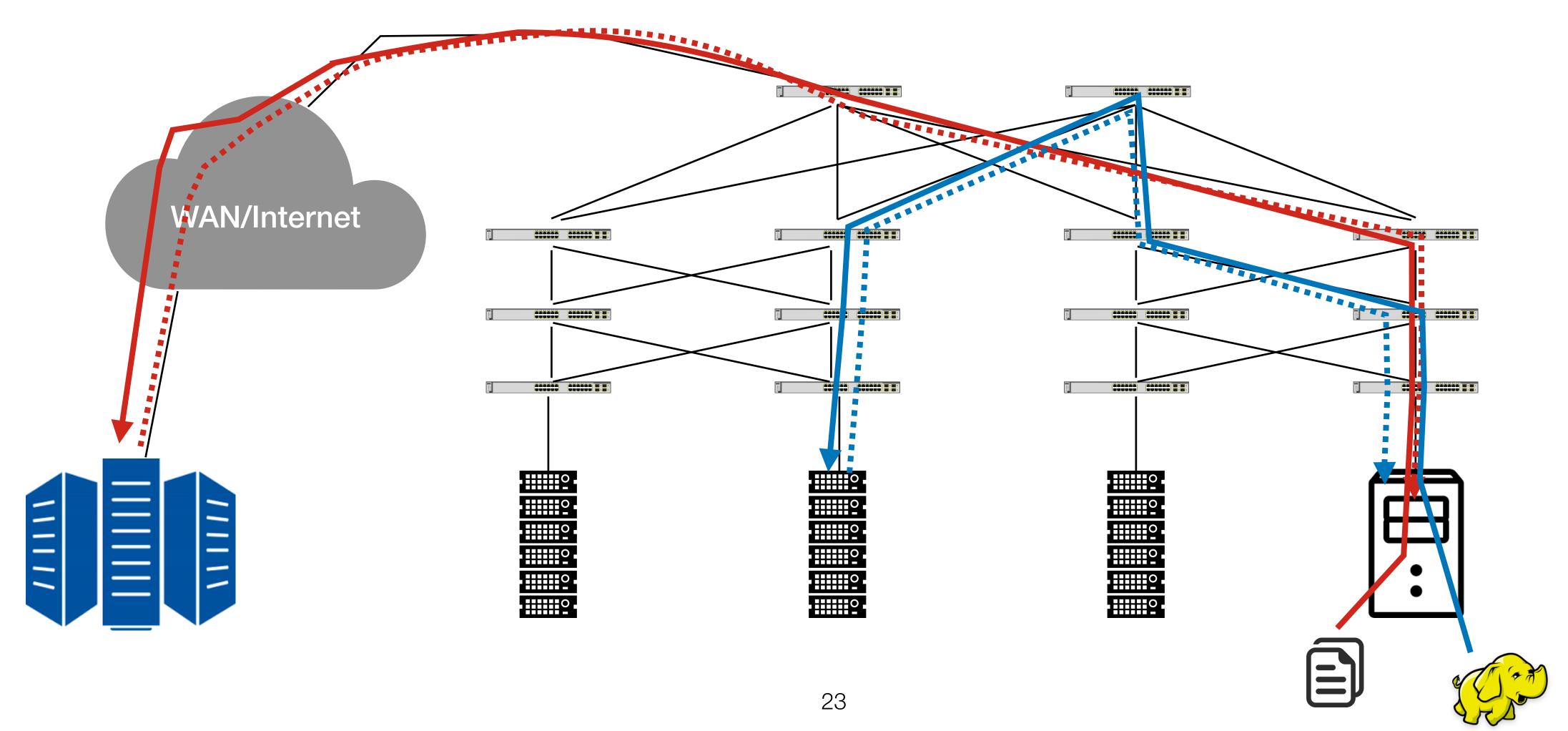


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#### Introducing Annulus **Existing congestion control for WAN and datacenter**

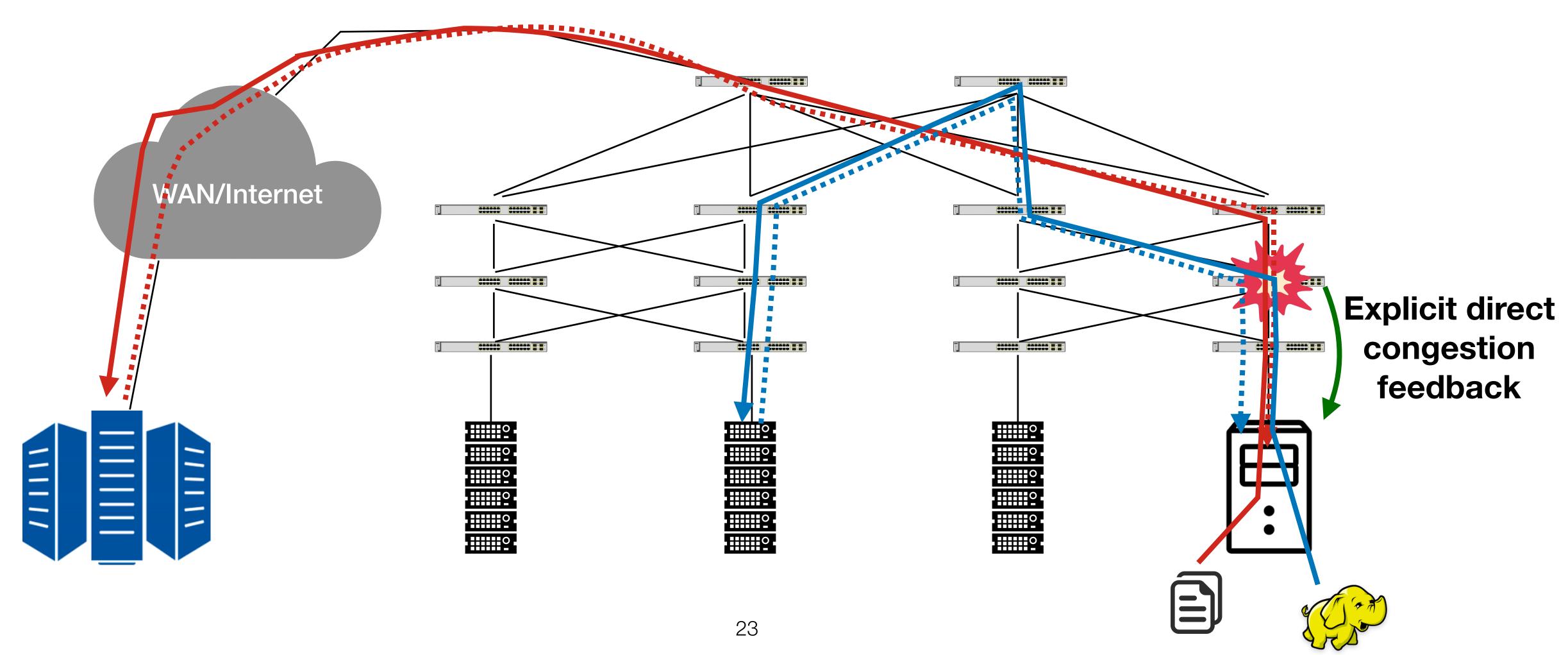
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#### Near-source control loop that relies on explicit direct feedback

