

Vern Paxson's Paper  
“End-to-End  
Internet Packet  
Dynamics”, 1997/99

How often are packets dropped?

How often are packets  
reordered?

**Why these questions?**

# I. Understand the Internet

“When you can measure what you are speaking about, and express it in numbers, you know something about it; but when you cannot measure it, when you cannot express it in numbers, your knowledge is of a meagre and unsatisfactory kind;”

- Lord Kelvin

# II. Model the Internet

**III. Enable more  
accurate evaluation  
through simulations**

**IV. Lead to a better  
application/systems  
design**



How often are packets dropped?

How often are packets  
reordered?

**How to answer these  
questions?**

**Collect lots of packet  
traces**

**Analyze the traces**

# **Trace collection:**

large number of flows

a variety of sites

many packets per flow

use TCP

**Why TCP:**

real-world traffic

will not overload the  
network

Time between measurement is  
Poisson distributed

PASTA Theorem. Intuitively, if we  
make  $n$  observations and  $k$   
observations is in some state  $S$  and  
 $n-k$  in another state, then we can  
assume prob of observing  $S$  is  
approximately  $k/n$ .

# **Two traces:**

**N1: Dec94**

**N2: Nov-Dec95**

use tcpdump at sender + receiver

**100 kB**

Size of file transferred



**21**

Number of sites

**20800**

Number of trace pairs

# **Part I:** **The Unexpected**

# Packet Reordering

1  
2  
5  
3  
4

2 reorderings

**NI**

**N2**

**36%**

**12%**

Percentage of connections with  
at least one out-of-order delivery

NI

N2

**2%**

**.3%**

Percentage of data packets out-of-order

N1

**.6%**

N2

**.1%**

Percentage of ACK packets out-of-order



Data packets are  
usually sent closer  
together.

From

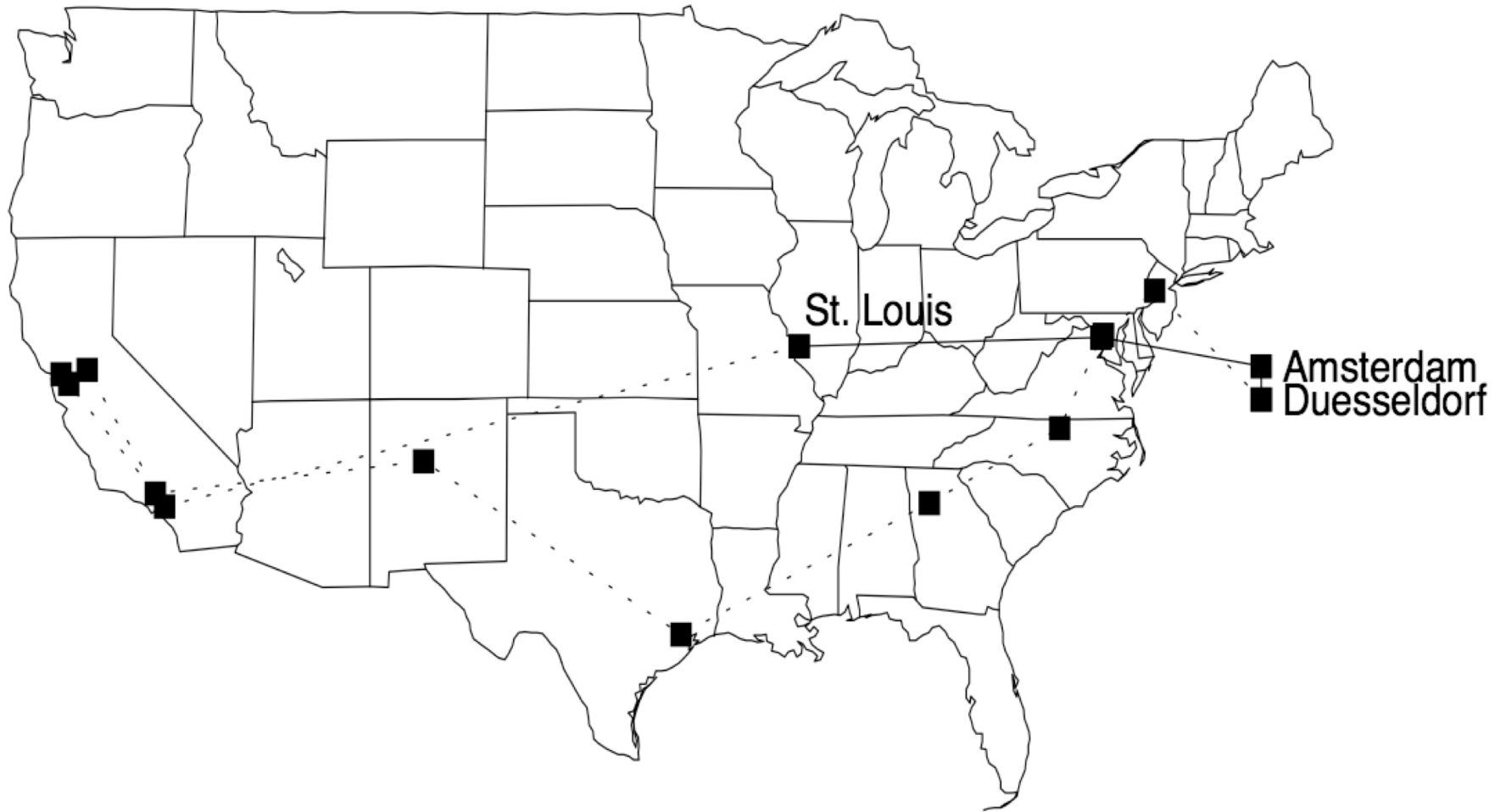
To

**15%**

**.2%**

Percentage of packets out-of-order  
to and from U of Colorado in NI.

**Route fluttering:**  
alternate packets  
can take different  
route to dest.



Taken from Paxson's PhD Thesis: Alternate routes are taken for packets from WUSTL to U Mannheim

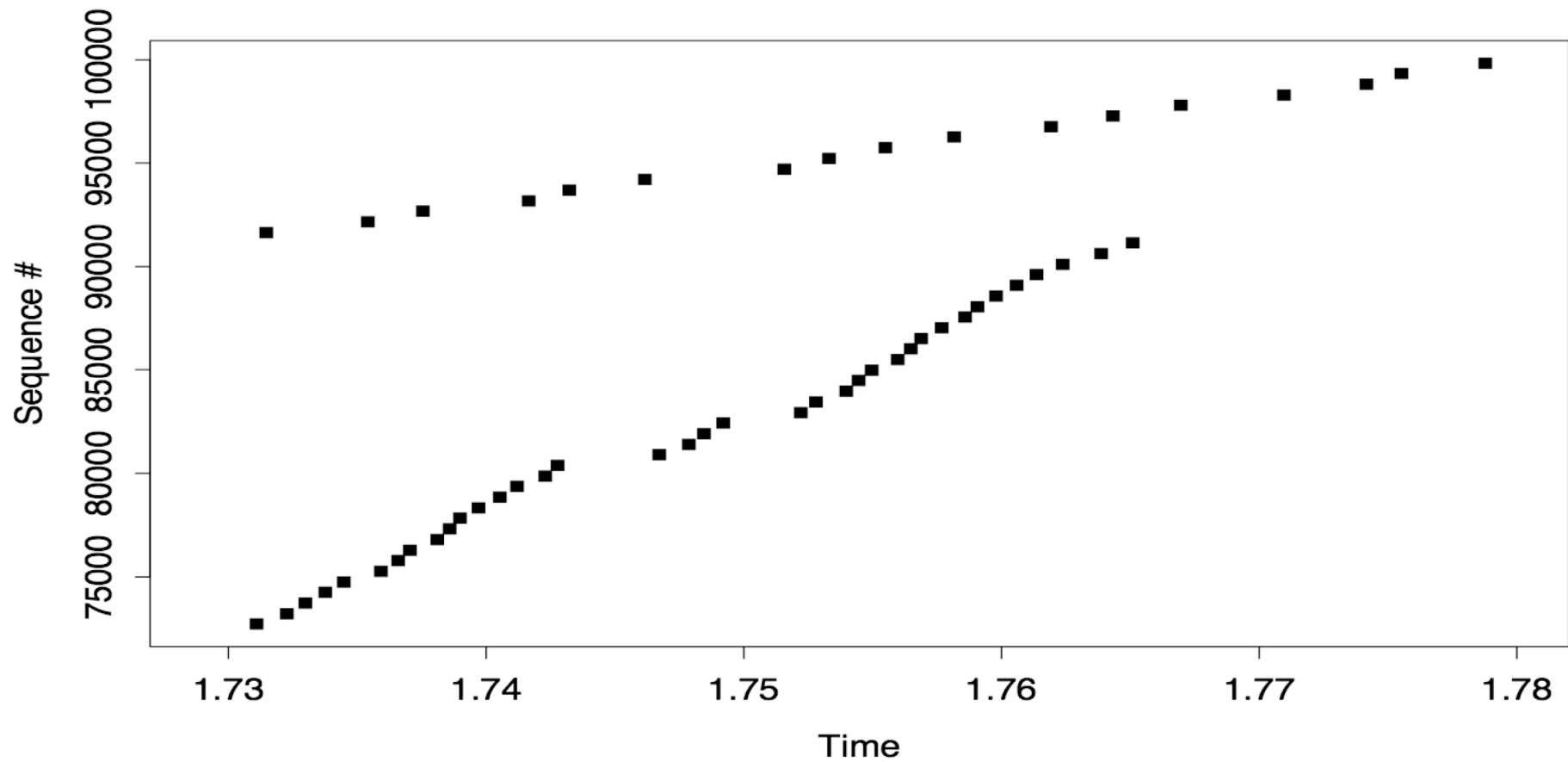


Fig 1 from the paper, showing large gap and two slopes.

