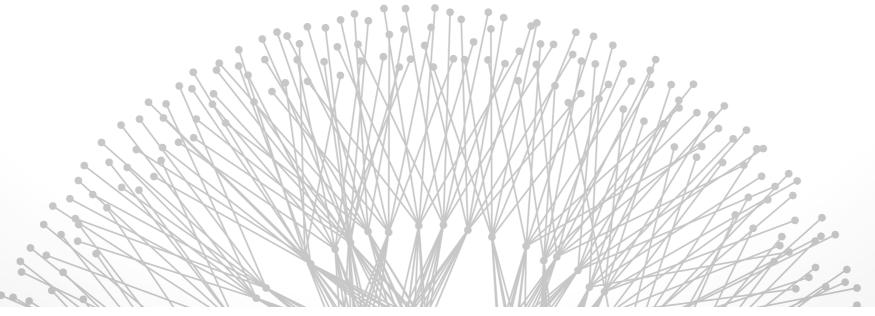
# Modern Congestion Control

Mo Dong CS 538 February 13 2017





## Congestion control with help from the network

All Good Stuff

0 Deployment







#### High BDP Wireless Satellite Inter-DC

BIC H-TCP Compound

CUBIC FAST TCP Westwood Vegas Veno

Hybla STAR

Illinois SABUL

10X

10X

17X

4X

Unstable, RTT Unfair, Bufferbloat, Crash on Changing Networks, .......

Point Solutions



Performance Far from Optimal

#### **CC** Goals

Consistent High Performance

Fast and Stable Convergence

# Why is it so hard?

#### Possible Answer No. 1

Not leveraging all available insights and capability of specific kinds of networks

## Possible Answer No. 1



#### Data center networks (DCTCP, ICTCP, TIMELY)

- Insights to network properties
- Specific traffic patterns
- Full control of network infrastructure

#### Cellular networks (Sprout, Verus)

Insights to network properties

## Data Center Networks





Data centers > Inside look > Locations

#### Microsoft now has one million servers less than Google, but more than Amazon, savs Ballmer

#### The Billion Dollar Data Centers

By: Rich Miller

April 29th, 2013



An overhead view of the server infrastructure in Google's data center in Council Bluffs, lowa, where the company has invested more than \$1 billion. (Photo: Connie Zhou for Google)





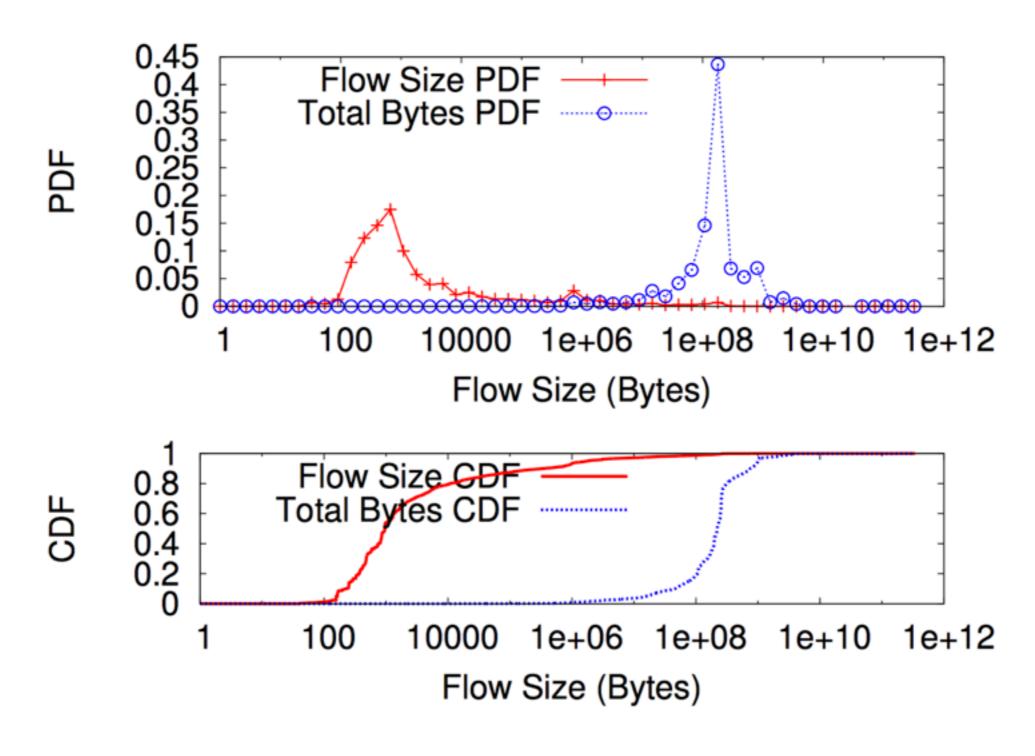
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At Microsoft's 2013 Worldwide Partner Conference, CEO Steve Ballmer gave us a very interesting tidbit about the scale of Microsoft's server operations. "We have something over a million servers in our datacenter infrastructure."

to say that "Google is bigger" and "Amazon is a little bit such direct figures; in almost two decades, Google and igh figure on their server count — and now Ballmer is on

## Data center traffic characteristics





[VL2, SIGCOMM'09]

## What do we want?



Short flows

complete flows before their deadlines

Long flows

no deadline, but still preferable to finish earlier

## Low latency is the key





400 ms slowdown resulted in a traffic decrease of 9%

[Yslow 2.0; Stoyan Stefanov]



100 ms slowdown reduces # searches by 0.2-0.4%

[Speed matters for Google Web Search; Jake Brutlag]



Users with lowest 10% latency viewed 50% more pages than those with highest 10% latency

[The secret weapons of the AOL optimization team; Dave Artz]



2.2 sec faster web response increases 60 million more Firefox install package downloads per year

[Firefox and Page Load Speed; Blake Cutler]



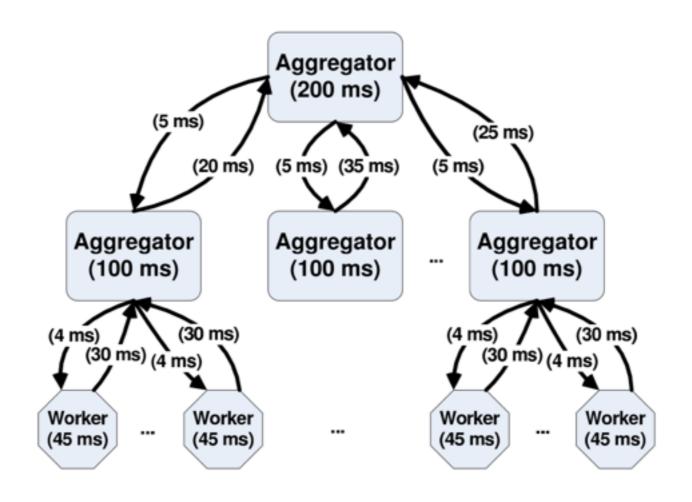
Users with 0-1 sec load time have 2x conversion rate of 1-2 sec

[Is page performance a factor of site conversion? And how big is it; Walmart Labs]

## Improving latency in data centers



## Server side optimization: Parallel computation



partition aggregate model

## 3 impairments [DCTCP]



- Incast
- Queue buildup
- Buffer pressure

## Incast



## What is TCP Incast problem?

Synchronized flows overflow the switch buffer

#### Causes?

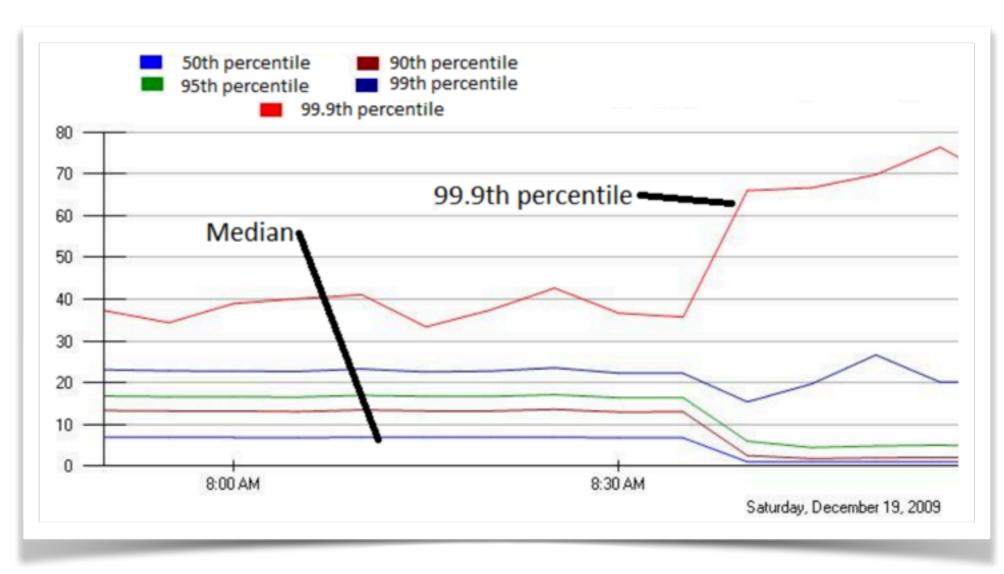
- (Barrier) synchronized many-to-one traffic pattern
- Short flows (10s KB to 100s KB)
- Small queue buffer (4 to 8 MB shared memory)
- Large default RTO (300 ms)

## Fixing TCP Incasts



- Use larger switch buffers
- Decrease RTOmin
- Desynchronize flows (random delay ~10ms)

Query completion time [ms]



## Queue buildup and buffer pressure



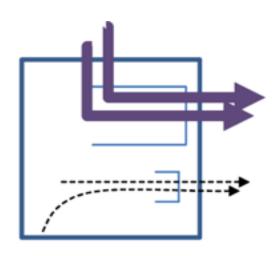
Causes: Long TCP flows occupy switch buffer

Queue buildup: short flow experiences increased delay

90%: RTT < Ims --- (Bing's DC)

10%: I ms < RTT < 15 ms

Buffer pressure: 4 MB shared memory, i.e., how much buffer per port is not a constant



Many solutions to Incast do not apply here...