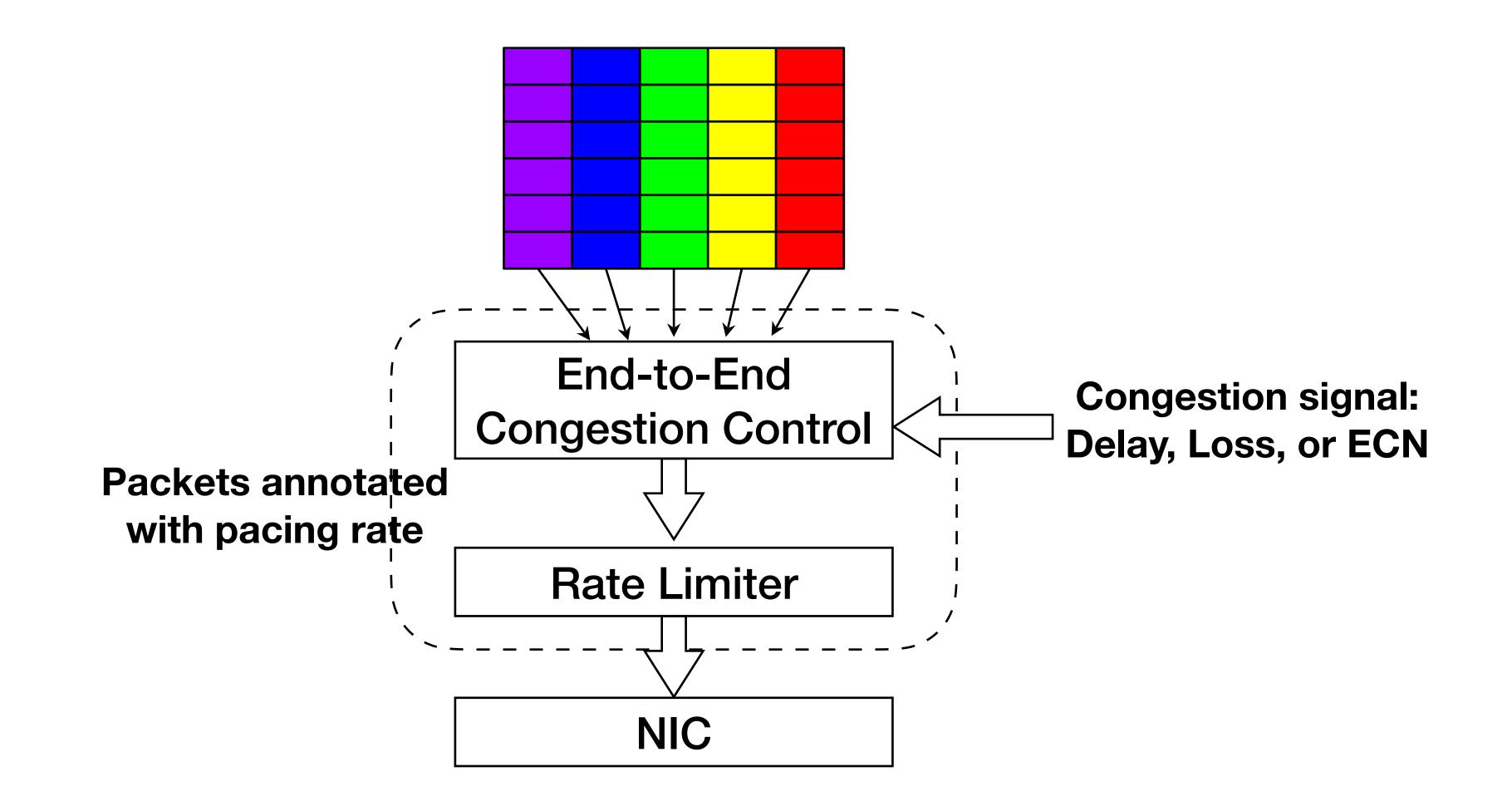
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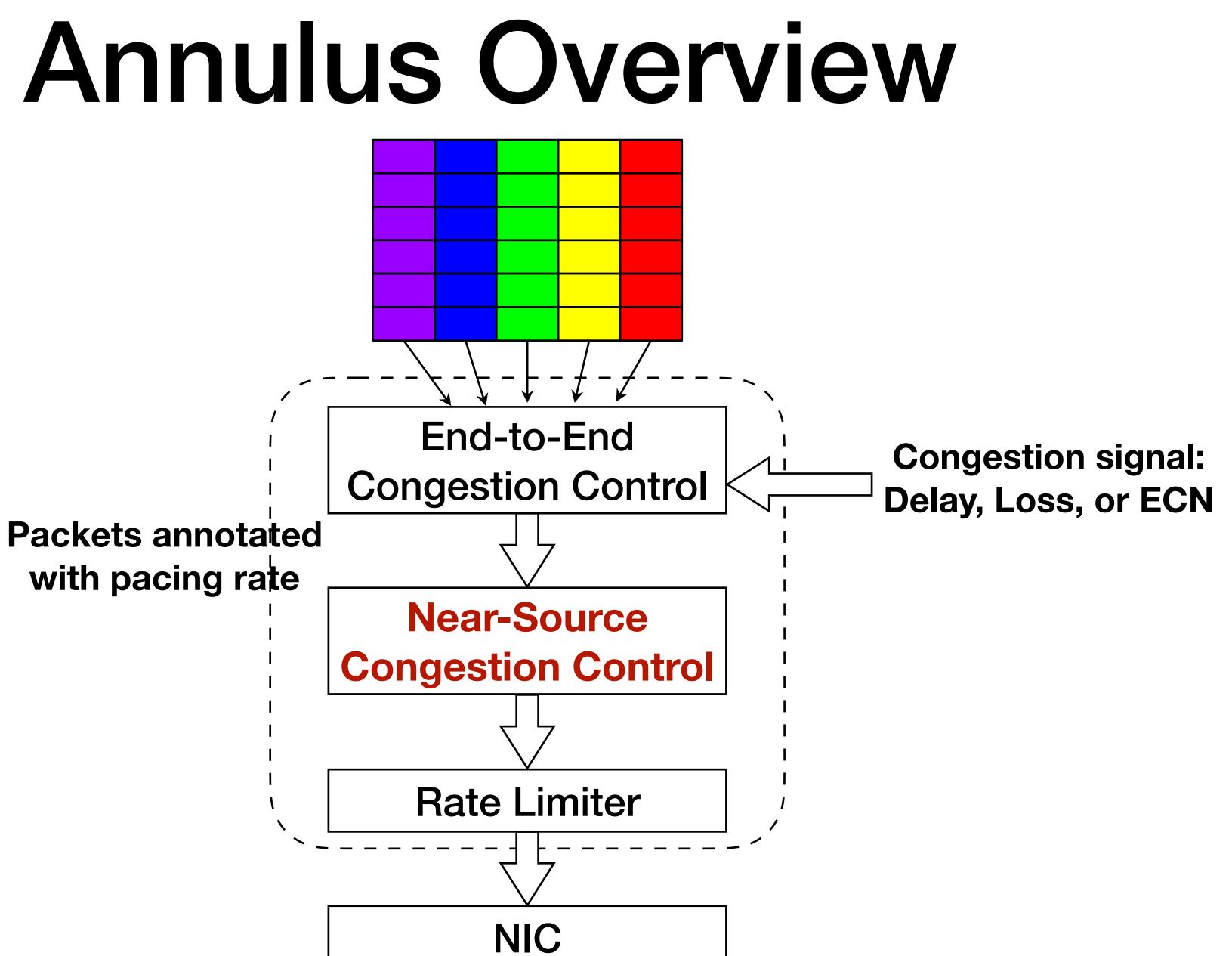
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