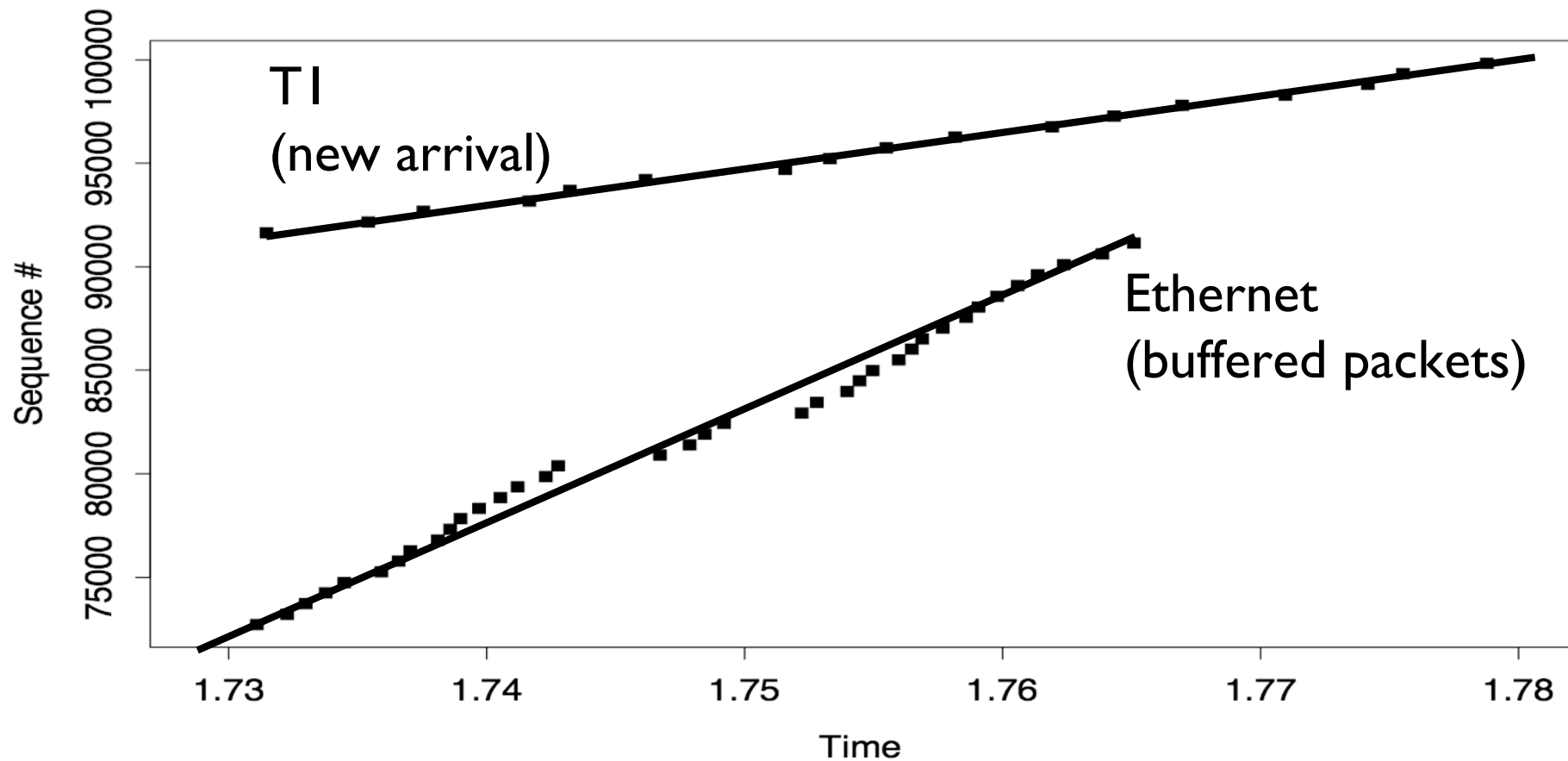
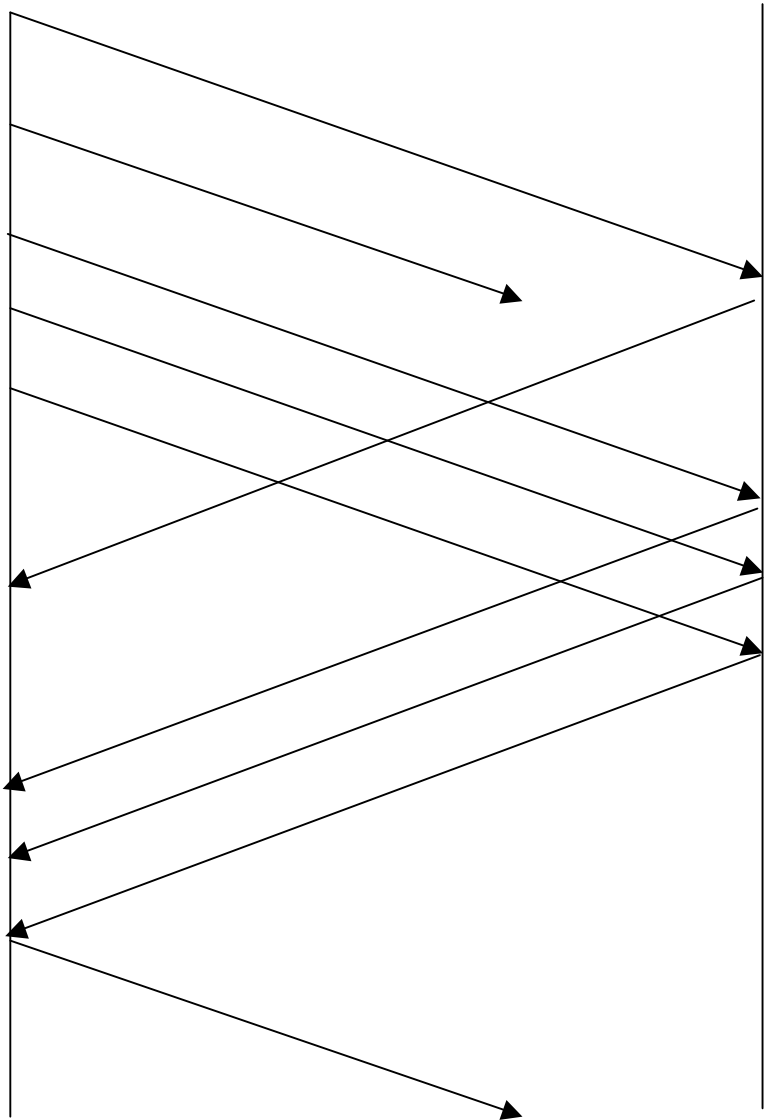
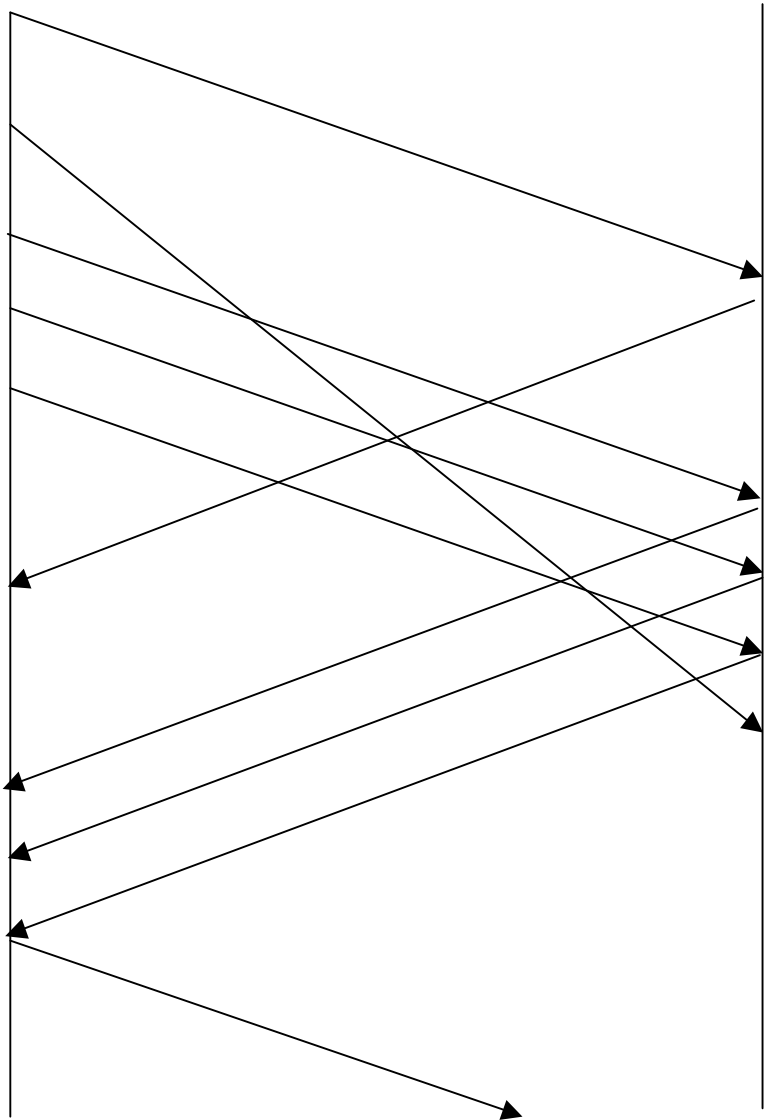


Fig 1 from the paper, showing large gap and two slopes.

