# Sizing router buffers

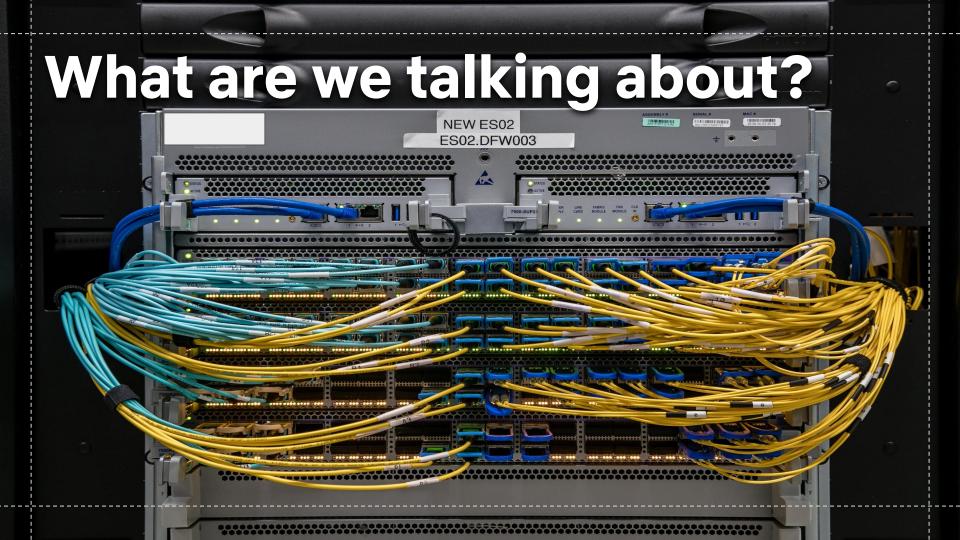
CS 244: Spring '22

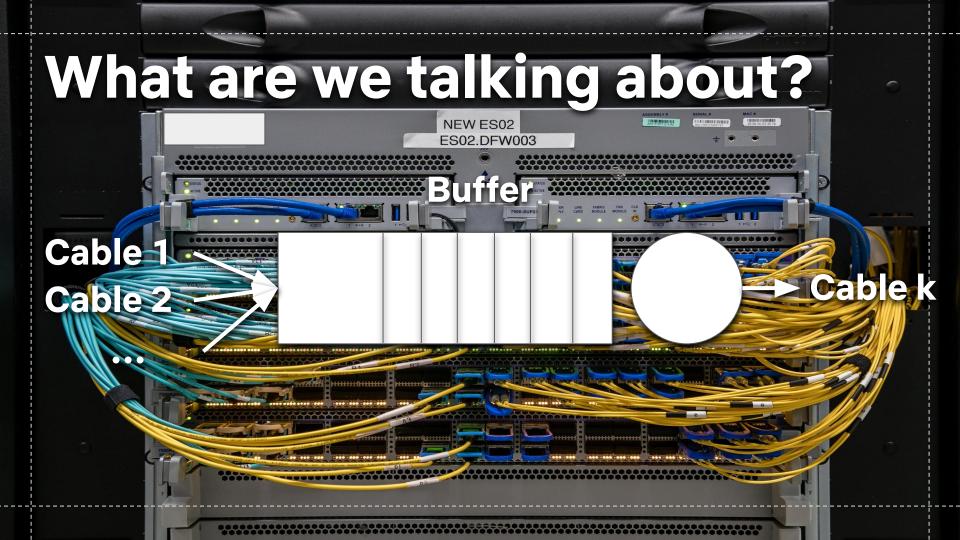
# Outline

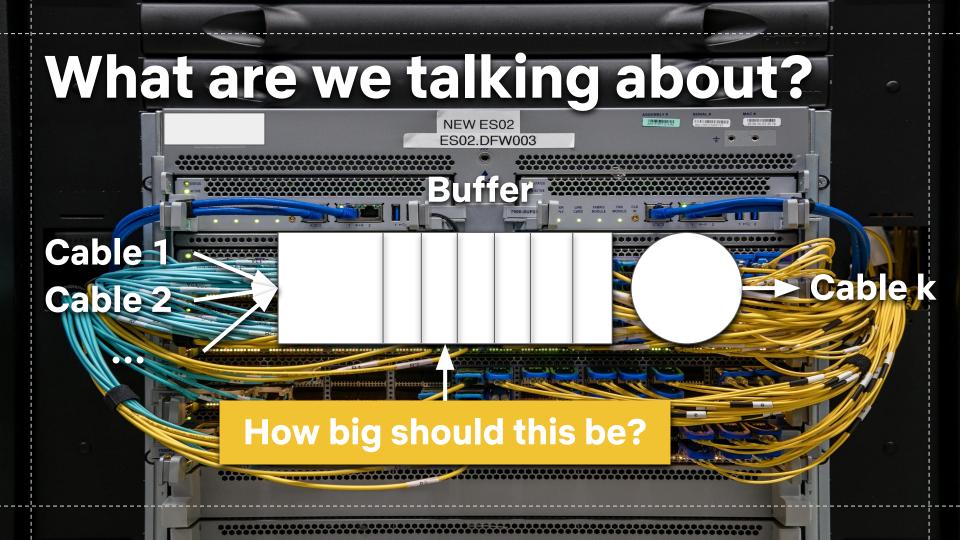
- What is this buffer sizing question?
- Prove the BDP result
- Discuss the BDP/ $\sqrt{n}$  result

# What I hope you will take away

- 1. An idea about the question/results
- 2. A sense of all the different parties involved here, and why it's a tricky problem to "solve"
- 3. A feeling that buffer size is determined by application/congestion control decisions







# **Application side**

Think about the extremes:

**One packet:** if a packet arrives slightly too fast, it is dropped

Very large: packets will wait a long time to be sent

# **Network operator side**

- Need to have good performance for network users