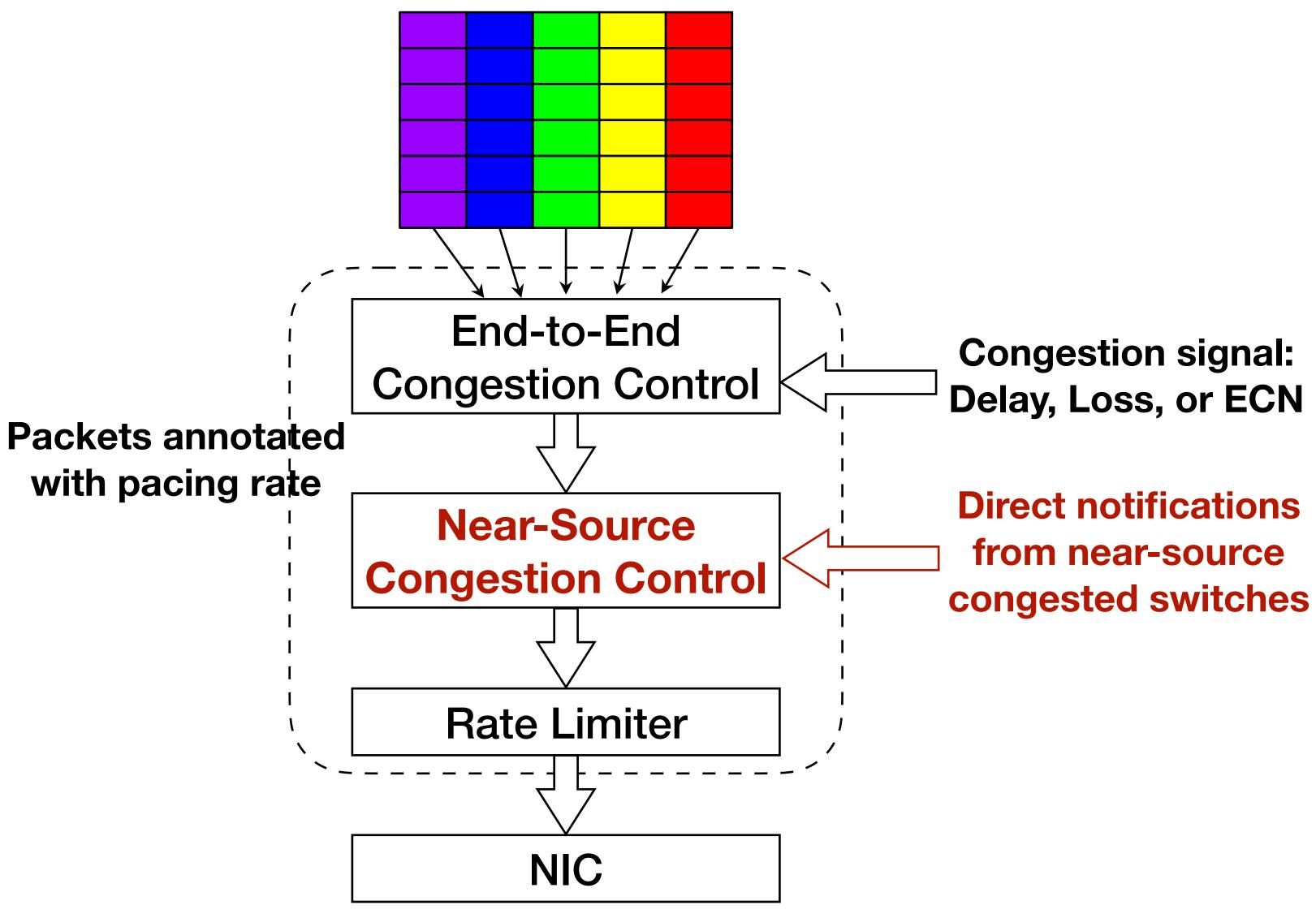
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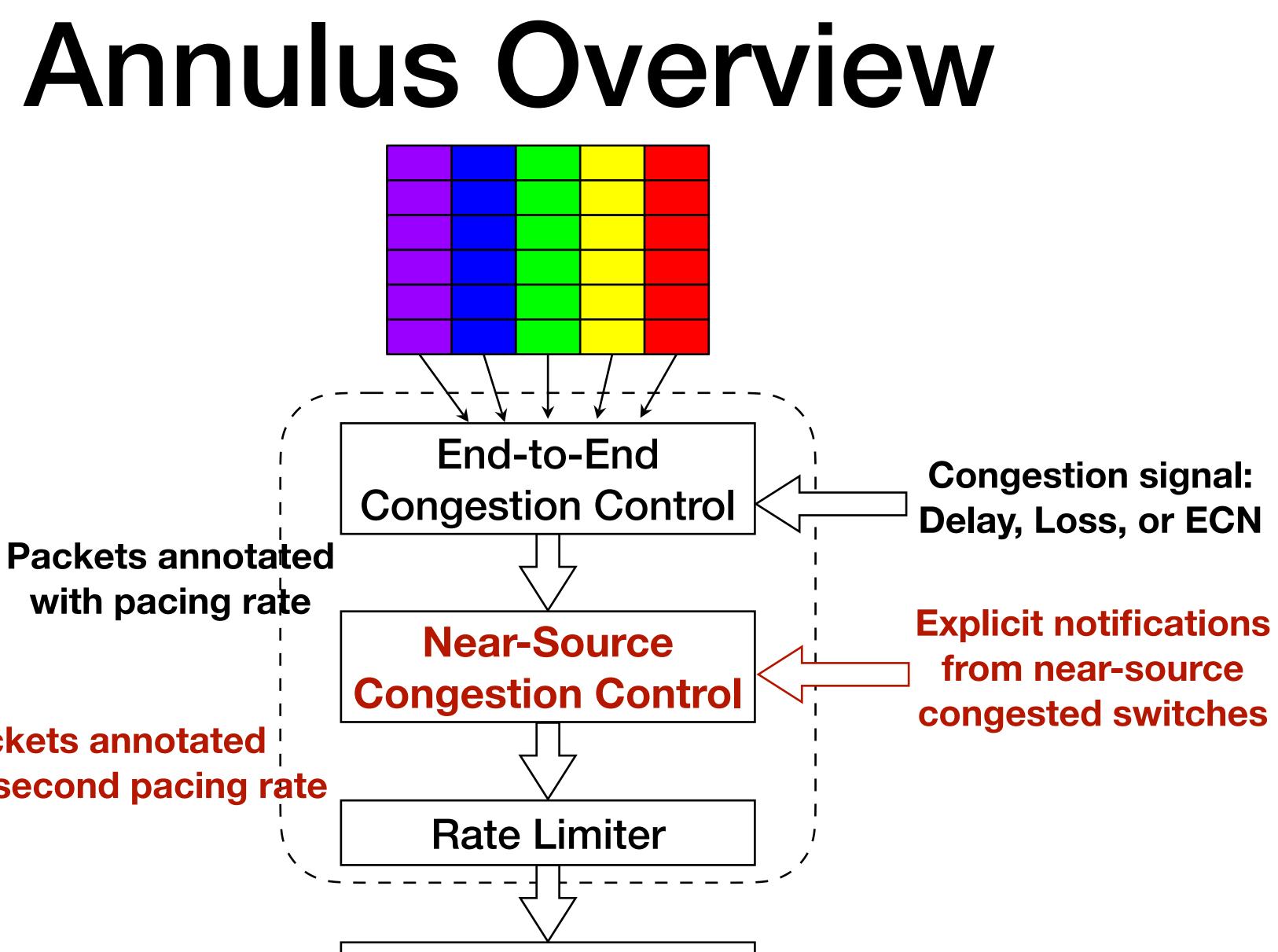
#### Annulus Overview