#### **DCTCP**

[Alizadeh et al., SIGCOMM'10]

(adapted from Alizadeh's slides)

## DCTCP: Two goals



Goal #1: Low latency and high burst tolerance

Ensuring low queue occupancy

Goal #2: Still having high throughput for long flows

Using most of the network bandwidth

Achieve either goal is not hard; what's hard is to achieve both

## Explicit Congestion Notification



Switches mark packet's ECN bit before buffer overflows

TCP sender treats ECN signals as if a single packet is dropped — but packets are not actually dropped

More useful for short flows — avoid packet drop, therefor avoid RTO timeout.

Well supported by today's commodity switches and end-hosts

## DCTCP: Two Key ideas



I. React in proportion to the extent of congestion, not its presence

ECN Marks	TCP	DCTCP
101110111	cut window by 50%	cut window by 40%
00000001	cut window by 50%	cut window by 5%

- 2. Mark based on instantaneous queue length
  - Fast feedback to better deal with bursts

## DCTCP Algorithm



#### Switch side:

• mark packet iff queue length > K

#### Sender side:

maintain running avg of fraction of marked pkts

In each RTT:

$$F = \frac{\# of \ marked \ ACKs}{Total \ \# of \ ACKs} \qquad \alpha \leftarrow (1 - g)\alpha + gF$$

• adaptive window decreases:  $Cwnd \leftarrow (1 - \frac{\alpha}{2})Cwnd$ 

## Why does it work?



#### Small buffer occupancies

- → bursts fit
- → low queueing delay

Aggressive marking when queue buffer builds up

→ fast react before packet drops

Adaptive window reduction

→ high throughput

## Discussion



- Can we leverage more capability and information in date center environment? Switch features? Traffic patterns? etc..
- Can we use DCTCP in wide area networks?
- Can we use other switch features to improve the performance?
- Short flow performance in general settings

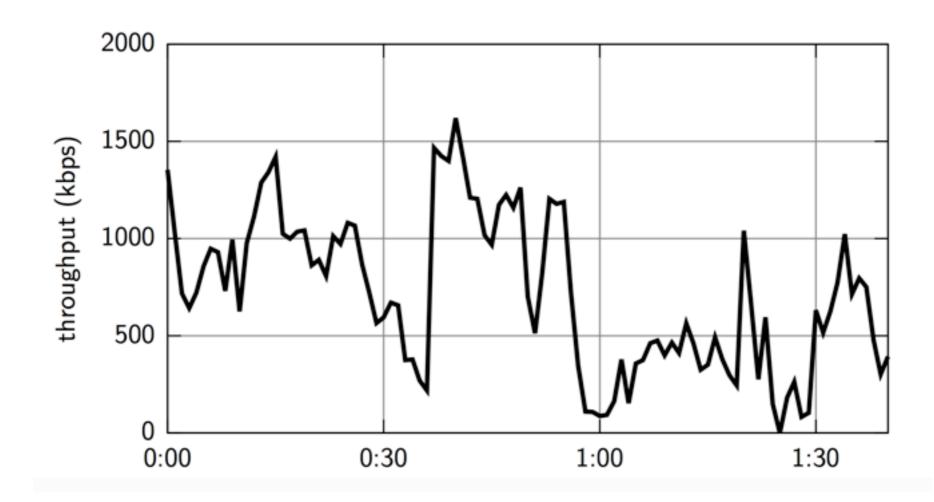
## Sprout: Stochastic Forecasts Achieve High Throughput and Low Delay over Cellular Networks

[Winstein et al., NSDI'13]

(adapted from Winstein's slides)

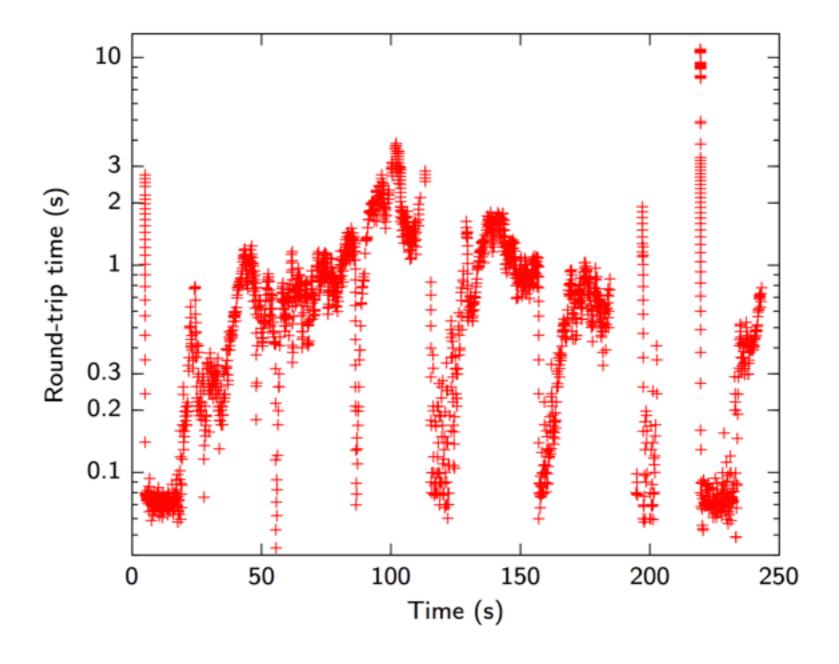


Highly dynamic network condition





Dedicated channel abstraction without packet loss





- TCP works poorly because
  - Existing schemes react to congestion signals.
    - Packet loss.
    - Increase in round-trip time.
  - Feedback comes too late.
  - The killer: self-inflicted queueing delay.



- Can we fix TCP to achieve
  - Most throughput
  - Bounded risk of delay > 100 ms

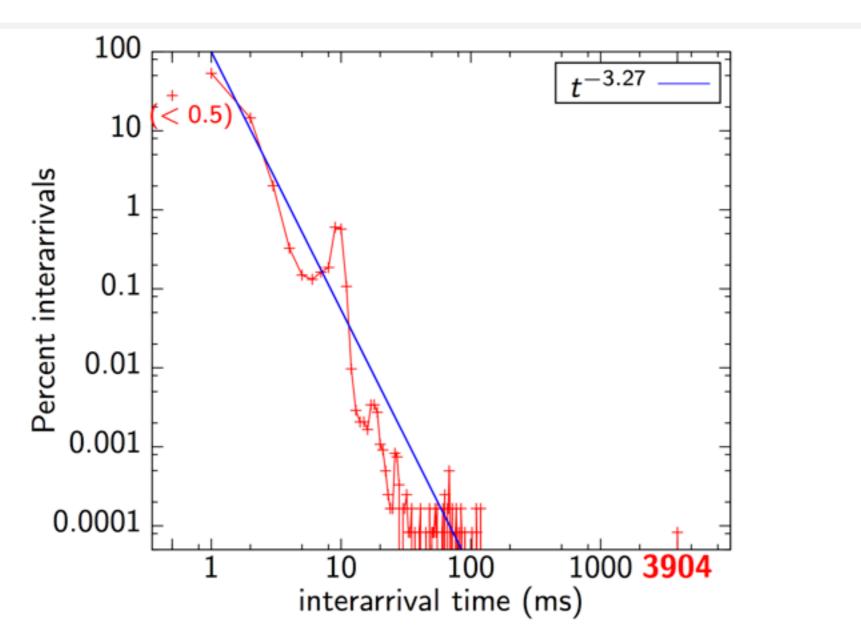
## Sprout



- Model variation in link speed
- Infer current link speed
- Predict future link speed
  - Don't wait for congestion
- •Control: Send as much as possible, but require:
  - 95% chance all packets arrive within 100 ms