- Need to buy routers
  - Smaller commodity routers
    - Cheaper, programmable, etc...
    - Cost: Thousands to tens of thousands of dollars
  - Larger routers specifically for ISPs
    - Large buffers, routing tables
    - Cost: hundreds of thousands of dollars

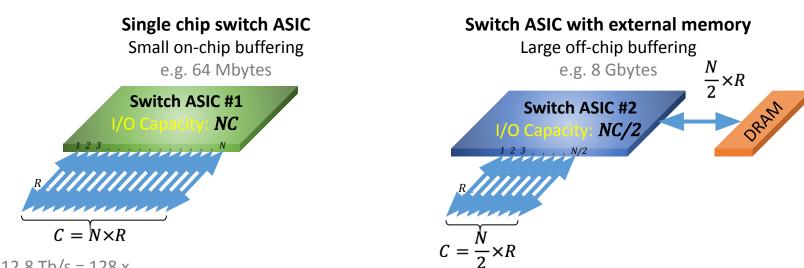
# **Router manufacturer side**

- Need to pick a size
- Can't increase later, but pretty easy to decrease later
- Balance selling routers w/ cost
  - On-chip vs off-chip
  - SRAM Routers used 80% of global SRAM ca. 2004
  - Large markup for ISP routers 90% ca. 2004

# Off chip vs. on chip buffers

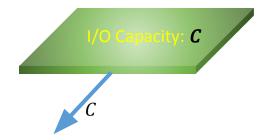
With on-chip buffers we can build higher capacity ASICs

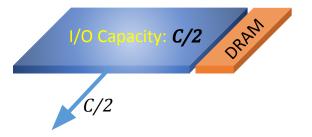
## Switch Chips are Limited by Serial I/O Capacity