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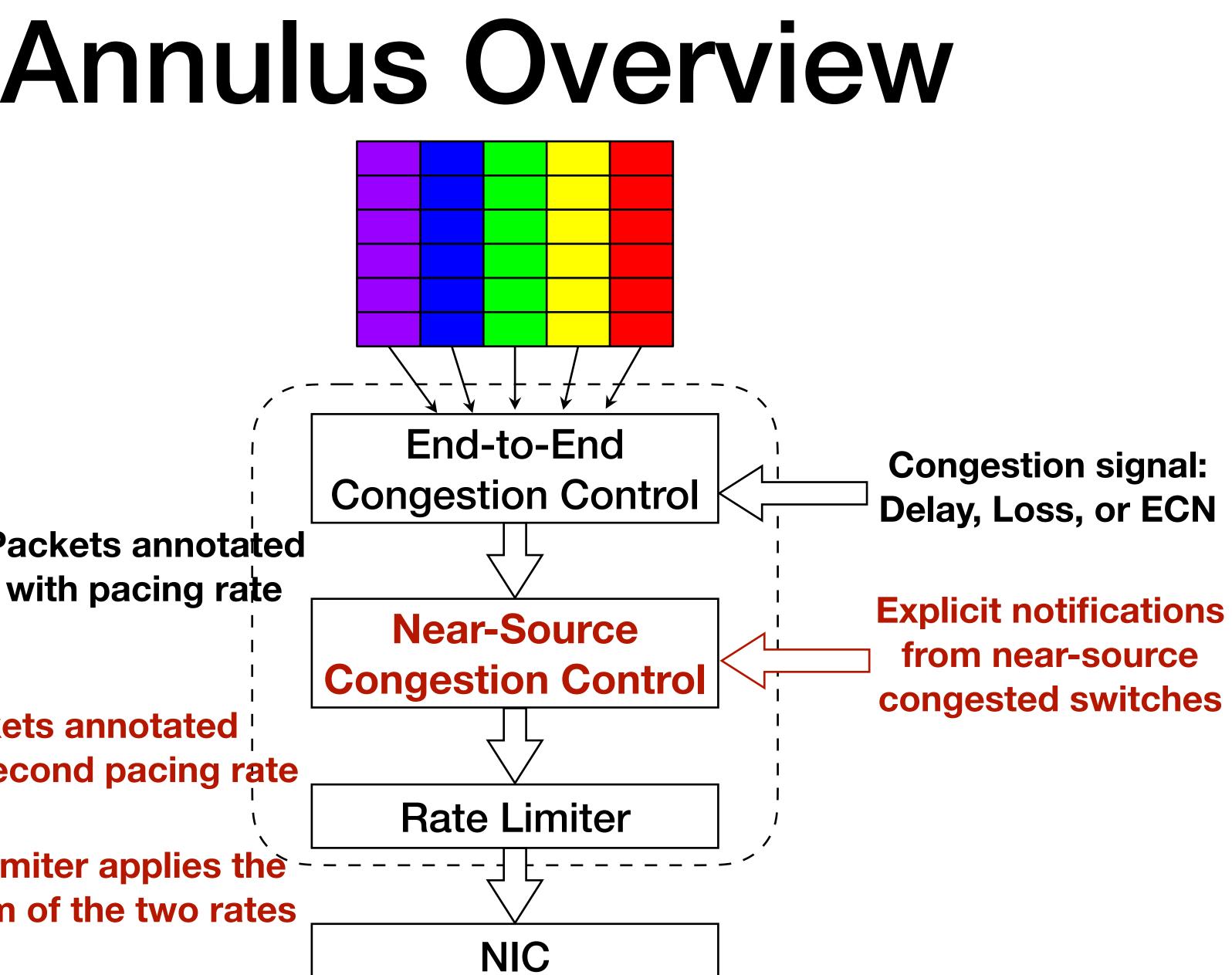