## Model packet deliveries looks like flicker noise

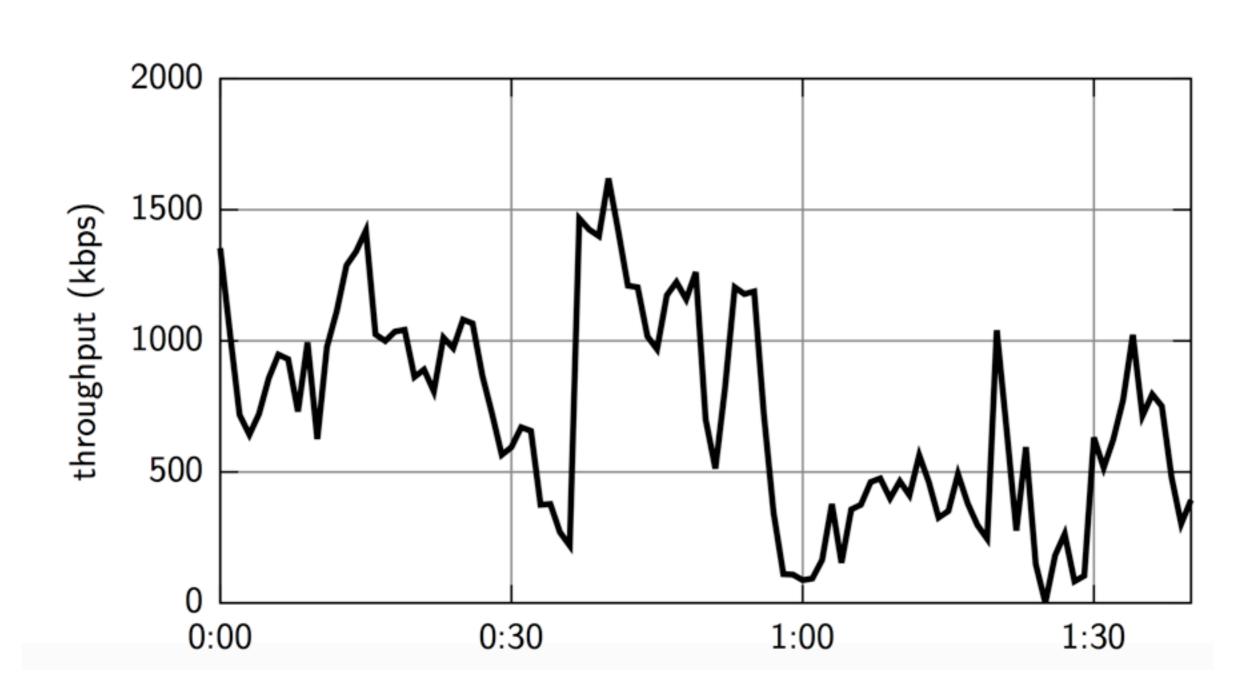




(Verizon LTE, phone stationary.)

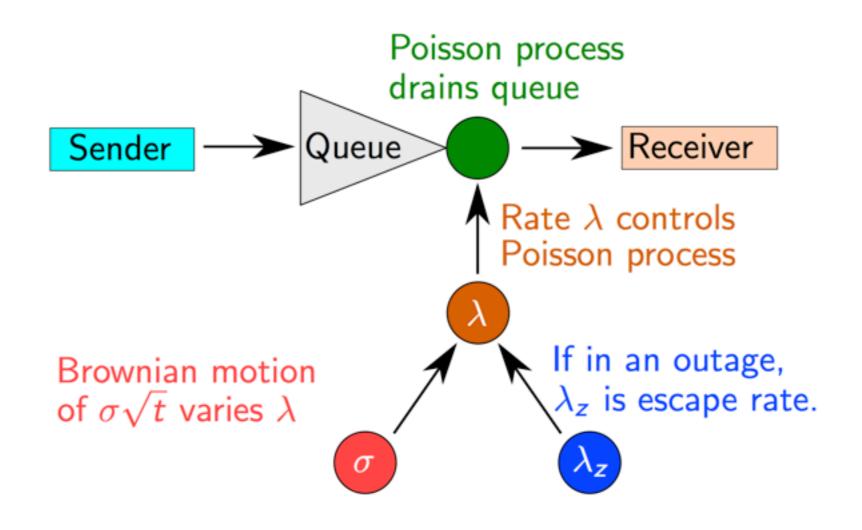
## Model: average rate looks like random walk





#### Sprout: Model Cellular Networks





## Infer: Current Link Speed



Observe packets received every т

receiver feedback

Update P(λ)

## Predict: future link speed



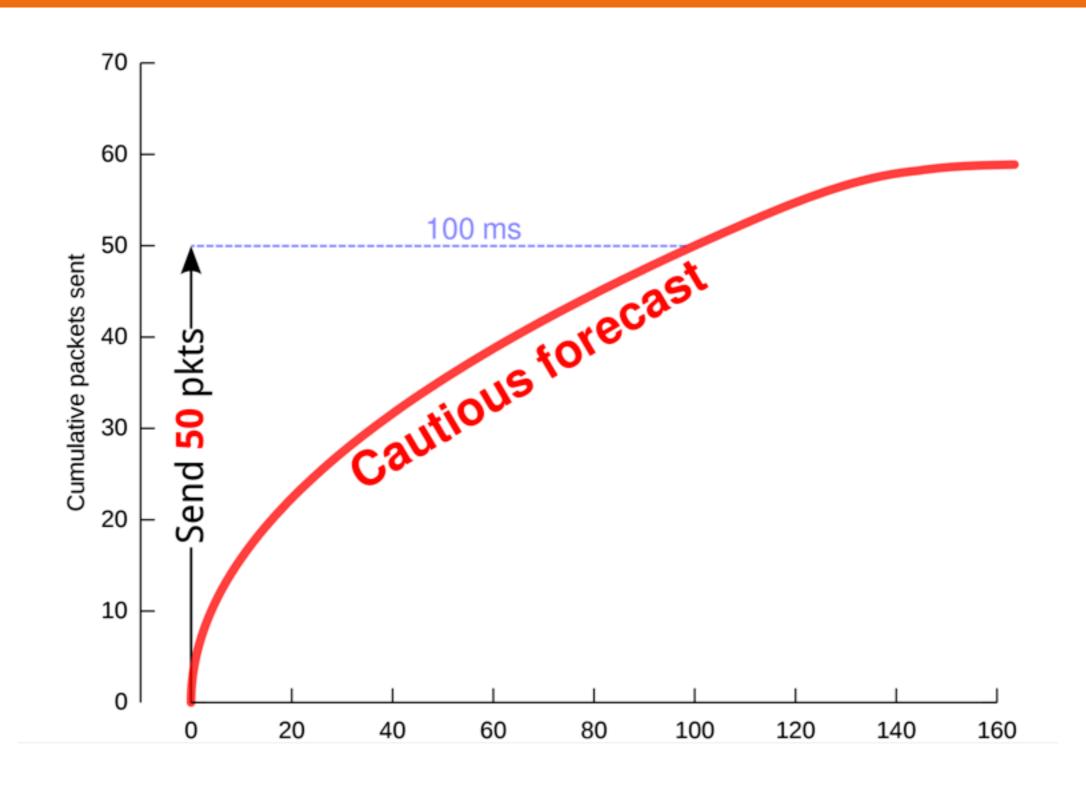
Evolve model forward

receiver feedback

Predict with a certain horizon

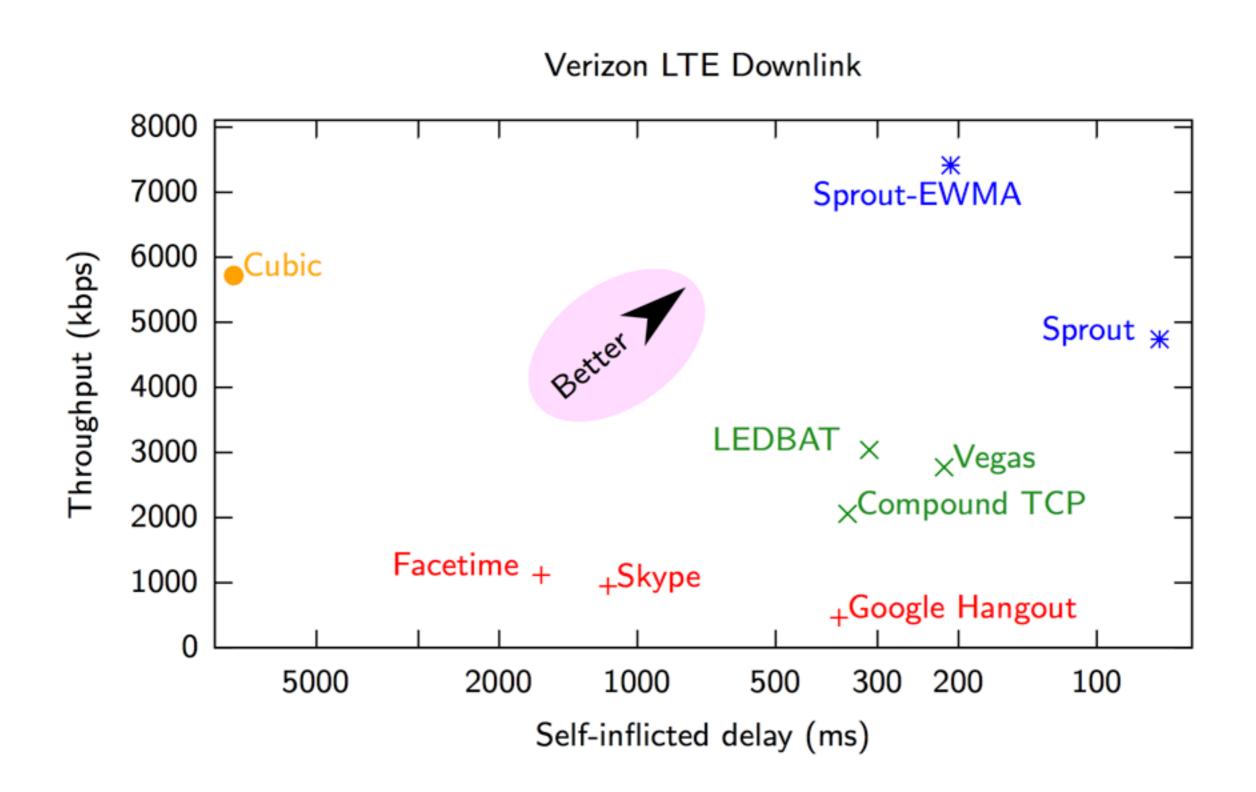
## Control: fill up 100 ms forecast window