e.g. 12.8 Tb/s = 128 x 100Gb/s

## Switch Chips are Limited by Serial I/O Capacity

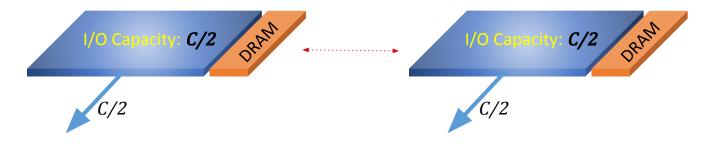




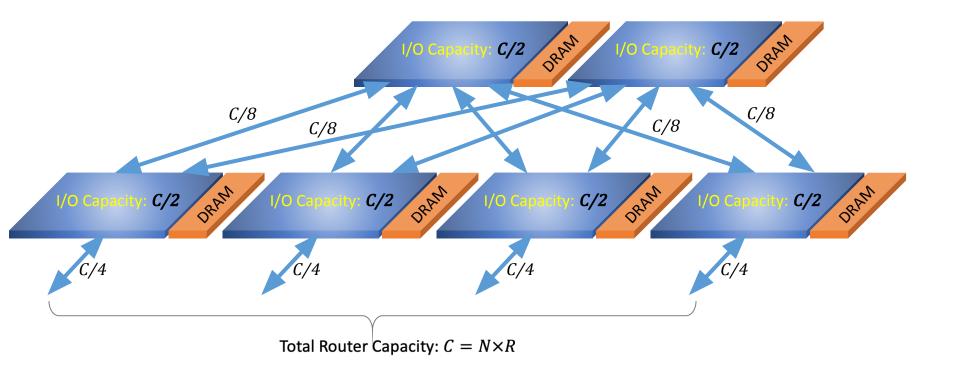
How many switch chips with capacity C/2 do we need to make a router with capacity C?

## It's not two!

Can't send packets between chips



## We need **6** ASICs with capacity C/2



# Takeaway

- Buffer size matters for performance
- Buffer size matters to network operators
- Buffer size matters when building a router

# So how big should a buffer be?

## You asked...

- "Can you speak to [...] whether learned methods are replacing brittle rules of thumb and dynamically adapting to each scenario?"
- "Given that the proper buffer size is dependent on factors like the number of flows, are there cases where we might want a more dynamic adjustment of buffer size?"
- "Also could in-network telemetry be used to dynamically size buffers?"

# How to answer this question?

- 1. Come up with theoretical guidelines
  - Be useful for hardware manufacturers/network operators
  - *Not* experimental or algorithmic
- 2. Focus on the performance part of the trade-off
  - People want larger buffers because they think they perform well
  - How small can we get buffers w/o sacrificing performance?

## Worst-case scenario #1

Can you come up with an example that requires large buffers?

Algorithm:

If a *single* packet is lost, we are very unhappy.

Implies that a buffer needs to be large enough to absorb any burst.

Aside: this is how <u>AT&T sizes buffers</u>

## Worst-case scenario #2

Can you come up with some example that requires small buffers?

Algorithm:

If delay is *ever* larger than Xms, we are very unhappy.

Restricts buffer to < X\*C packets

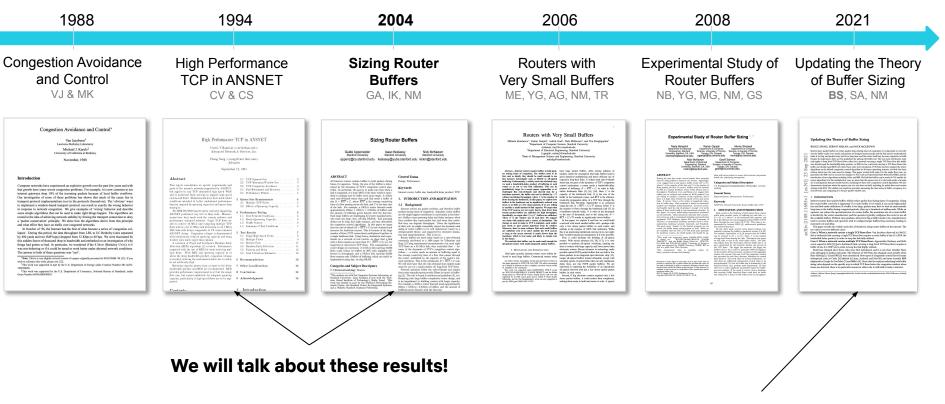
Aside, data from 2006: adding 500ms reduced Google traffic by 20%

# Strategy in this line of work

Come up with a more definite result by:

- 1. Looking at one specific protocol: TCP
- 2. And look at one specific metric: link utilization
- 3. During one specific type of setting: congestion

Q: How big does a buffer need to be so that TCP Reno will fully utilize a link?



### Using data/arguments from here

# **Results**

### / BDP=Bandwidth x Delay (Round trip time)

### **BDP:** Jacobson 90, Villamizar and Song 1994 **BDP/√n:** Appenzeller, McKeown, Keslassy 2004

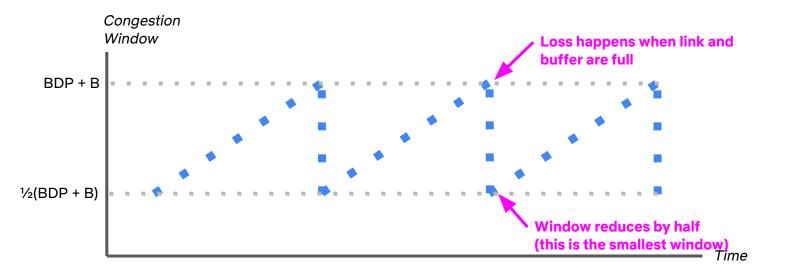
## Sizing buffers for one TCP Reno flow

Fact: TCP sends one window's worth of data every RTT

So if window < BDP = Capacity \* RTT, then TCP sends at a rate of Window / RTT < BDP / RTT < Capacity

Another fact: (This one takes a little more work, and a few assumptions) Link is fully utilized over an RTT if and only if window  $\geq$  BDP.