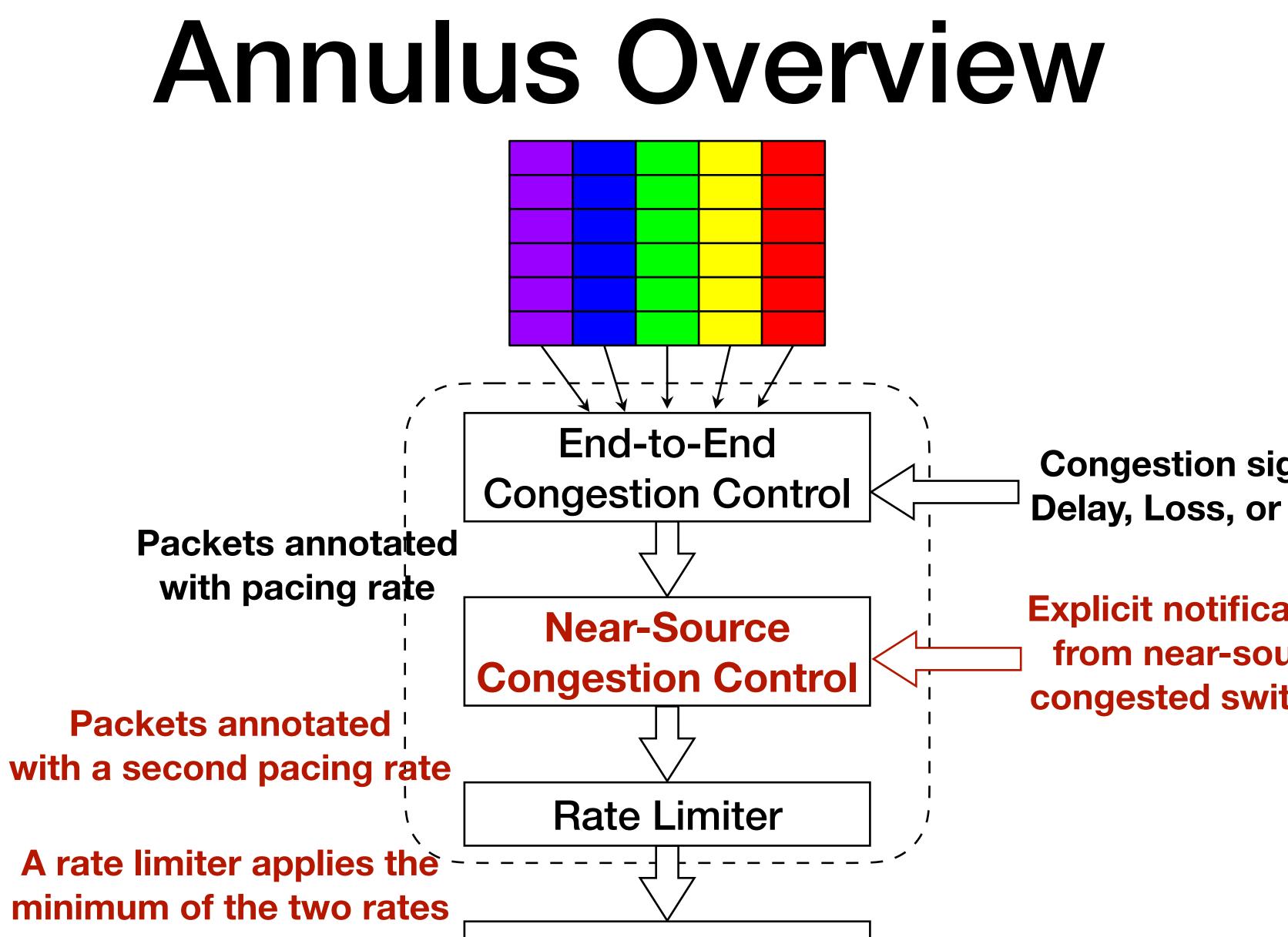






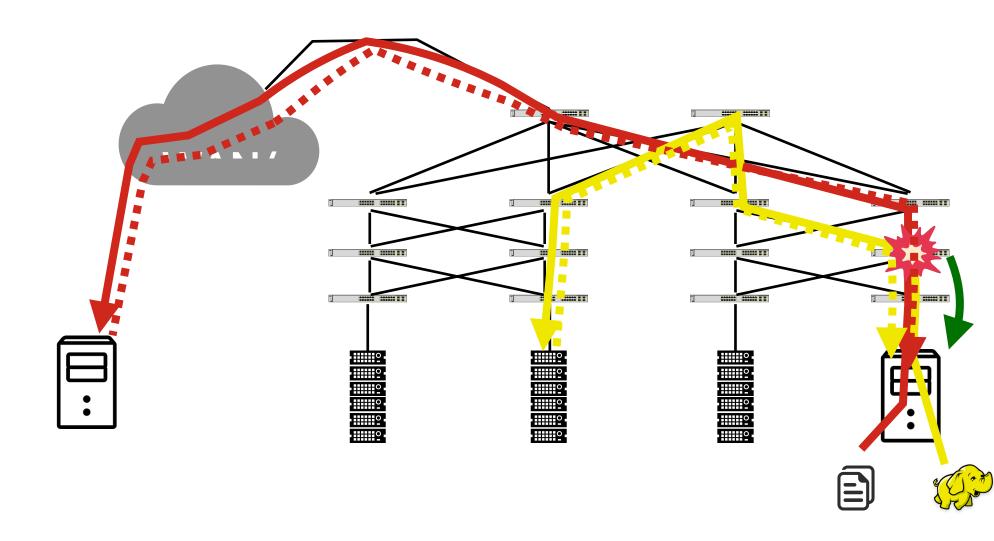
NIC



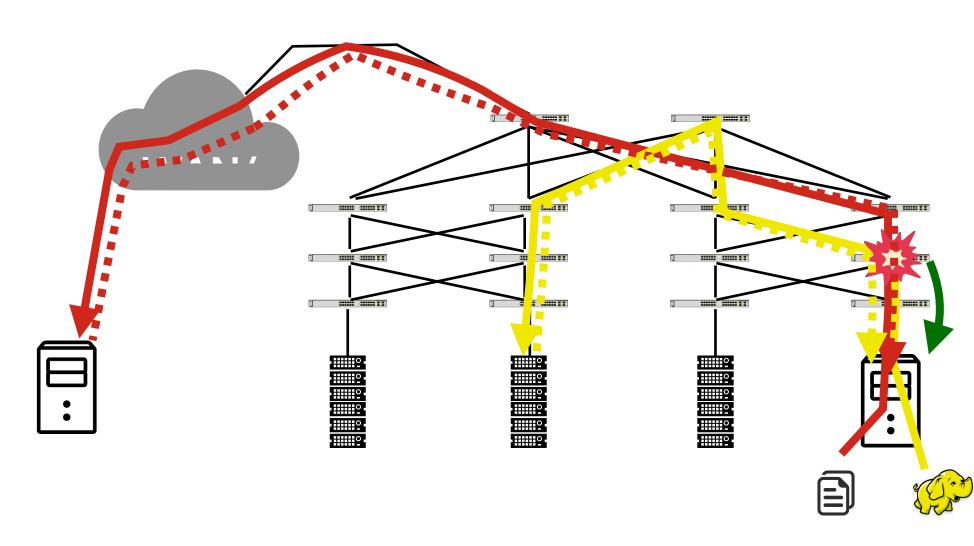


minimum of the two rates

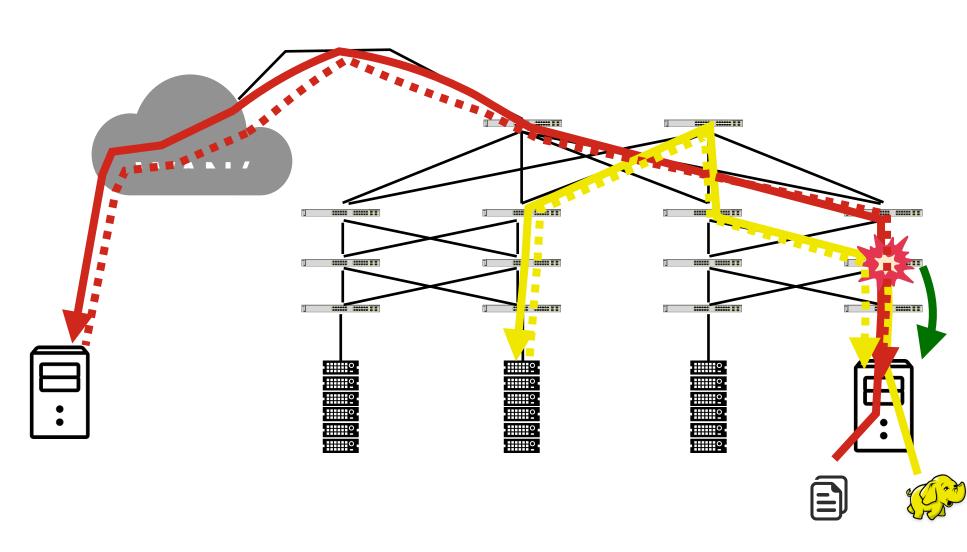
#### Near-Source Congestion Control Loop