#### **Evaluation: LTE Verizon Downlink**





## Discussion:





#### High BDP Wireless Satellite Inter-DC Intra-DC

BIC H-TCP Compound CUBIC FAST TCP

Westwood Vegas Veno Hybla STAR

Illinois SABUL

**DCTCP** 

10X

10X

17X



Unstable, RTT Unfair, Bufferbloat, Crash on Changing Networks, .......

Point Solutions



Performance Far from Optimal

#### Possible Answer No.2

Replace human from the loop



# Machine learning based CC



- Given a range of possible network conditions
  - Bandwidth, RTT, number of senders
- Using a set of congestion control signal
  - r\_ewma, s\_ewma, rtt\_ratio

# Machine learning based CC



- Use offline machine learning to train a map
  - Rule(r\_ewma, s\_ewma, rtt\_ratio) → <m, b, τ>

- m Multiple to congestion window
- b Increment to congestion window
- au Minimum interval between two outgoing packets

## One action for all state

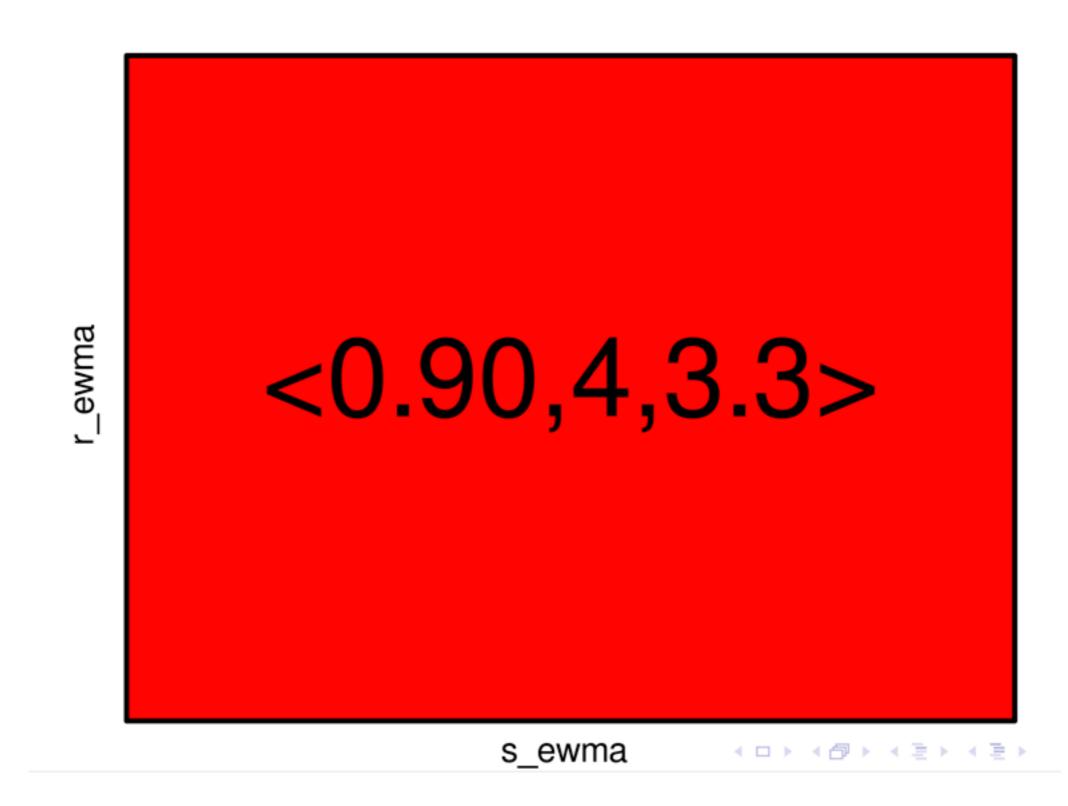


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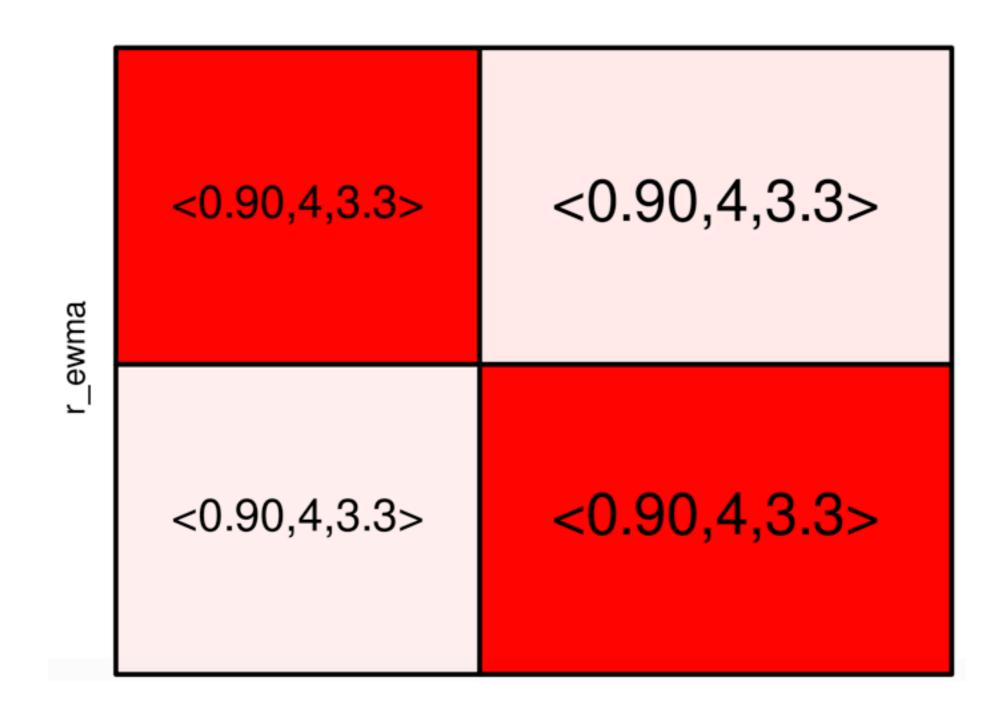
# The best single action, split on median