### Sizing buffers for one TCP Reno flow



## Sizing buffers for one TCP Reno flow

All of this together:

- 1. If min window  $\geq$  BDP, then we have full link utilization.
- 2. Min window =  $\frac{1}{2}(BDP + B)$

So for min window  $\geq$  BDP, we need:

```
\frac{1}{2}(BDP + B) \ge BDP,
```

```
BDP + B \ge 2 BDP,
```

 $B \ge BDP.$ 

## Aside about overhead

- TCP requires ≥ BDP packets inflight to keep the link fully utilized during any RTT
- TCP reno requires another ≥ BDP packets in the buffer to keep the link fully utilized over all RTTs
  - This is like 100% overhead!

## You asked...

"How do new congestion control protocols like SWIFT or DCTCP affect

ideal buffer size?"

## Nice and flexible result

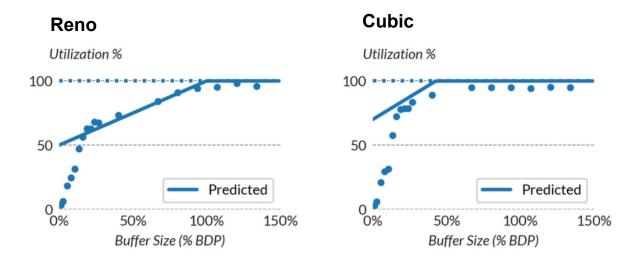
In a recent paper, we looked at:

- What if you decrease the window by 30% (like Cubic) or ½ (like Scalable TCP)?
- What if you want 90% link utilization?
- etc...

# **Buffer requirements for a single flow**

Algorithm	<b>Full Utilization</b>	90% Utilization
Reno	BDP	0.80 BDP
Cubic	0.42 BDP	0.28 BDP
BBR	0.25 BDP	0.15 BDP
Scalable	0.14 BDP	0.03 BDP
DCTCP	0.14 BDP	0.03 BDP

### **Experimental results**



# **Multiple TCP connections**

Session 8: Congestion Control

### Sizing Router Buffers

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### ABSTRACT

All Internet routers contain buffers to hold packets during times of congestion. Today, the size of the buffers is determined by the dynamics of TCP's congestion control algorithm. In particular, the goal is to make sure that when a link is congested, it is busy 100% of the time; which is equivalent to making sure its buffer never goes empty. A widely used rule-of-thumb states that each link needs a buffer of size  $B = \overline{RTT} \times C$ , where  $\overline{RTT}$  is the average round-trip time of a flow passing across the link, and C is the data rate of the link. For example, a 10Gb/s router linecard needs approximately  $250ms \times 10Gb/s = 2.5Gbits$  of buffers; and the amount of buffering grows linearly with the line-rate. Such large buffers are challenging for router manufacturers, who must use large, slow, off-chip DRAMs. And queueing delays can be long, have high variance, and may destabilize the congestion control algorithms. In this paper we argue that the rule-of-thumb  $(B = \overline{RTT} \times C)$  is now outdated and incorrect for backbone routers. This is because of the large number of flows (TCP connections) multiplexed together on

#### **General Terms**

Design, Performance.

#### Keywords

Internet router, buffer size, bandwidth delay product, TCP.

### 1. INTRODUCTION AND MOTIVATION

#### 1.1 Background

Internet routers are packet switches, and therefore buffer packets during times of congestion. Arguably, router buffers are the single biggest contributor to uncertainty in the Internet. Buffers cause queueing delay and delay-variance; when they overflow they cause packet loss, and when they underflow they can degrade throughput. Given the significance of their role, we might reasonably expect the dynamics and sizing of router buffers to be well understood, based on a well-grounded theory, and supported by extensive simulation and experimentation. This is not so.