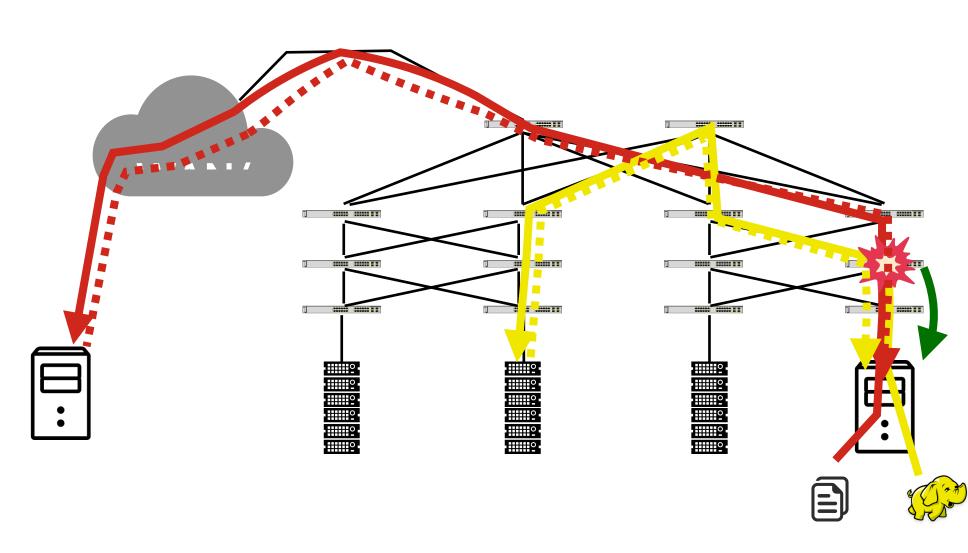
 Switches generates direct congestion notification message



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- Message indicates the problematic flow and the extent of the congestion



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- Message indicates the problematic flow and the extent of the congestion
- Sender modulates transmission rate based on congestion level



#### Challenges

#### How to implement the direct signal in switches?

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- How should the two control loops interact?

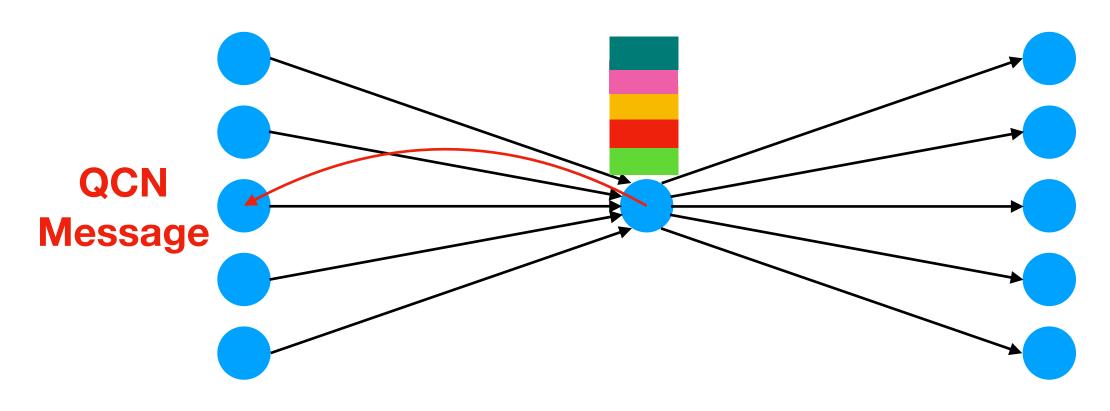
#### Challenges

#### **Quantized Congestion Notification (QCN)**

- An IEEE standardized L2 congestion control algorithm (IEEE Std 802.1Qau-2010)
- QCN relies on explicit control messages from the point of congestion sent to traffic sources indicating congestion severity

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a software NIC or in the hypervisor

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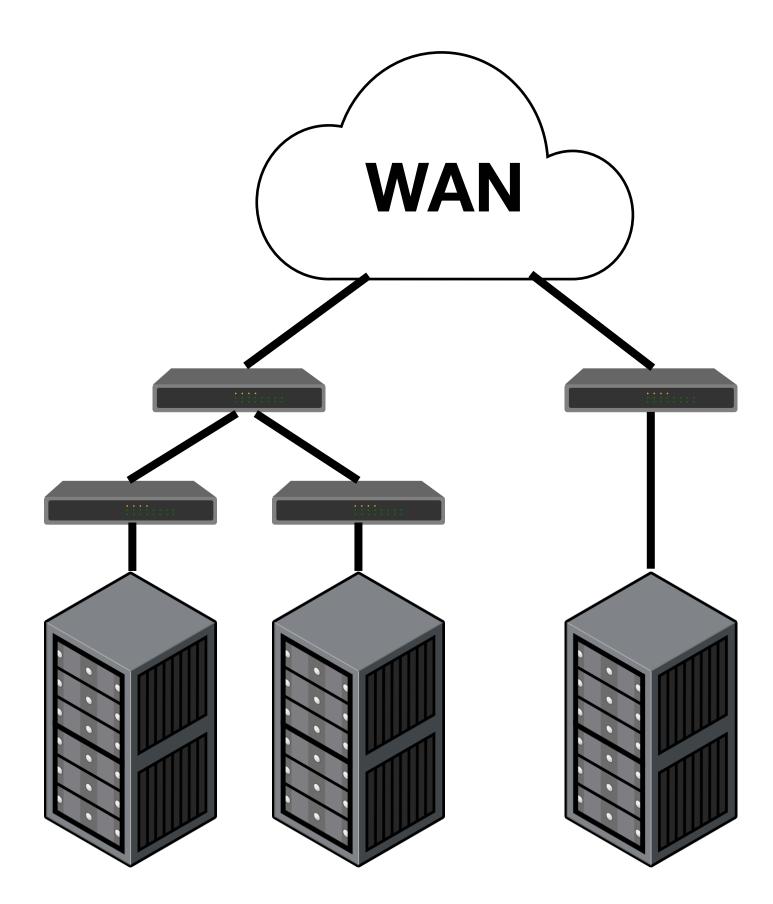
A QCN-based congestion control logic is implemented in