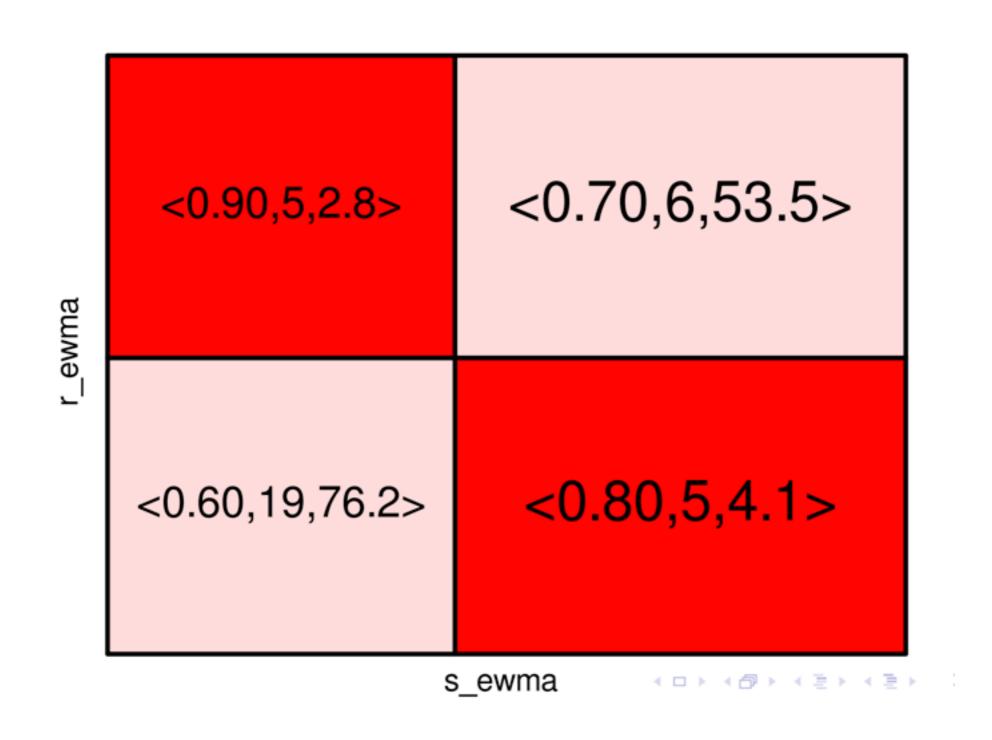
# Optimize for each sub actions





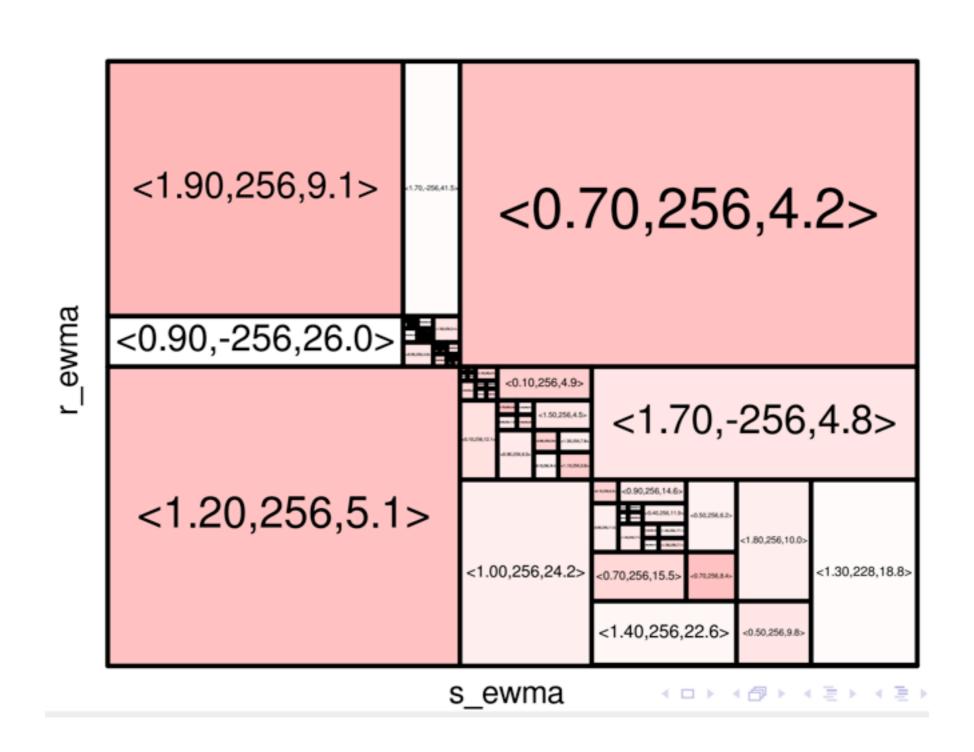
# Split the most used rule





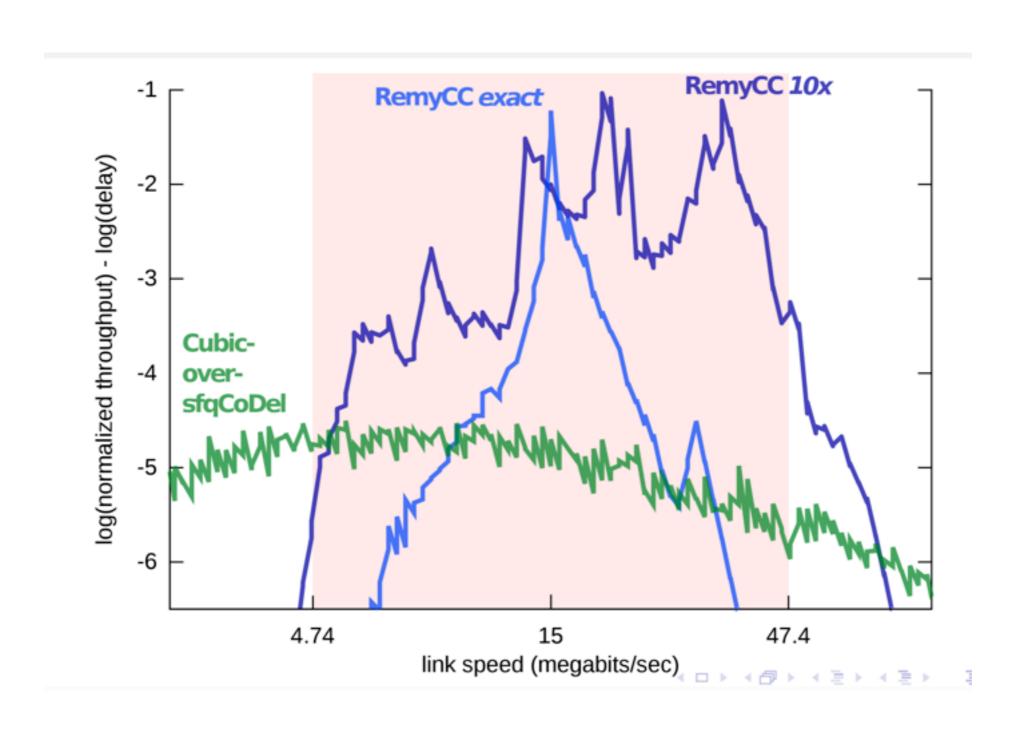
## Iterate





## Discussion

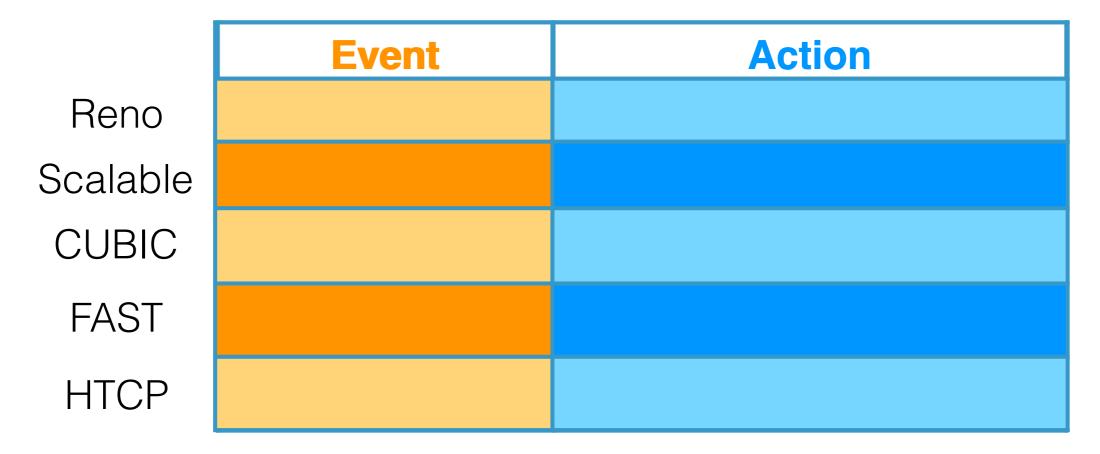


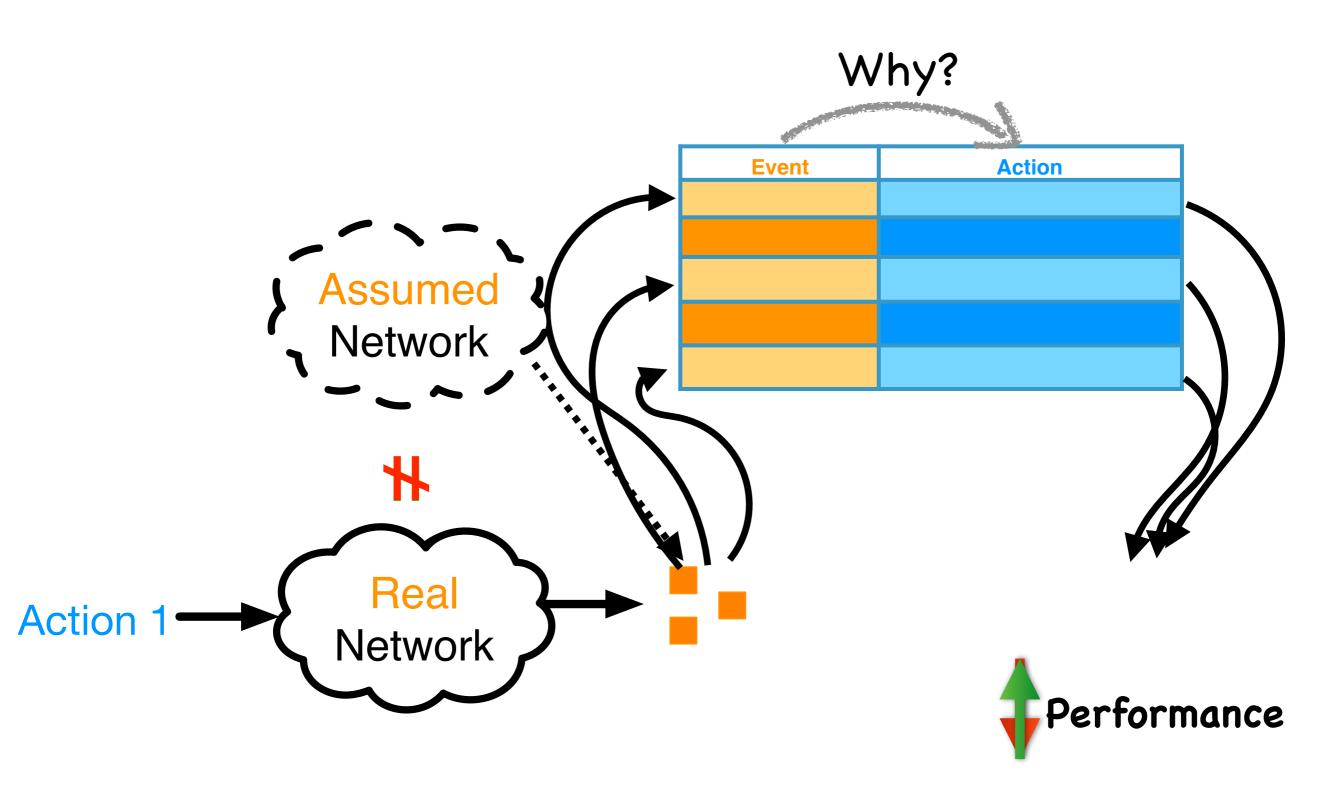