# Impact of Packet Reordering

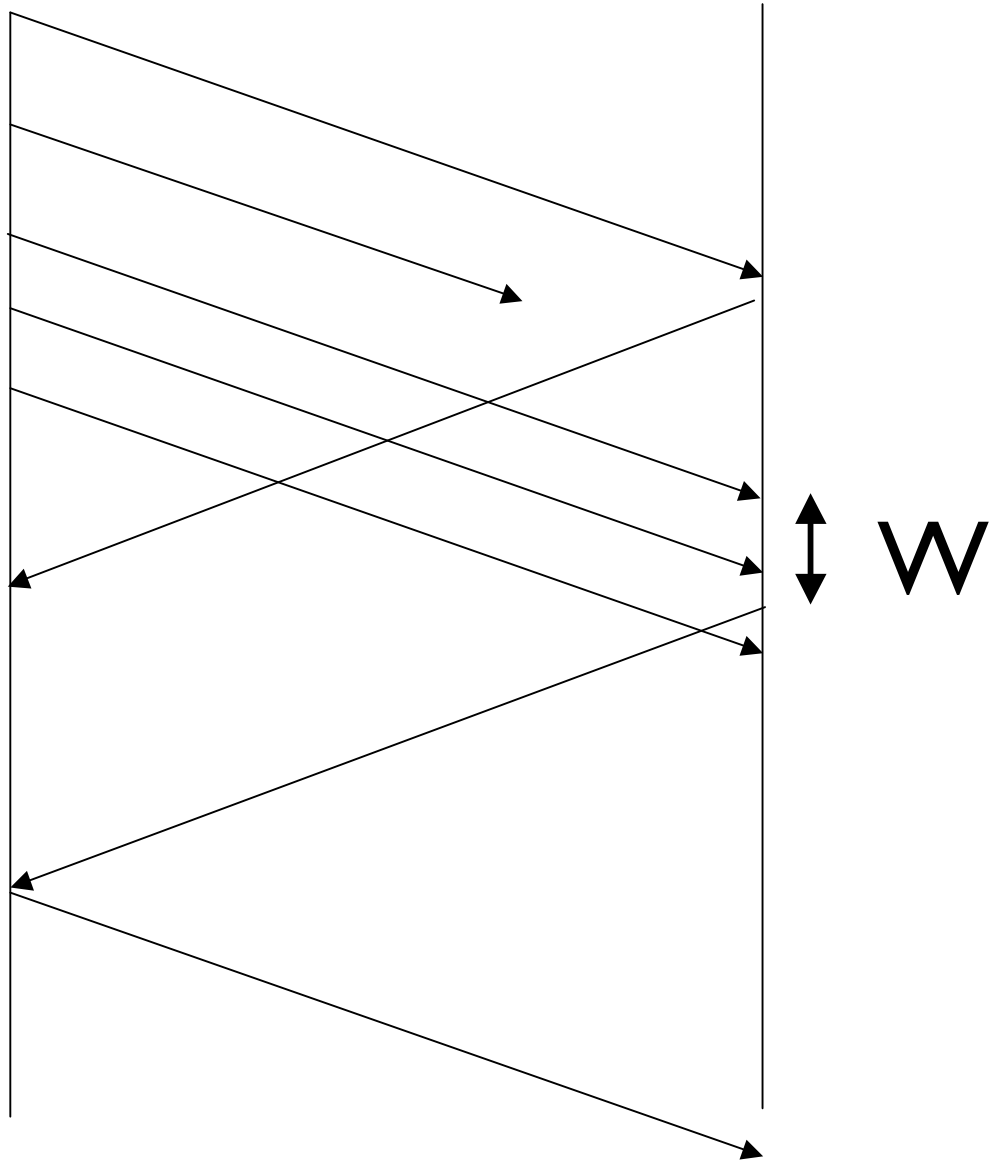




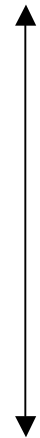


$N_d = 3$  is a  
conservative  
choice.

What if receiver  
wait longer before  
sending dup ack?

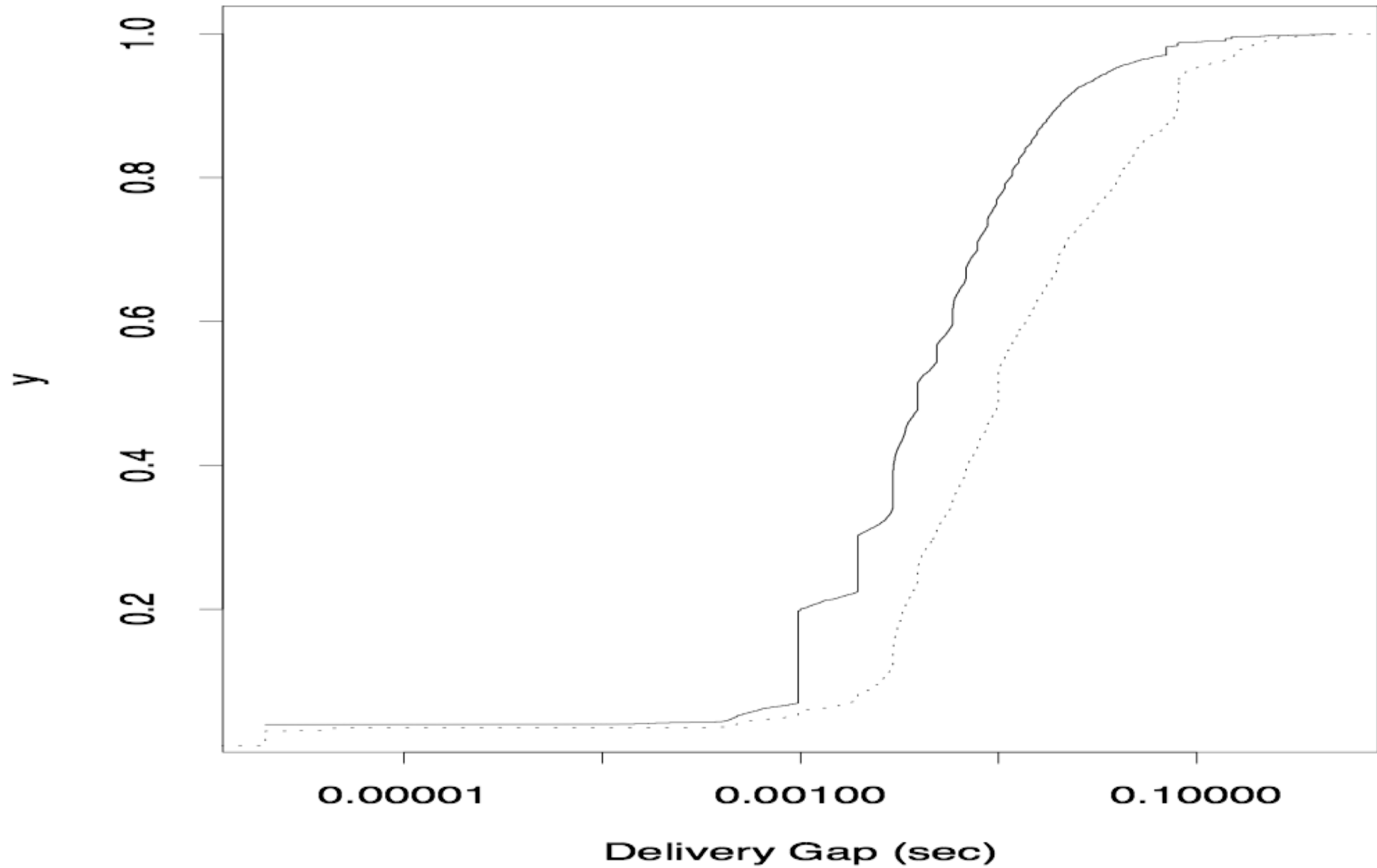


1  
2  
5  
3  
4

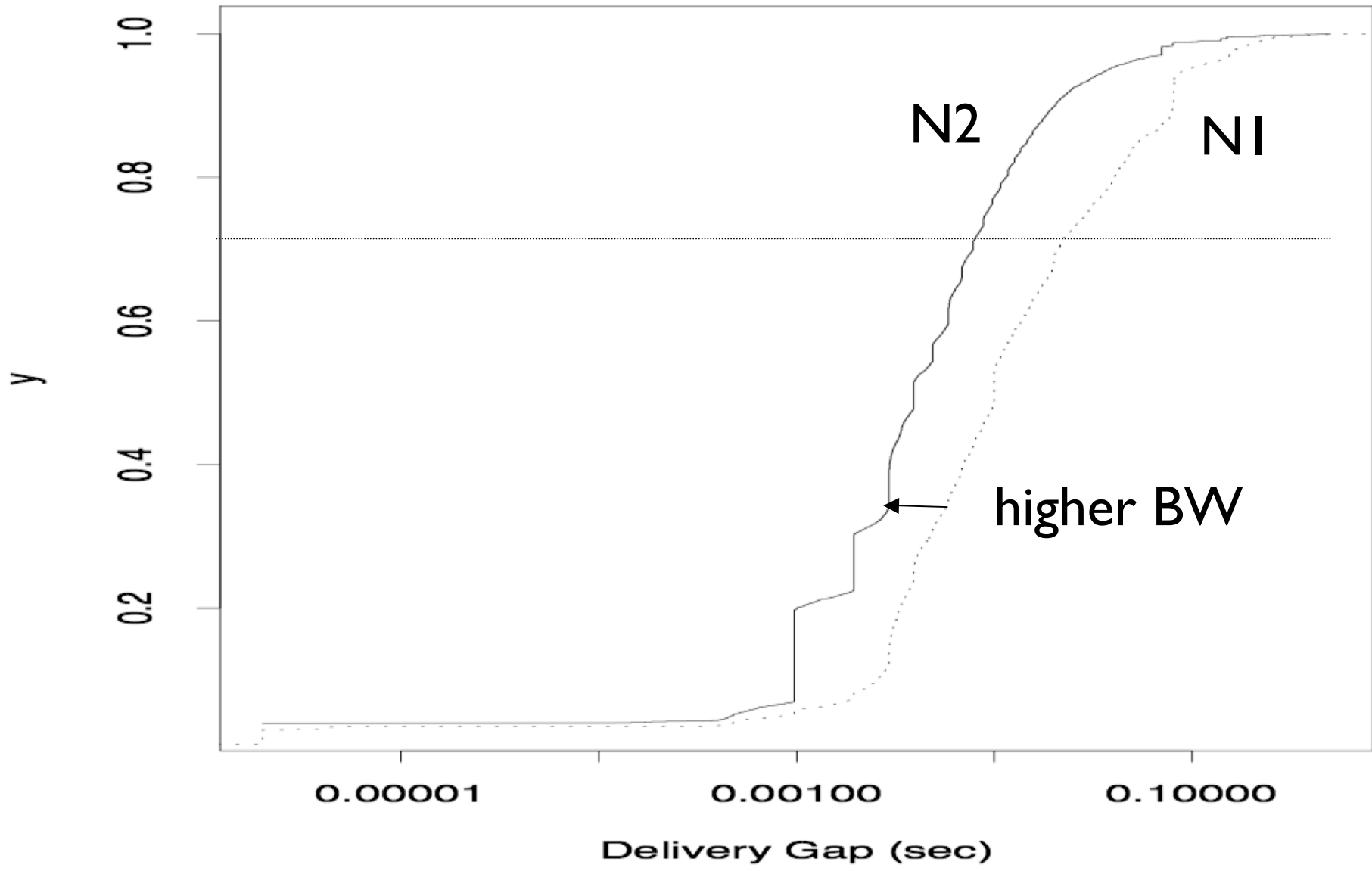


**Delivery Gap:**

time between receiving  
an out-of-order packet and  
the packet sent before it.