# **Sizing buffers for multiple Reno flows**

[Appenzeller, McKeown, Keslassy '04]

Paper context:

- Based on the previous argument, idea was that we needed buffers
  ≥BDP for core internet routers
- For 250ms RTT, 10 Gbps link (reasonable at the time), we would need 300 MB of buffers!

# **Main insights**

- Buffer is there to absorb variability in packet arrivals
- *n* TCP connections behave very differently than one TCP connection
  In particular, variability of their aggregate window is much lower
- This means that large internet routers can have smaller buffers

#### Theorem [Appenzeller, McKeown, Keslassy 2004]

- If buffer is  $\geq$  BDP/ $\sqrt{n}$  and [conditions apply] then link will
- be fully utilized with high probability
  - Conditions: TCP windows are
  - 1. Uniformly distributed between  $c_1$  (BDP+B)/n and  $c_2$  (BDP+B)/n
- 2. Independent

### Proof

- [Do it on the board]
- Windows  $W_i$  are iid uniform,  $2/3(BDP + B)/n \le Wi \le 4/3(BDP + B)/n$
- Useful inequality:

Bounds on sums of independent variables [edit]

Main articles: Hoeffding's inequality, Azuma's inequality, McDiarmid's inequality, Bennett's inequality, and Bernstein inequalities (probability theory)

Let  $X_1, X_2, \ldots, X_n$  be independent random variables such that, for all *i*:

 $egin{aligned} a_i \leq X_i \leq b_i ext{ almost surely.} \ c_i &:= b_i - a_i \ orall i : c_i \leq C \end{aligned}$ 

Let  $S_n$  be their sum,  $E_n$  its expected value and  $V_n$  its variance:

$$\begin{split} S_n &:= \sum_{i=1}^n X_i \\ E_n &:= \operatorname{E}[S_n] = \sum_{i=1}^n \operatorname{E}[X_i] \\ V_n &:= \operatorname{Var}[S_n] = \sum_{i=1}^n \operatorname{Var}[X_i] \end{split}$$

It is often interesting to bound the difference between the sum and its expected value. Several inequalities can be used.

1. Hoeffding's inequality says that:

$$\Pr\left[|S_n-E_n|>t\right] < 2\exp\!\left(-\frac{2t^2}{\sum_{i=1}^n c_i^2}\right) < 2\exp\!\left(-\frac{2t^2}{nC^2}\right)$$

If n connections share a link and [conditions apply] then:

- 1. If buffer is  $\geq$  BDP/ $\sqrt{n}$ , link will be fully utilized
- 2. Utilization is at least  $1-\Omega(1/\sqrt{n})$ , independent of buffer size

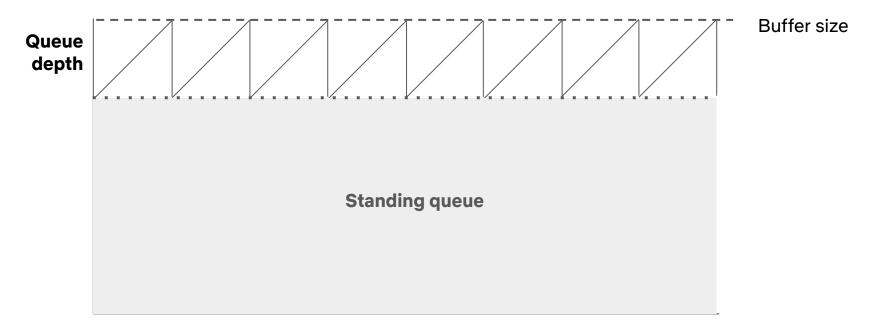
#### Conditions:

- 1. **Fair:** connections send roughly same amount of data
- 2. **Desynchronized:** only a few connections decrease windows at same time