#### Possible Answer No.3

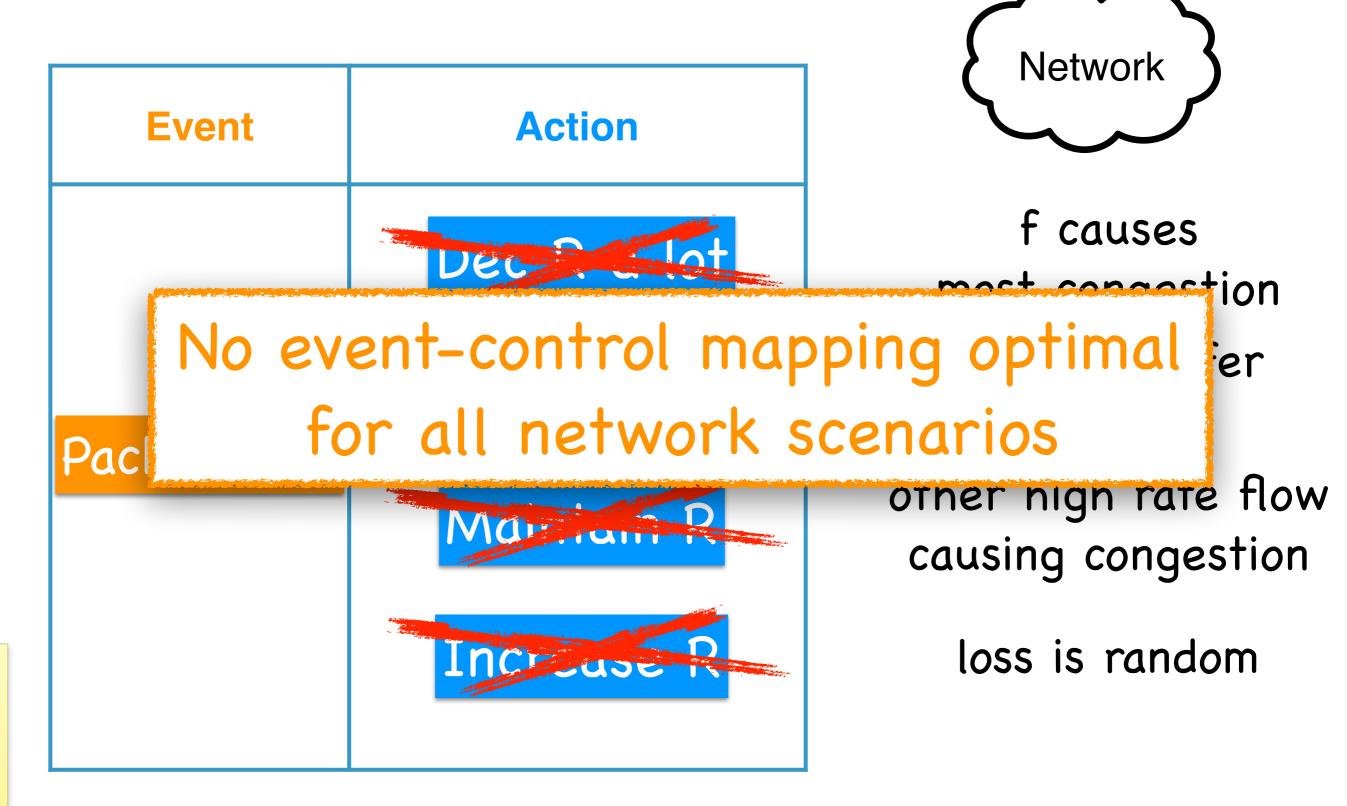
# TCP's Architecture Sucks

# Hardwired Mapping





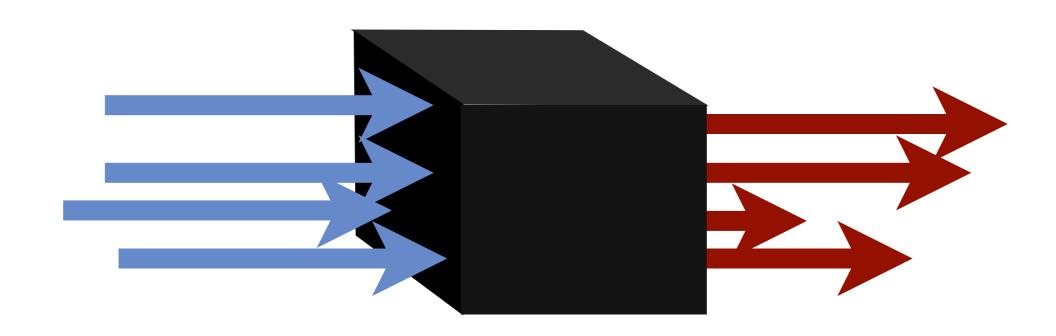
## Flow f sends at R

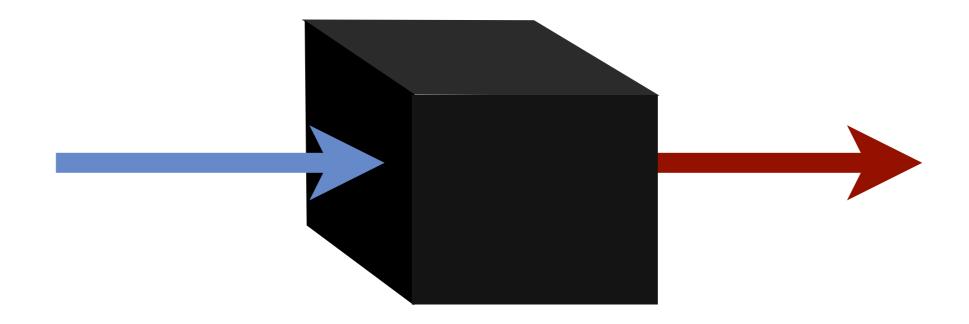


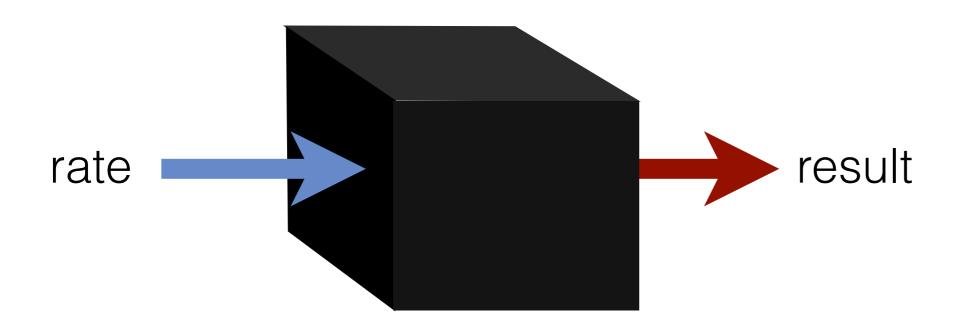
#### PCC

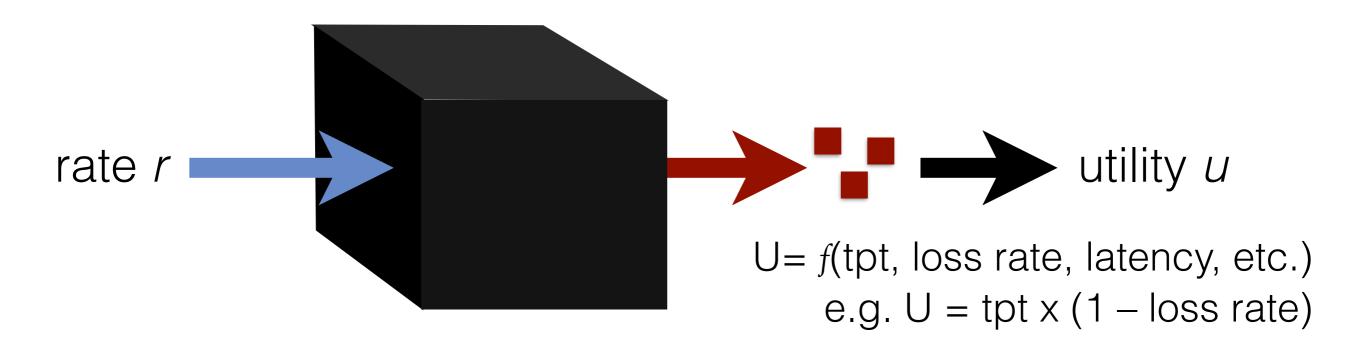
[Dong et al., NSDI'15]