Taken from Paxson's PhD Thesis: CDF for delivery gap between reordered packets.



**NI**

**N2**

**20ms**

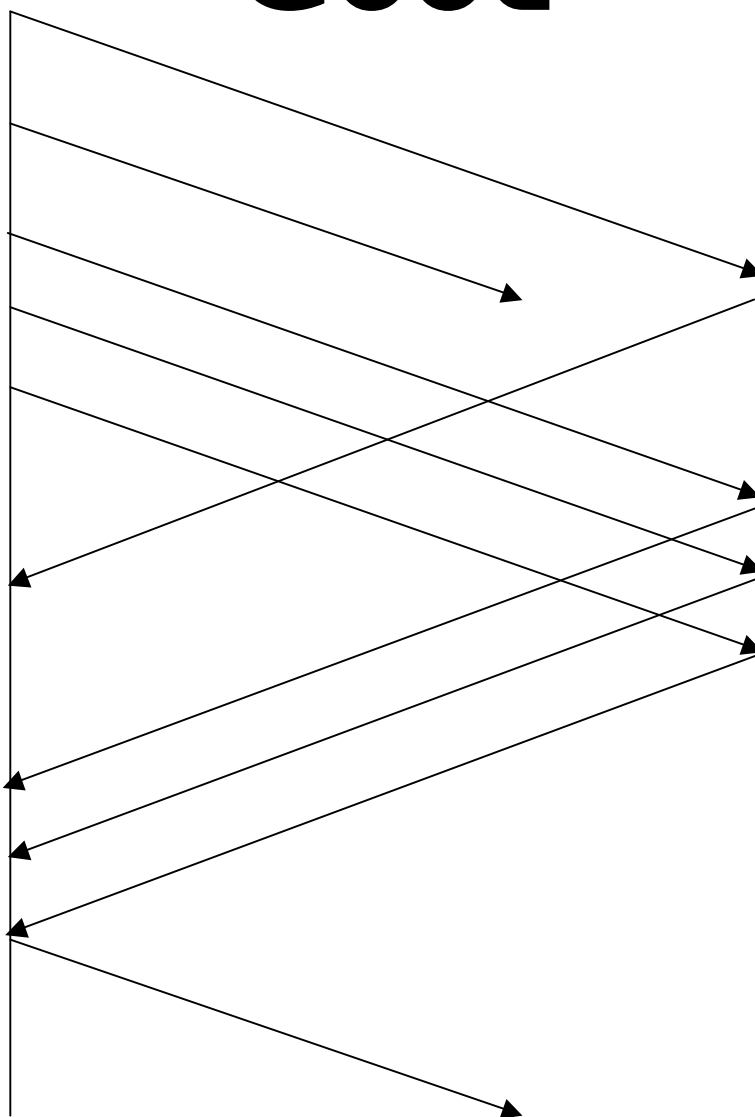
**8ms**

Waiting time with which 70% of  
out of order delivery would be identified.



**Is needless  
retransmission a  
problem?**

# Good



**NI**

**N2**

**22**

**300**

Number of good retransmissions  
for every bad retransmission.

$$N_d = 3, W = 0$$

N1

N2

~7

100

Number of good retransmissions  
for every bad retransmission.

$$N_d = 2, W = 0$$

N1

N2

**15**

**300**

Number of good retransmissions  
for every bad retransmission.

$$N_d = 2, W = 20\text{ms}$$

# Packet Corruption

**1 in 5000**

packet is corrupted

**l in 65536**

corrupted packet goes undetected  
using TCP checksum



**1** in **300** million

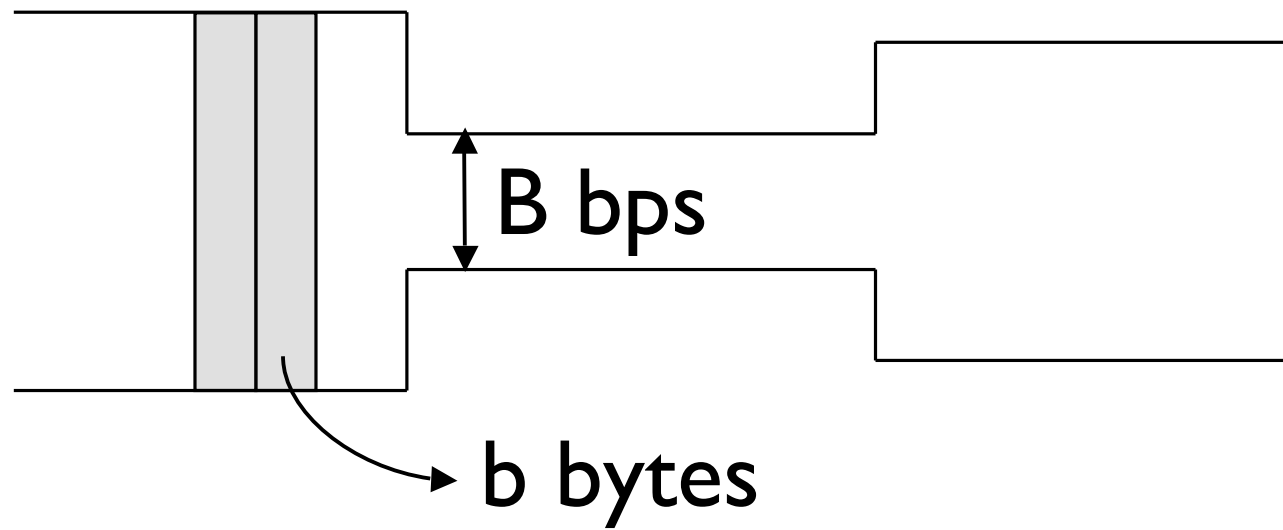
Internet packet is corrupted  
and is undetected.