# Why do we need the two conditions:

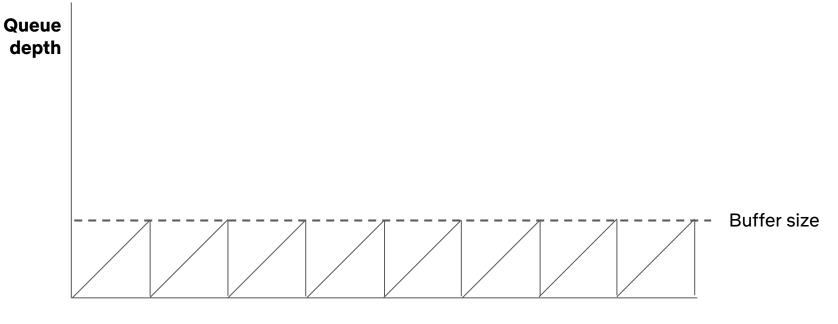
- 1. Fairness
- 2. No synchronization

#### Intuition: buffer only needs to handle variability



Time

#### Intuition: buffer only needs to handle variability

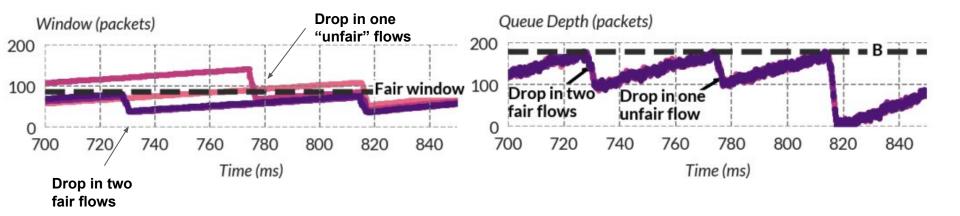




### **Unfairness increases queue variability**

If a TCP flow has more data in flight, it will back off more, causing

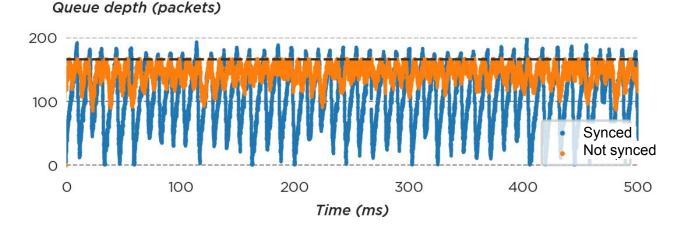
a larger drop in queue depth (and larger required buffer)



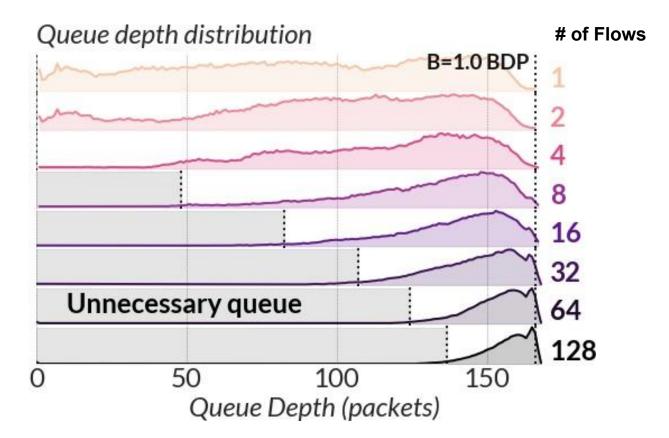
#### Synchronization increases queue variability

If everyone decreases windows at once, queues will fluctuate more

Note: congestion control designers can reduce synchronization, e.g. by randomly decreasing windows



### **Experimental results**



# **Experiments**

### You asked...

"I appreciated a brief discussion in the conclusion, describing why router vendors might be uncomfortable switching to a model with fewer buffers, especially when operators would be more likely to buy the router with larger buffers. I think this problem of bringing research into practice when the results are almost too promising is pretty universal across many fields! How should a researcher go about convincing operators of a surprising research result, outside of the evaluation performed in the paper?"

# **Experimental results**

Fair number of experiments have been run:

- Experimental Study of Router Buffers [NB, YG, MG, NM, GS 2008]
- <u>Buffer sizing and Video QoE Measurements at Netflix</u> [**BS**, BW, TH, TR, JL, NM 2019]
- <u>Buffer sizing experiments at Facebook</u> [NB, PL, YG 2019]

Typically:

- Reduce buffer size of one pair of a load-balanced link, see what happens
- Can get away with smaller buffers, but not clear how it maps to theory

# Conclusion

# Why is this tricky?

- Buffer sizes are a product of congestion control choices
  - Changing TCP can reduce buffer size requirements
- Congestion control is done by content providers, who don't control or measure buffers
- ISPs don't get to control or measure traffic performance
  - But buffer size only matters when links are congested
- Router manufacturers have to build to the worst case

## We should only need small buffers

Modern TCP requires smaller buffers than Reno

Relationship between buffers and utilization is a consequence of congestion control choices

Should be able to get away with buffers of 10-100 packets.

### **Thanks!**

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