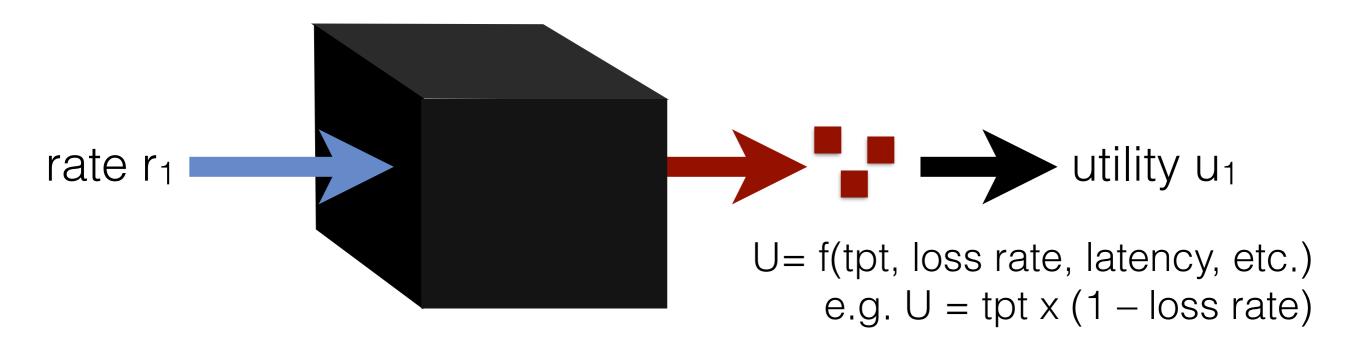
(adapted from Dong's slides)



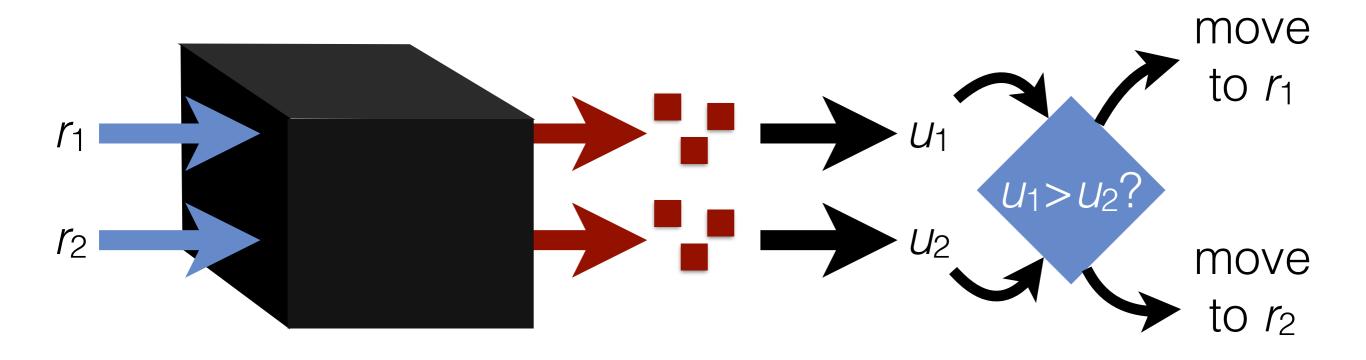




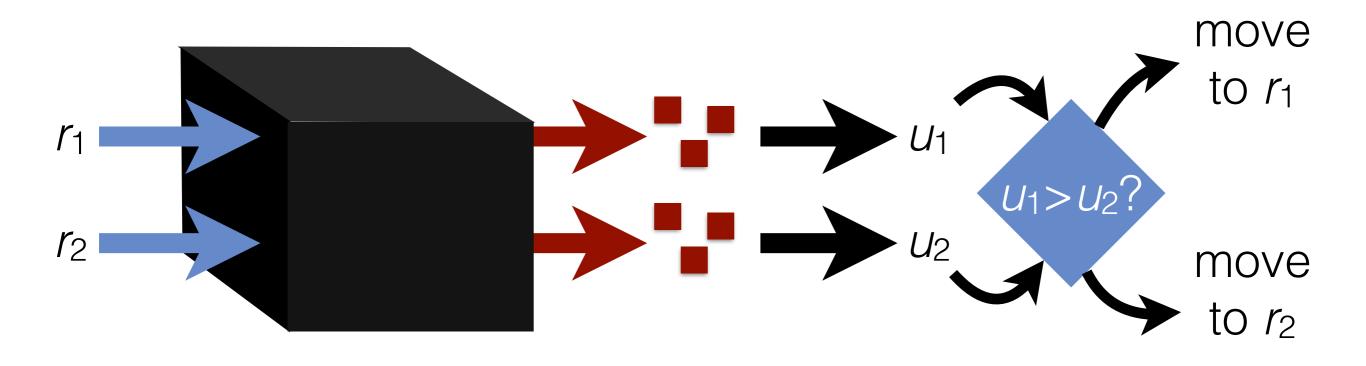




No matter how complex the network, rate r —> utility u



## Performance-oriented Congestion Control



Observe real performance

Control based on empirical evidence

yields
Consistent
high performance

## Consistent High Performance

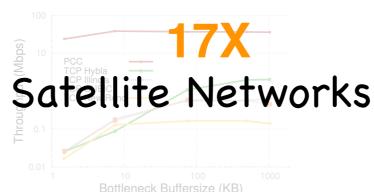
Table 1: PCC significantly outperforms TCP in inter-data center environments. RTT / in v.ec; throughput in Mbps.

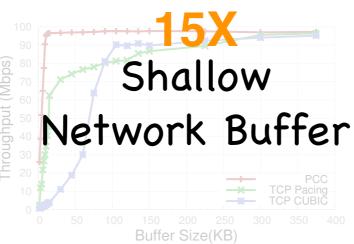
| Transmission Pair                | RTT  | PCC | SABUL | CUBIC       |     |
|----------------------------------|------|-----|-------|-------------|-----|
| GPO → NYSERNet<br>GPO → Missouri | n    | tei | rD(   | 129<br>80.7 |     |
| GPO → Missour<br>GPO → Illinois  | 35.4 | 766 | 664   | 84.5        |     |
| NYSERNet → Missouri              | 47.4 | 816 | 662   |             |     |
| Wisconsin → Illinois             |      |     | 700   | 547         |     |
| $GPO \rightarrow Wisc.$          | 38.0 |     | 487   | 79.3        |     |
| $NYSERNet \rightarrow Wisc.$     | 38.3 |     | 673   | 134         |     |
| Missouri → Wisc.                 | 20.9 |     | 698   | 259         |     |
| NYSERNet → Illinois              |      |     | 674   | 141         | 141 |

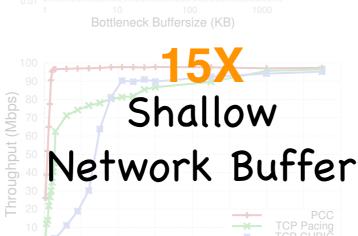
Solves

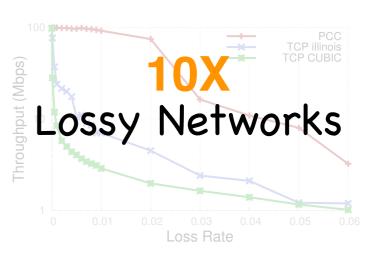
RTT Unfairness

RTT of Long-RTT flow (ms)