# **Part 2:**

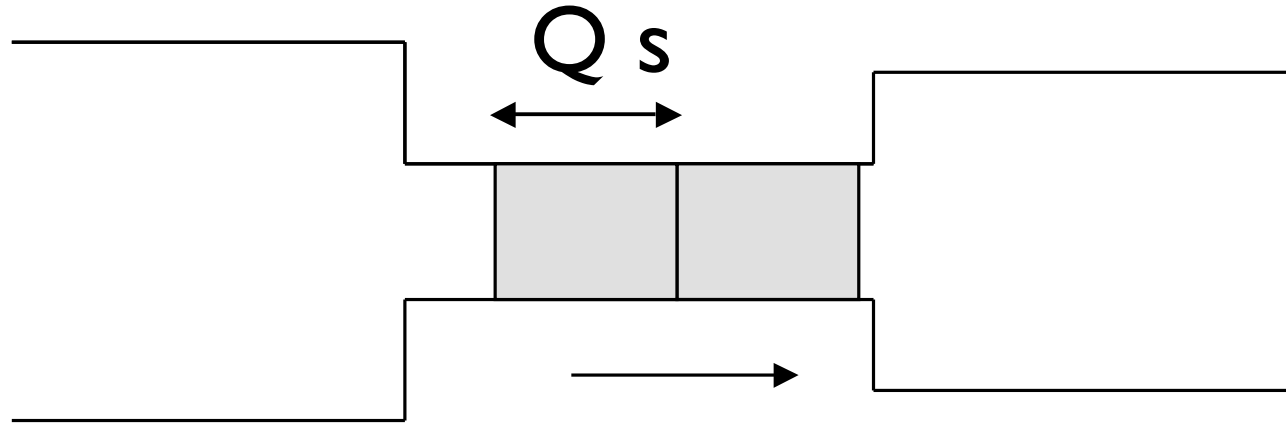
# **Bottleneck**

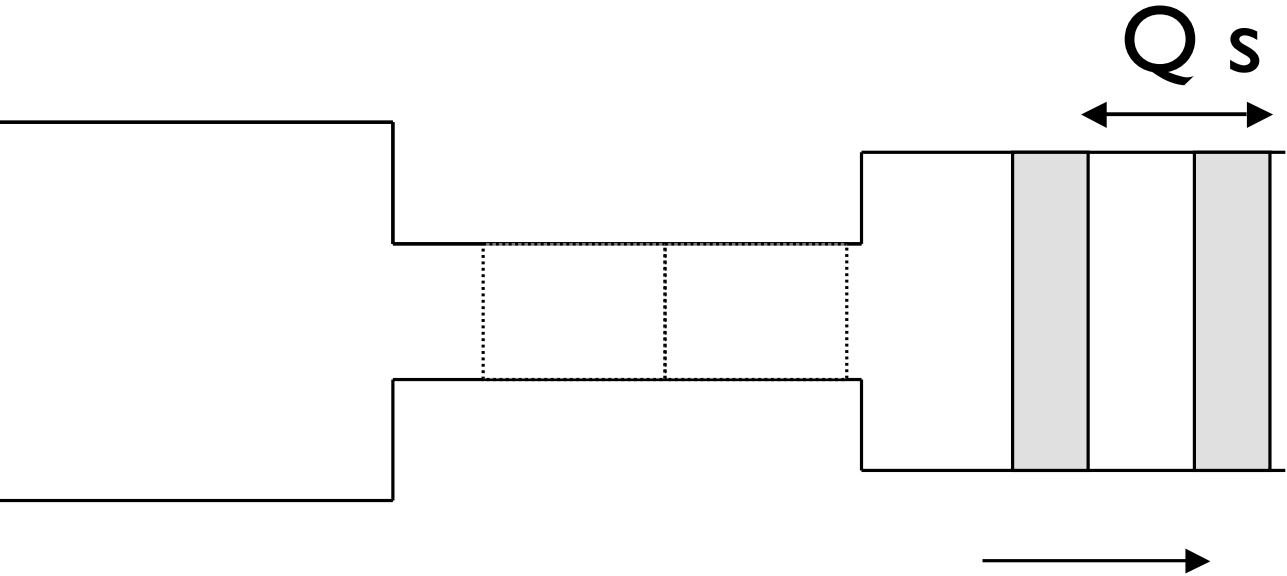
# **Bandwidth**

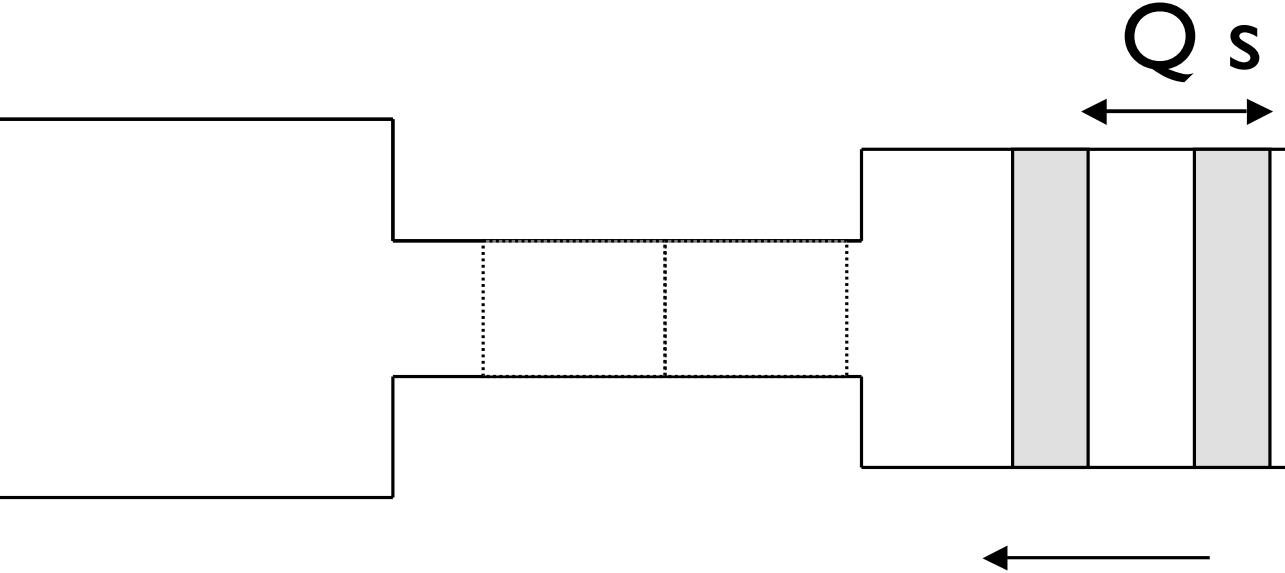
**Packet Pair**

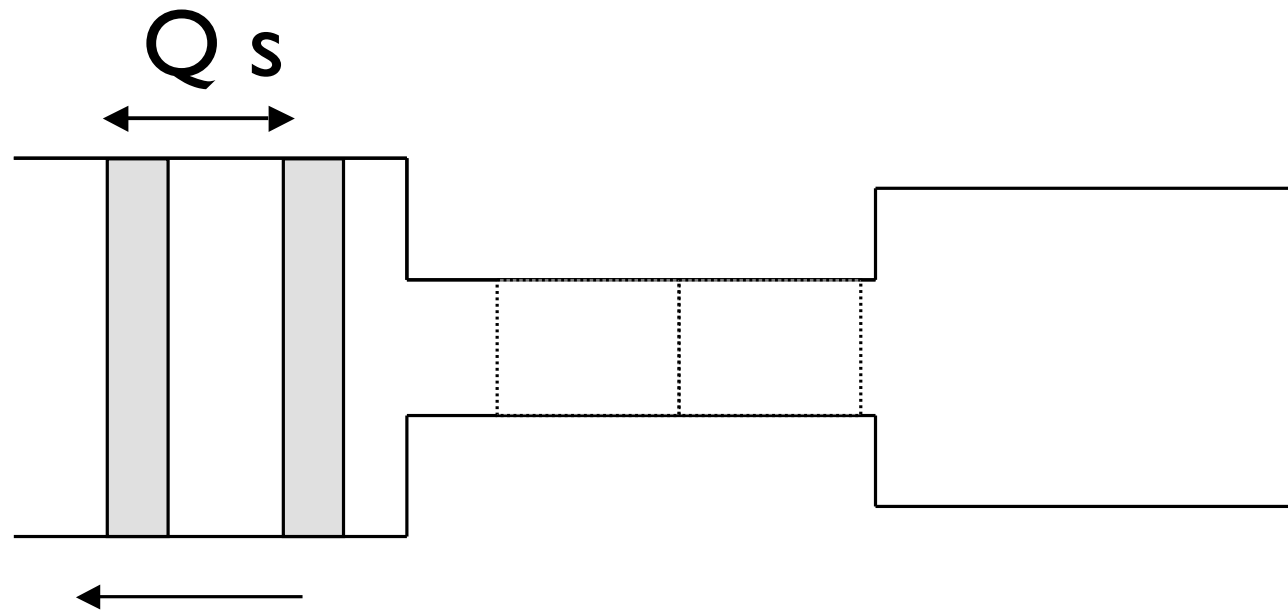


$$Q \times B = b$$











# Problems with Packet Pair

# I. *Asymmetric* Link

# 2. ACK Compression

# 3. Out of order delivery

# 4. Clock resolution

# 5. Changing bottleneck bandwidth

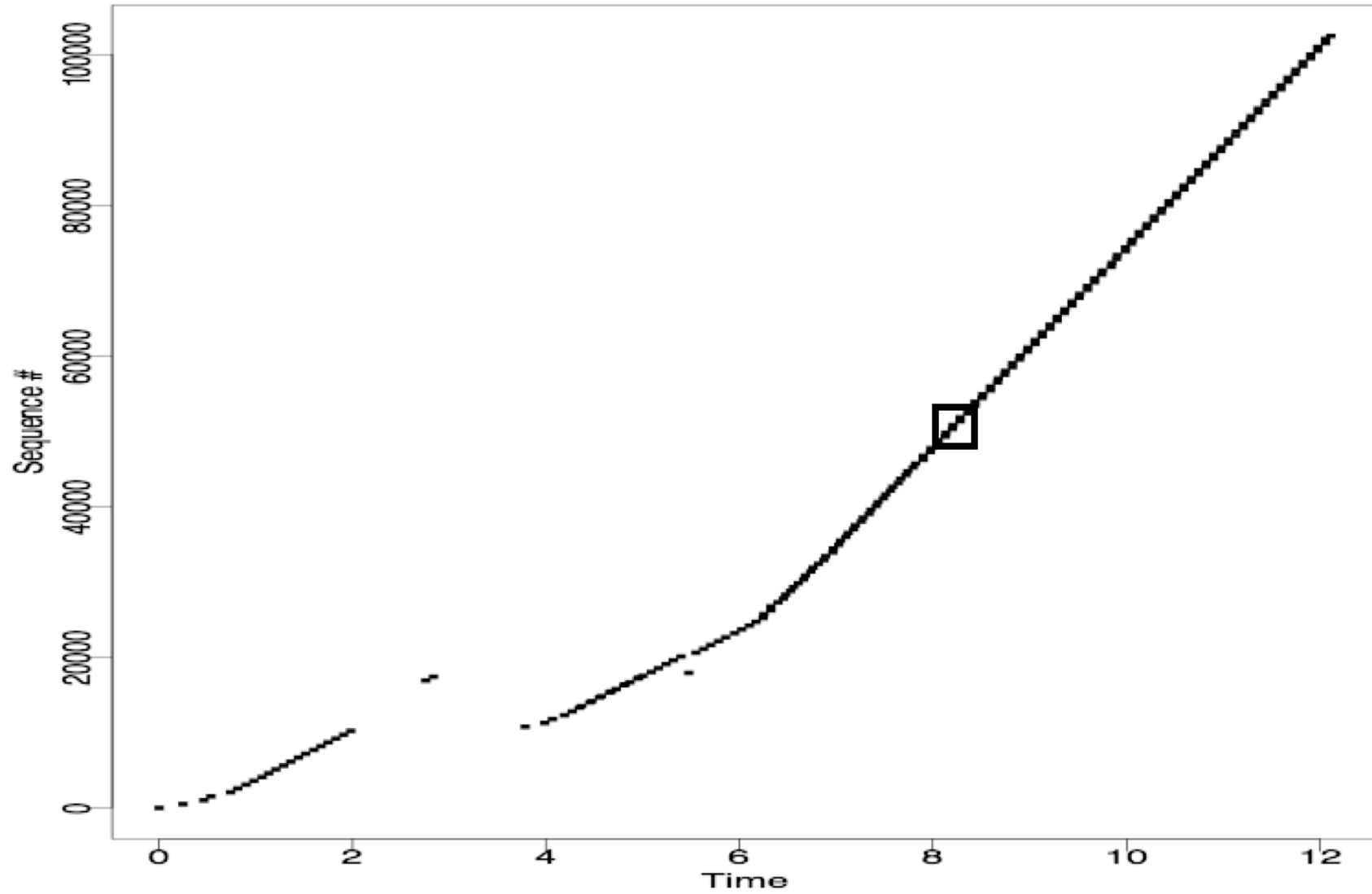


Fig 2 from the paper, showing changing bandwidth.