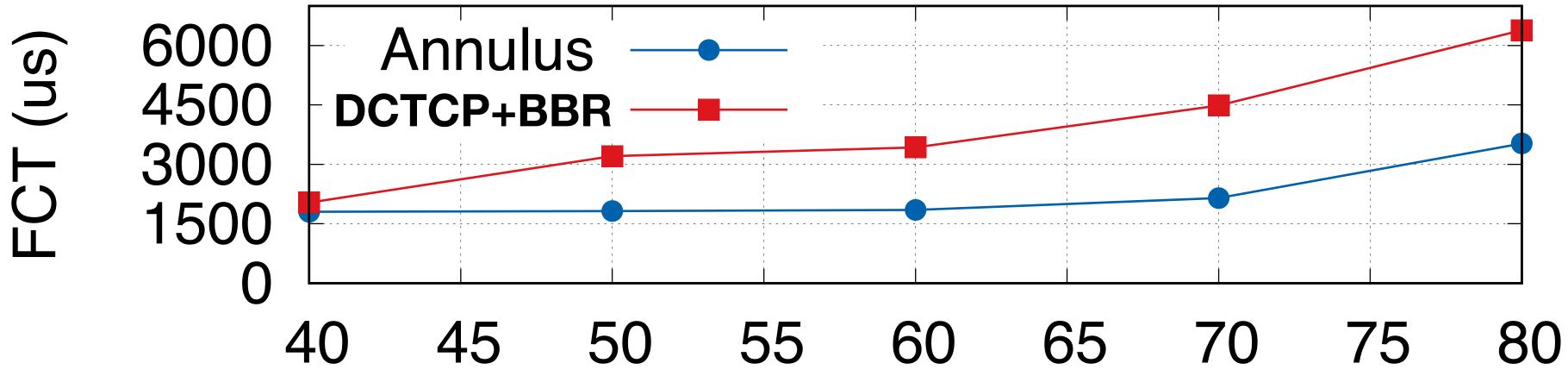
#### Evaluation

# **Evaluation Setup**

- Annulus is evaluated on three racks: Two racks in the same LAN and one connected to them through WAN
- WAN latency is 8ms and LAN latency is tens of microseconds
- Synthetic load is generated using an RPC load generator with cross-rack all to all communication
- Datacenter to WAN traffic ratio is 5:1
- DCTCP and BBR are used for end-to-end congestion control for datacenter and WAN traffic

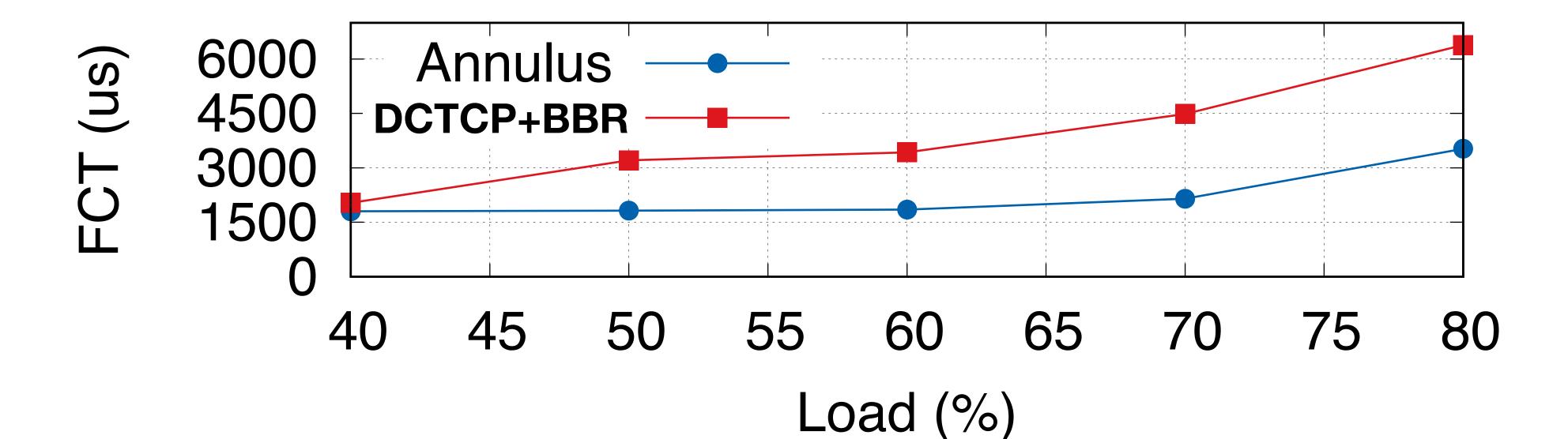


### **Tail RPC Completion Time**



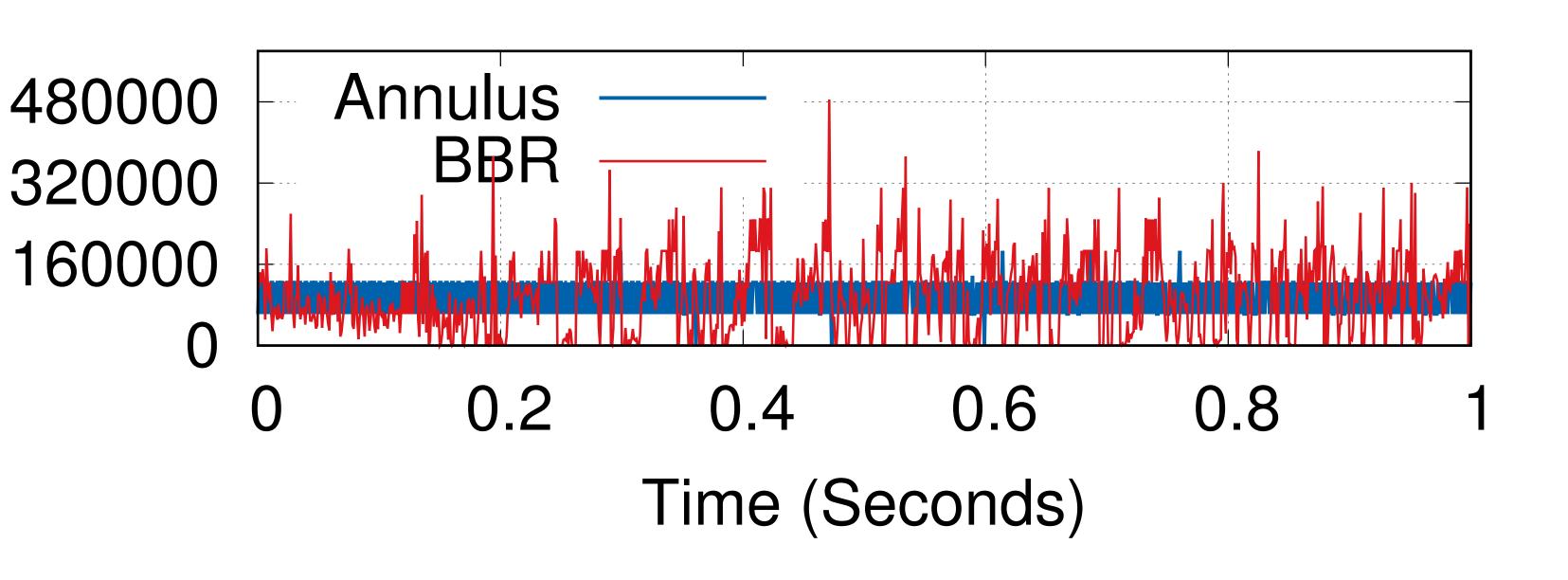
55 60 65 70 75 80 Load (%)