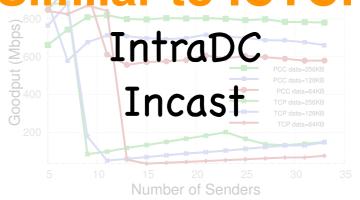










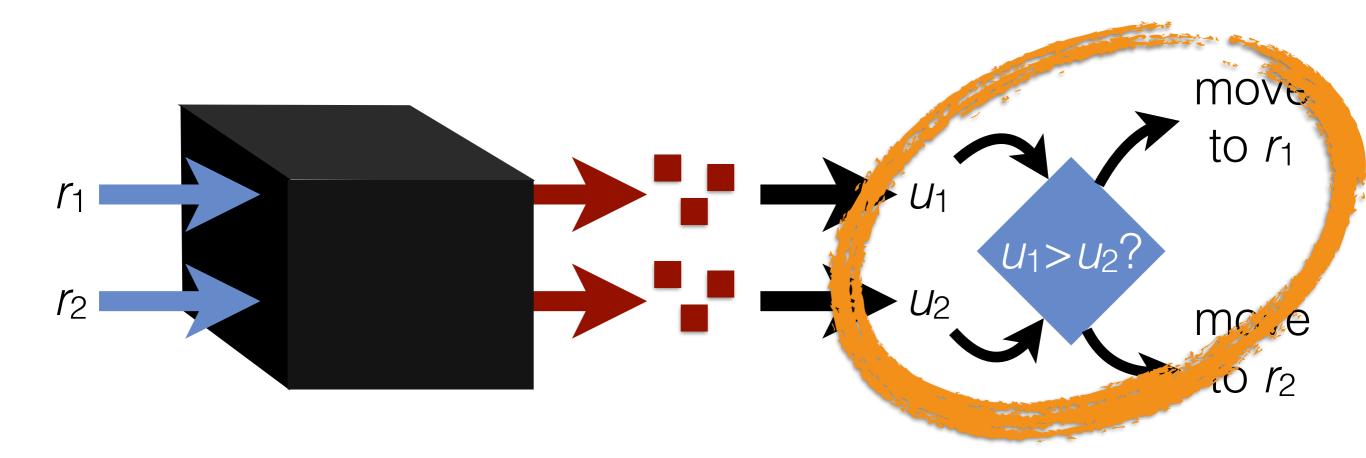








## Where is Congestion Control?

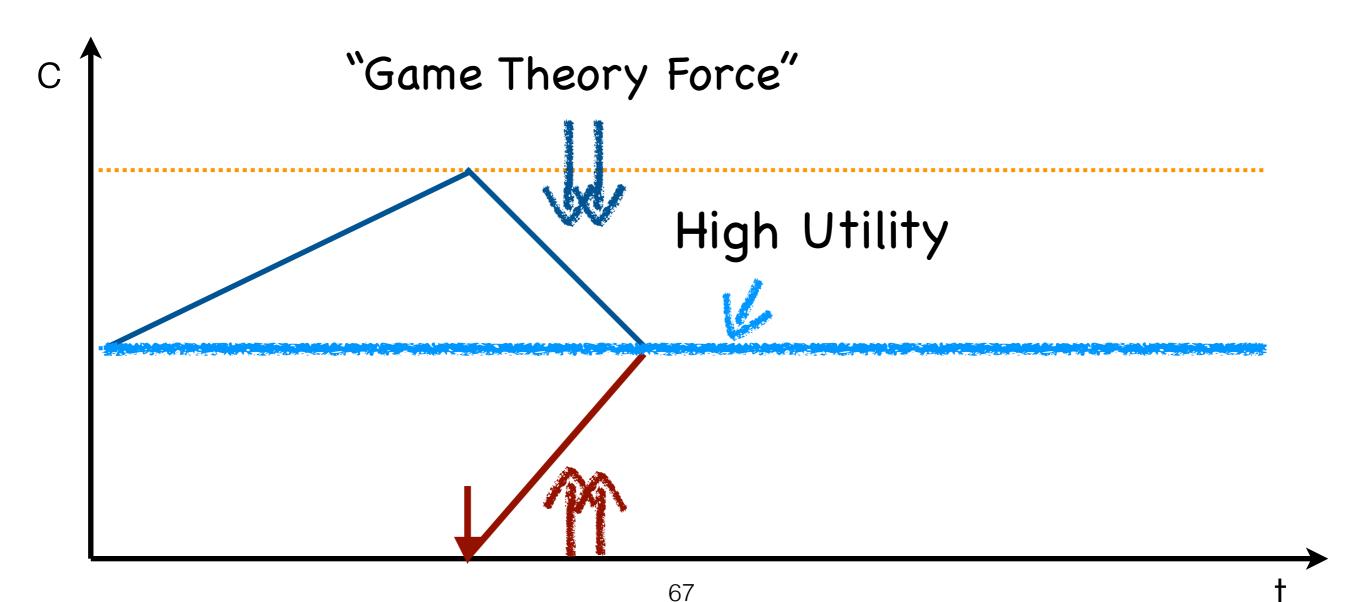


Selfishly maximizing utility => non-cooperative game

Do we converge to a fair Nash equilibrium?

## PCC Dynamics

PCC does not need AIMD because it looks at real performance



#### Discussion:

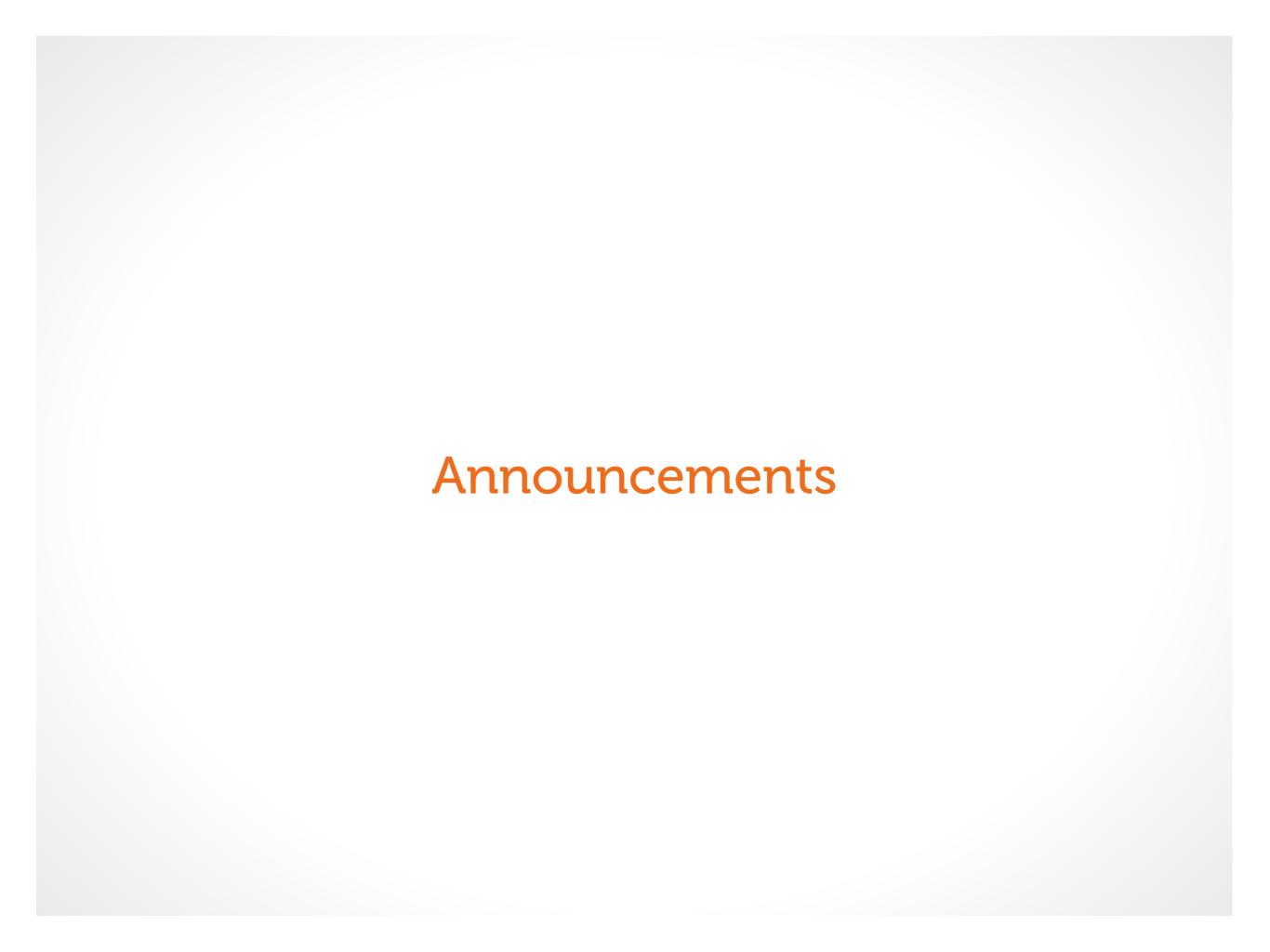


What's the catch?

Specialized vs general-purpose

Different utility function competing in the network?

Who cares about TCP friendliness and why?



## Announcements



Wed Feb 15: 50-Gb/s IP Router

Project Proposal: Wed Feb 15 due

# Project proposals



#### Project proposals due I Iam Wednesday Feb 15

- Submit via email to Brighten
- 1/2 page, plaintext

#### Describe:

- the problem you plan to address
- what will be your first steps
- what is the most closely related work, and why it has not addressed your problem
  - at least 3 full academic paper citations (title, authors, publication venue, year) plus paper URLs
- if there are multiple people on your project team, who they are and how you plan to partition the work

# Project proposals



#### Talk to us if...

- You need a project idea
- You'd like advice on a project idea
- You need partners
- You're just a nice person and want to say hi

#### After submission

- Course staff will give feedback and approve or request changes
- Proposal is 5% of course grade

#### See also course syllabus