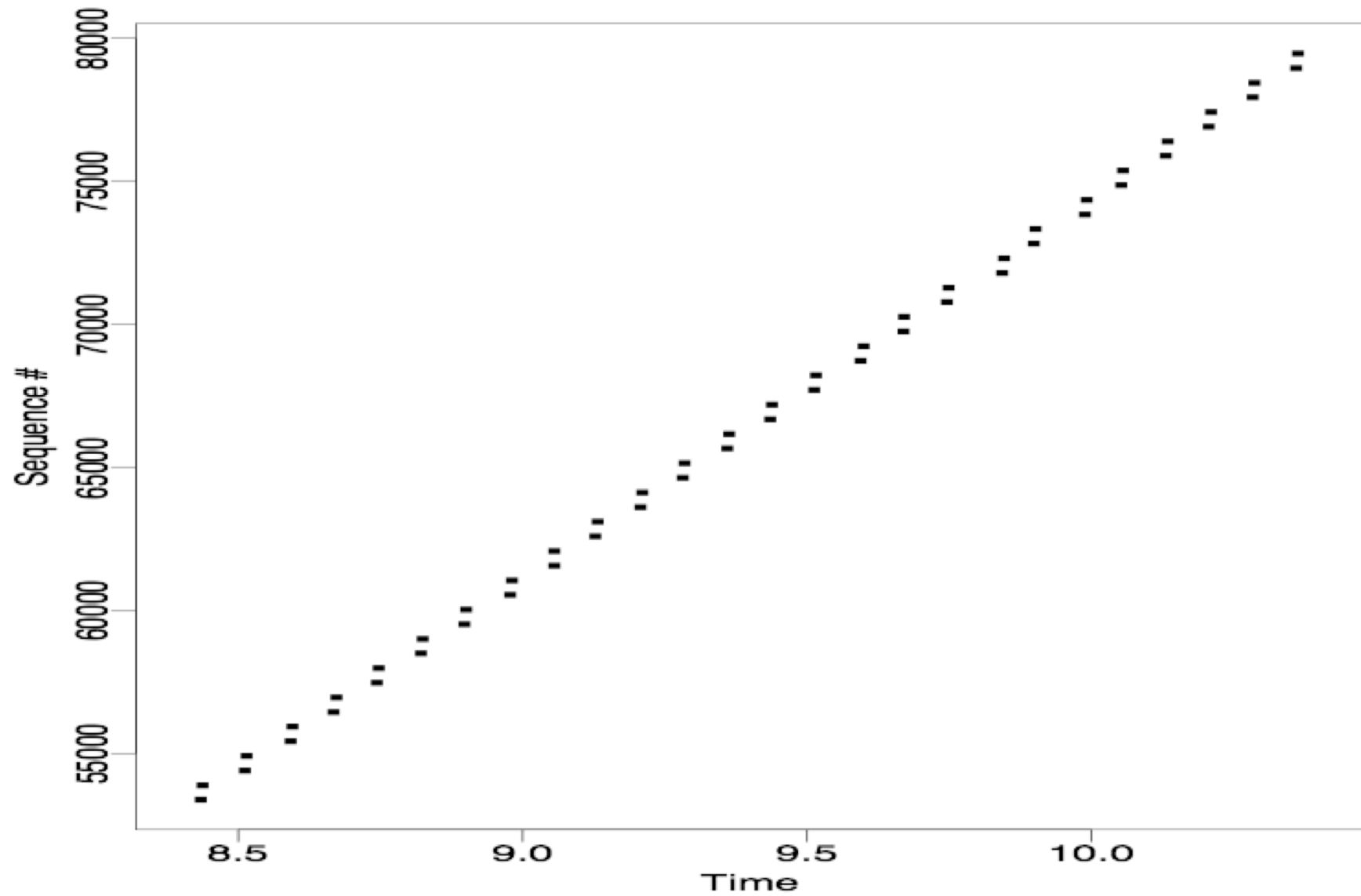


Fig 3 from the paper, showing multi-channel links.



# 6. Multi-channel Links

Asymmetric links

ACK compression

Out-of-order delivery

Clock resolution

Changes in bottleneck bandwidth

Multi-channel links

## **Measure at receiver:**

Asymmetric links

ACK compression

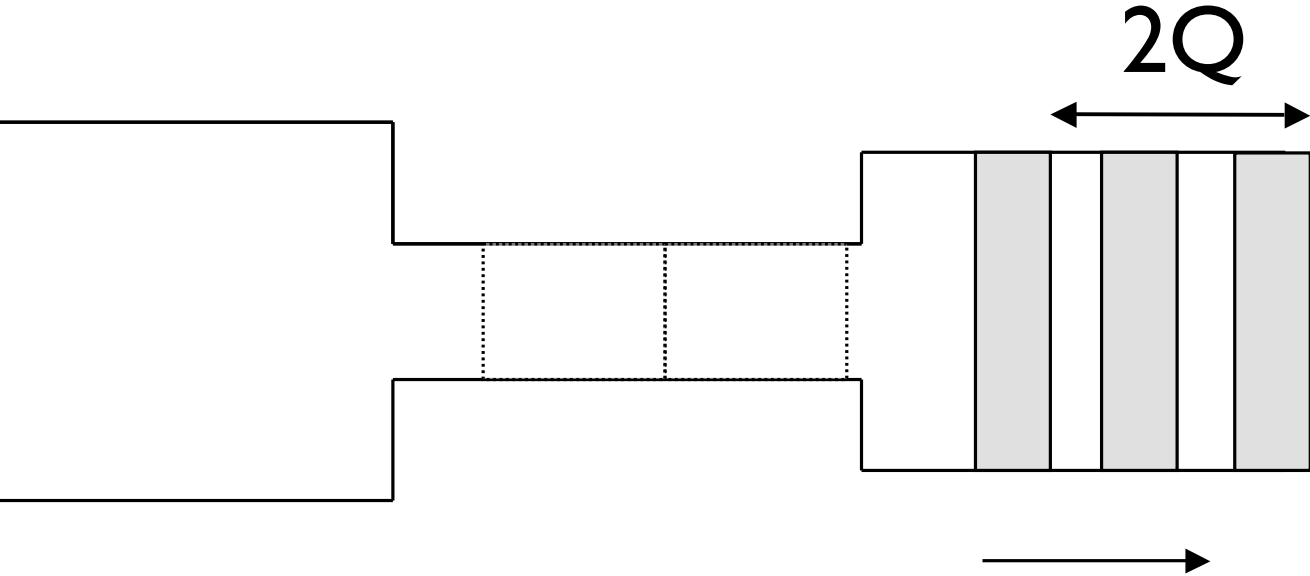
## **Packet bunch:**

Out-of-order delivery

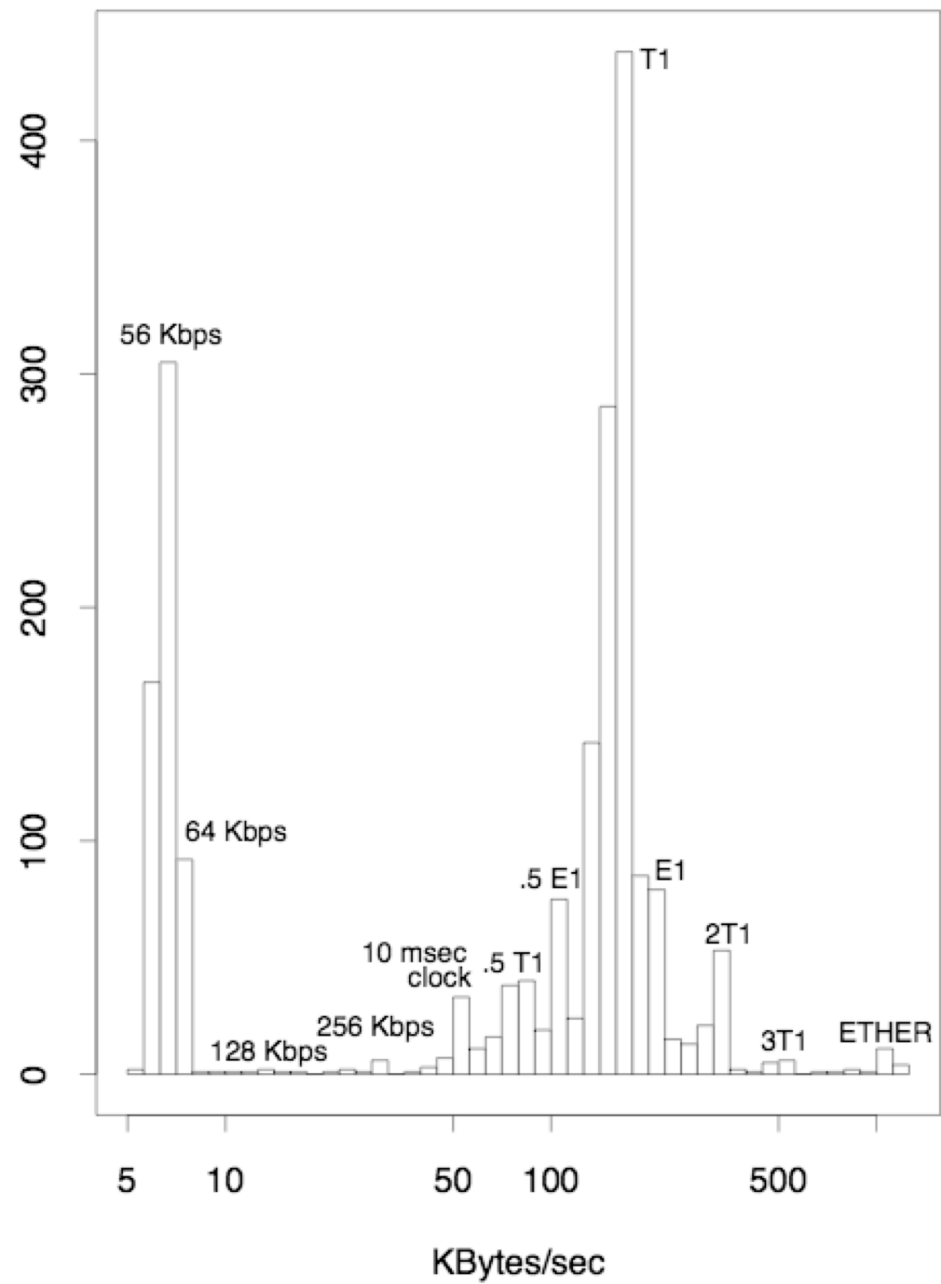
Clock resolution

Changes in bottleneck bandwidth

Multi-channel links



Collect multiple estimates, take the most freq occurrence (modes) as the bottleneck bandwidth.



# **Part 3:**

# **Packet Loss**

N1

N2

**2.7%**

**5.2%**

Percentage of packets that were lost.