### **Tail RPC Completion Time**



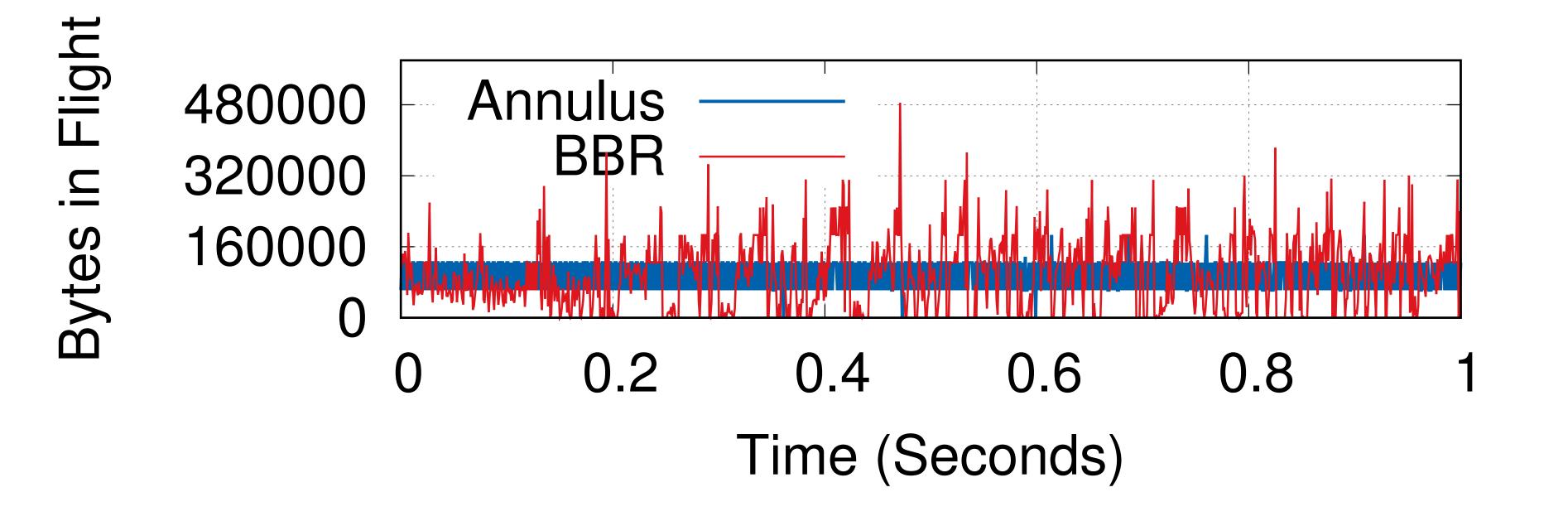
Annulus reduces tail RPC latency by 40% at 50% load

#### Impact of Annulus on WAN Traffic



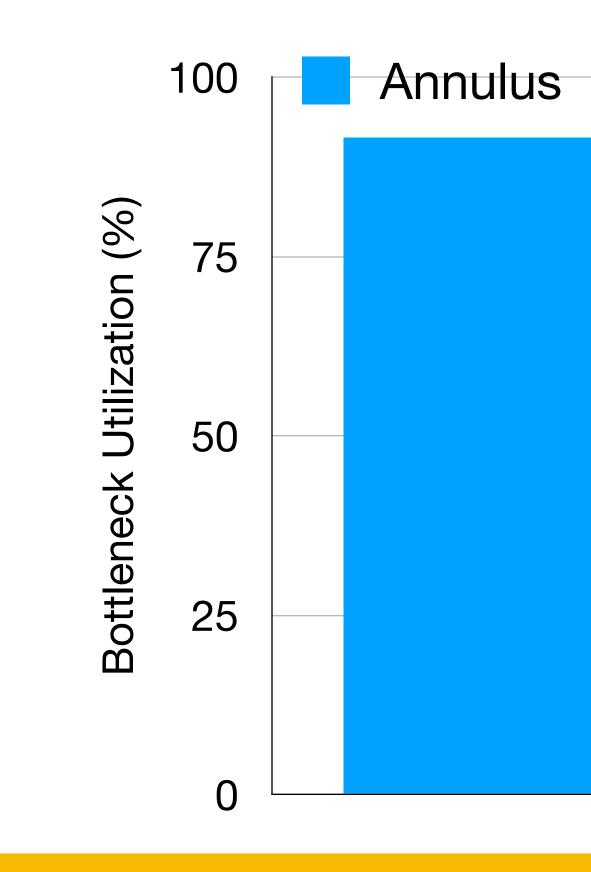
# Bytes in Flight

#### Impact of Annulus on WAN Traffic



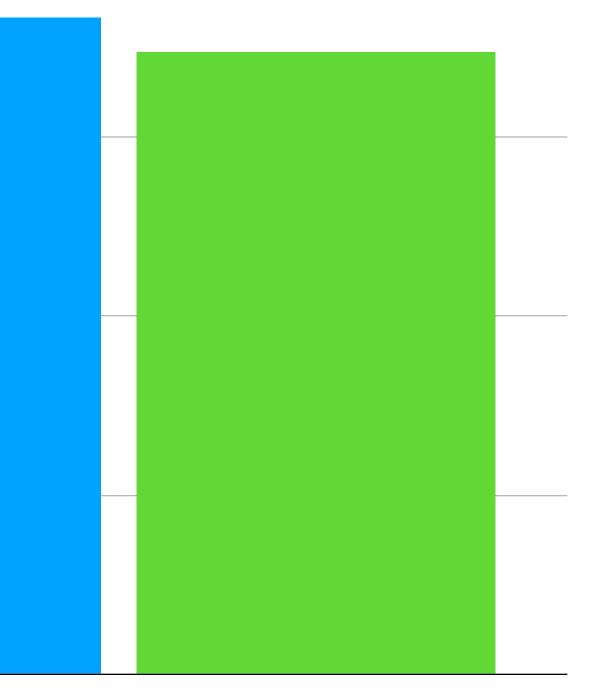
#### Annulus results in less bursty WAN behavior when contending with LAN

#### **Bottleneck Utilization**



#### **Stability of Annulus behavior improves utilization by 5%**

#### BBR+DCTCP



 A new problem in datacenter congestion control arises when high bandwidth WAN traffic competes with datacenter traffic

- of WAN traffic when handling congestion inside the datacenter network

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 Annulus makes the case for developing better direct signals that reduce the reaction time and improve the performance

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 Multi-control loop algorithms can help address scenarios where the path has significantly different types of bottlenecks