NI

N2

**50%**

**50%**

Percentage of loss free connections

N1

N2

**5.7%**

**9.2%**

Loss rate on lossy connections

**17%**

Loss rate on connections from EU to US

**Are packet losses  
independent?**

# Compute:

$$P^u = \Pr [ p \text{ lost } ]$$

$$P^c = \Pr [ p \text{ lost } \mid \text{prev pkt lost } ]$$

$P_u$

$P_c$

**2.8%**

**49%**

Loss rate for “queued data pkt” on NI

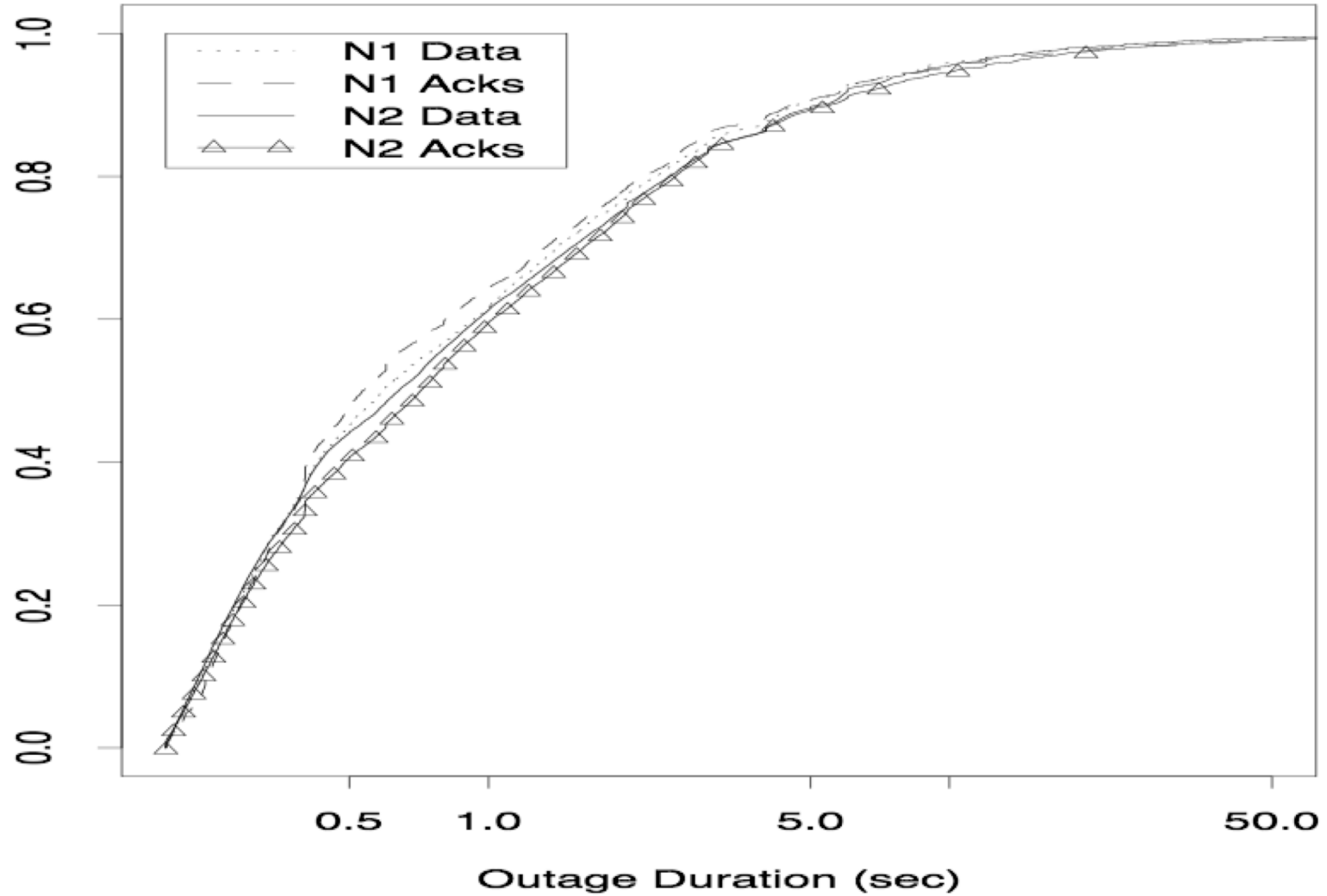
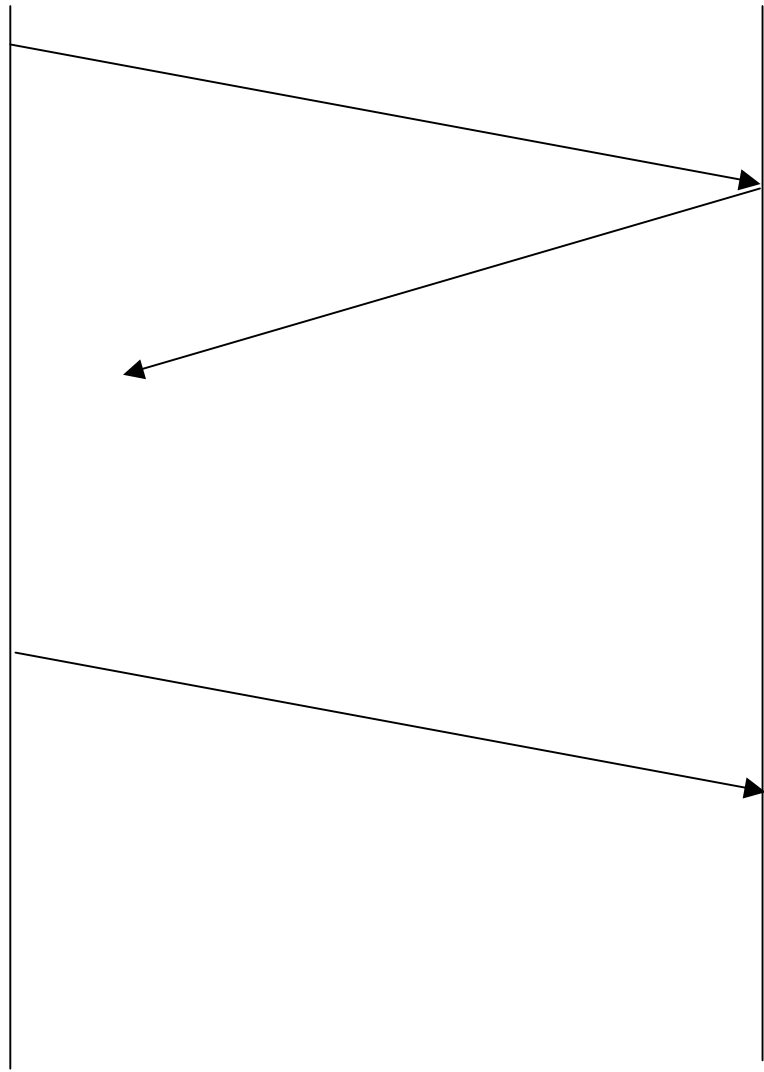


Fig 6 from the paper, showing outage duration.

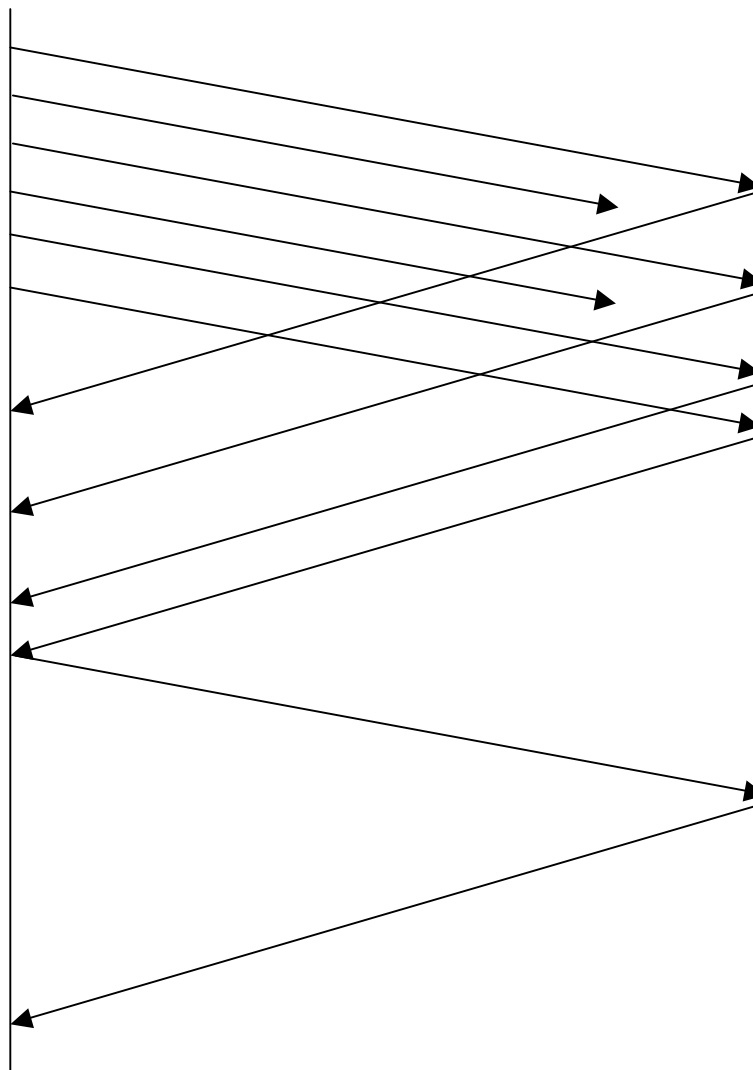
**Are retransmission  
redundant?**



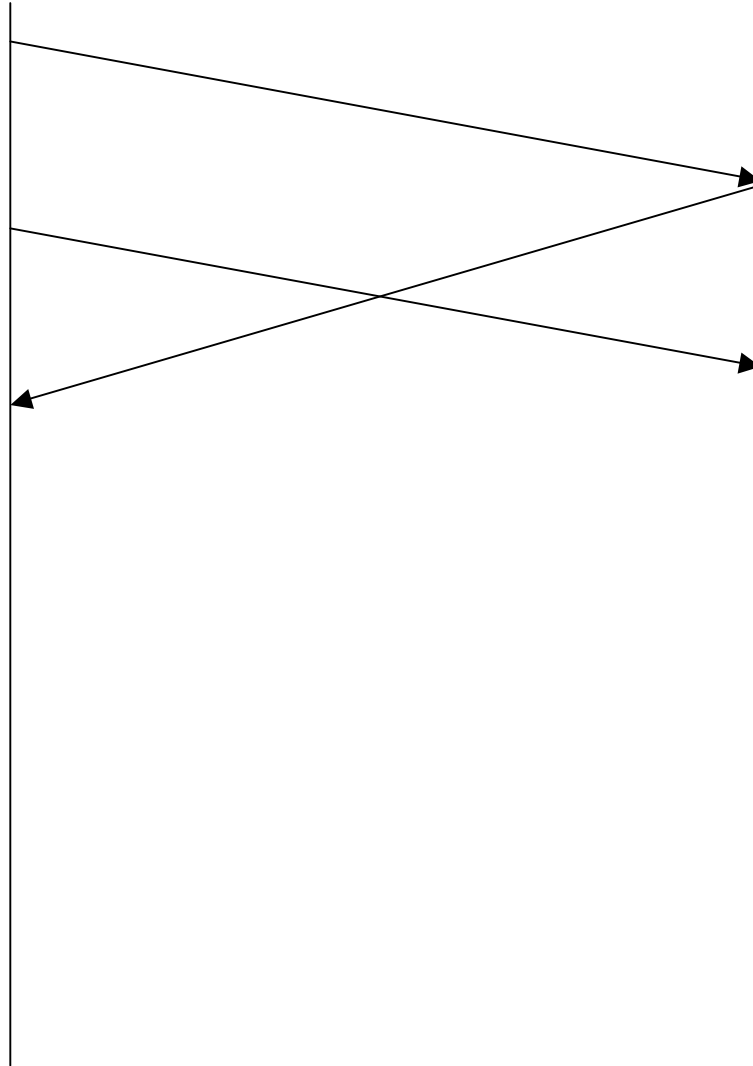
# Unavoidable



# Coarse Feedback



# Bad RTO



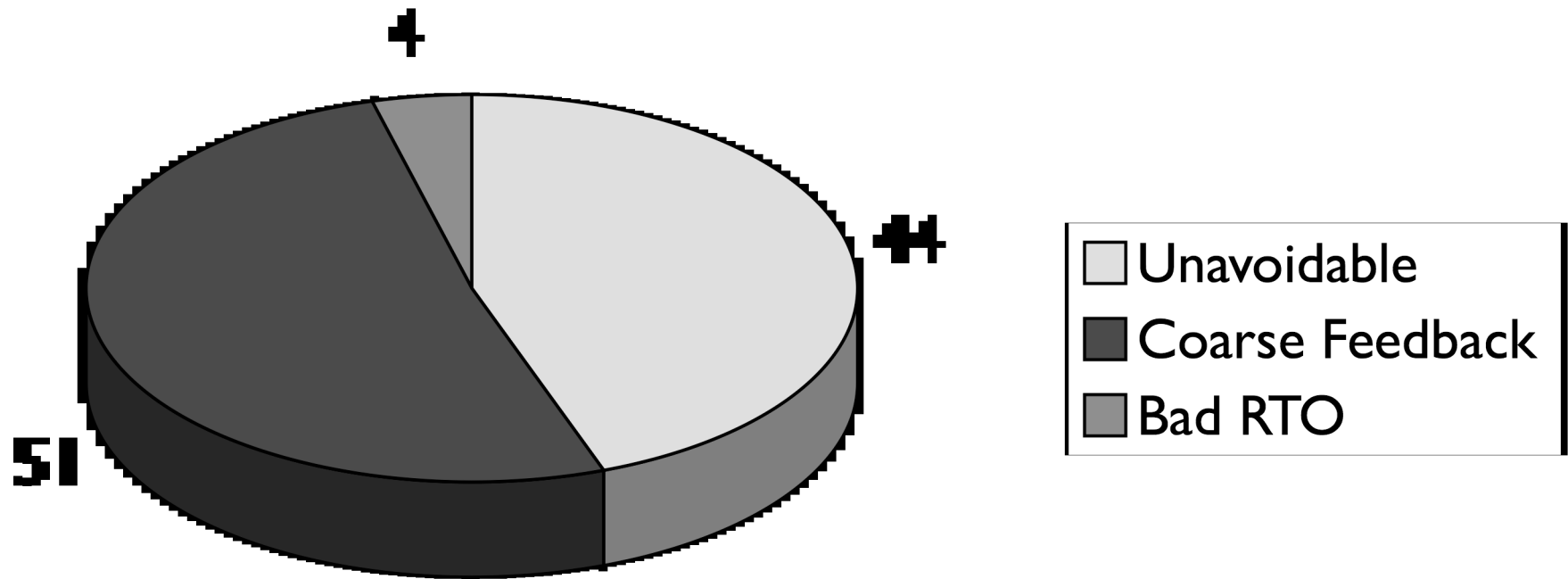
**NI**

**N2**

**26%**

**28%**

Percentage of retransmissions that  
are redundant



Type of redundant retransmission in NI.

# **Part 4:**

# Packet Delay

OTT is not well  
approximated as  
 $RTT/2$

# ACK Compression



$\Delta T_s$  Sending interval

$\Delta T_r$  Receiving interval

$$\frac{\Delta T_r}{\Delta T_s}$$

$$\xi = \frac{\Delta T_r + C_r}{\Delta T_s - C_s}$$

Compression  
event if  $\xi < .75$

**NI**

**N2**

**50%**

**60%**

Percentage of connection that experiences  
at least one compression event.

**NI**

**N2**

**50%**

**60%**

Percentage of connection that experiences  
at least one compression event.

**2**

Average number of events per connection.

# Estimating Available Bandwidth



$Q_b$ : time to transit the bottleneck

$\psi_i$ : expected time spent queuing behind predecessor (derived from sending time)

$\gamma_i$ : diff between packet OTT and min OTT

$T_i$  time packet  $i$  is sent



$$\psi_1 = 0$$

$$\psi_i = \max\{(T_{i-1} + \psi_{i-1} + Q_b - T_i), 0\}$$

$$\beta = \frac{\sum_i (\psi_i + Q_b)}{\sum_i (\gamma_i + Q_b)}$$

$\beta = 1$  means all bandwidth is available.

$\beta = 0$  means none of the bandwidth is available.

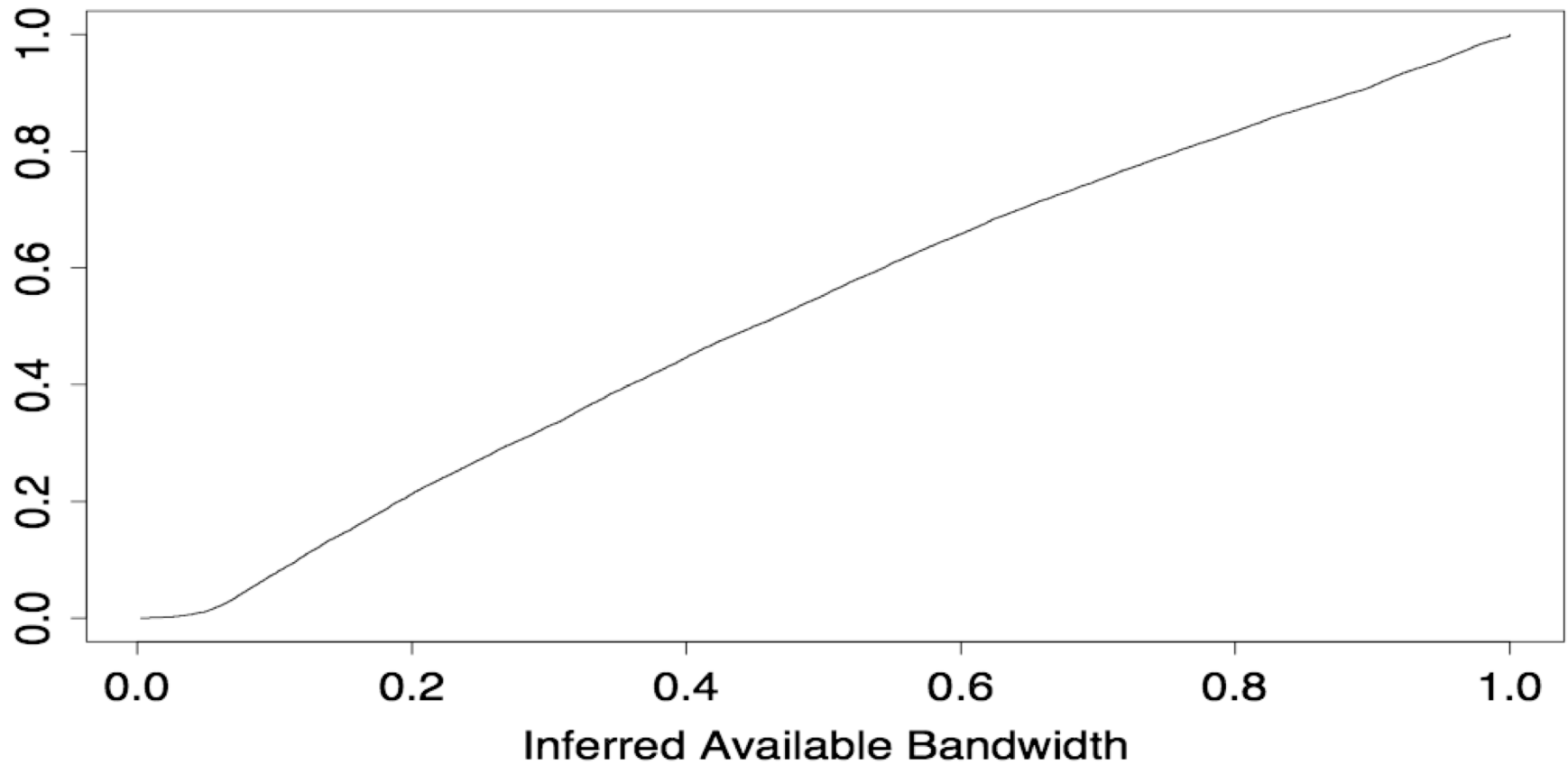


Fig 10 from the paper, showing distribution of available bandwidth.

All numbers in the paper  
is not important (the  
Internet has changed!).

**Measurement is  
difficult but useful**

Many new techniques  
needed (e.g to measure  
bottleneck bandwidth)



We can improve  
current design (e.g.  
TCP if we know more  
about reordering)

We can identify  
problem (e.g. packet  
corruption)

We can better model  
the behavior (e.g.  
bursty packet loss)

**We can infer many info  
from just a packet trace  
(e.g. available bandwidth)**