



EE 122: Networks Performance & Modeling

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<http://inst.eecs.berkeley.edu/~ee122/fa09>

(Materials with thanks to Vern Paxson, Jennifer Rexford, and colleagues at UC Berkeley)

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Outline

- Motivations
- Timing diagrams
- Metrics
- Little's Theorem
- Evaluation techniques

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Motivations

- Understanding network behavior
- Improving protocols
- Verifying correctness of implementation
- Detecting faults
- Monitor service level agreements
- Choosing providers
- Billing

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Outline

- Motivations
- > **Timing diagrams**
- Metrics
- Little's theorem
- Evaluation techniques

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Timing Diagrams

- Sending one packet
- Queueing
- Switching
 - Store and forward
 - Cut-through

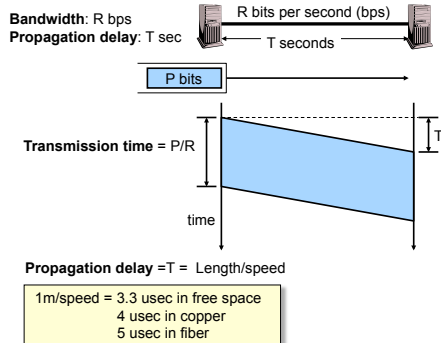
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Definitions

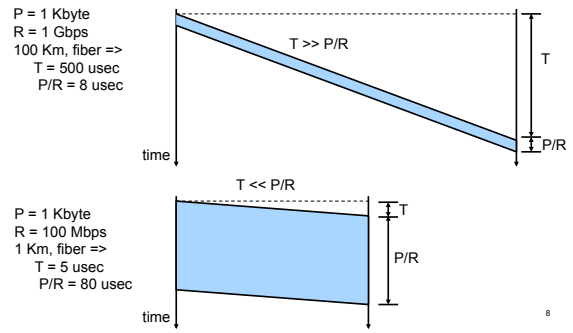
- **Link bandwidth (capacity):** maximum rate (in bps) at which the sender can send data along the link
- **Propagation delay:** time it takes the signal to travel from source to destination
- **Packet transmission time:** time it takes the sender to transmit all bits of the packet
- **Queuing delay:** time the packet need to wait before being transmitted because the queue was not empty when it arrived
- **Processing Time:** time it takes a router/switch to process the packet header, manage memory, etc

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Sending One Packet

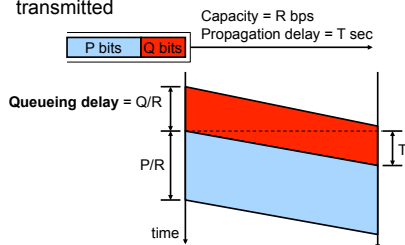


Sending one Packet: Examples

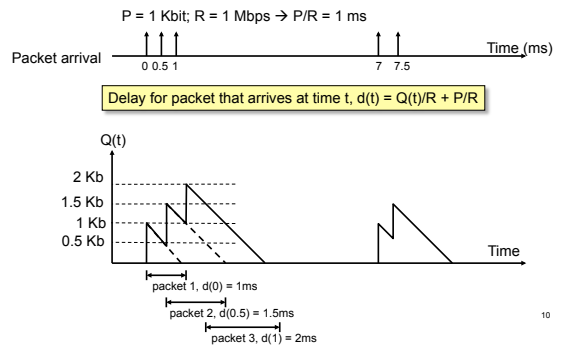


Queueing

- The queue has Q bits when packet arrives \rightarrow packet has to wait for the queue to drain before being transmitted

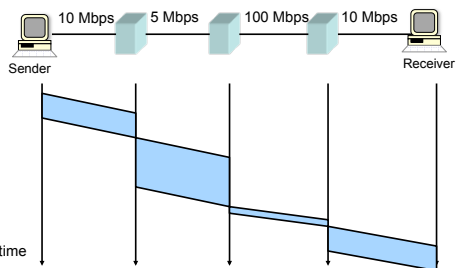


Queueing Example

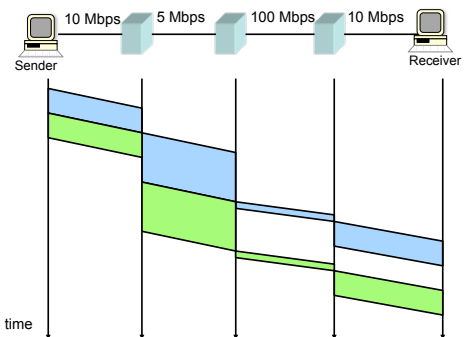


Switching: Store and Forward

- A packet is **stored** (enqueued) before being **forwarded** (sent)

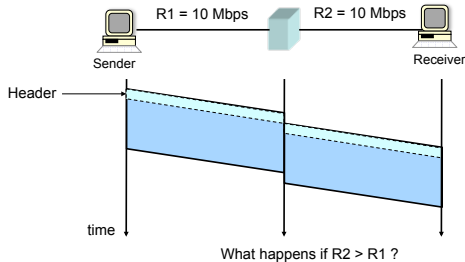


Store and Forward: Multiple Packet Example



Switching: Cut-Through

- A packet starts being forwarded (sent) as soon as its header is received



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- Metrics
 - Throughput
 - Delay
- Little's Theorem
- Evaluation techniques

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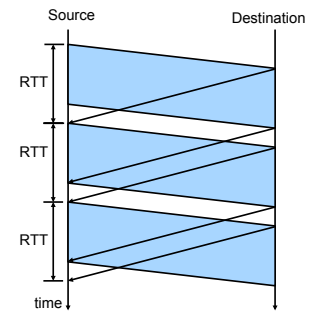
Throughput

- **Throughput** of a connection or link = total number of bits successfully transmitted during some period $[t, t + T]$ divided by T
- **Link utilization** = (throughput of the link)/(link rate)
- Bit rate units: 1Kbps = 10^3 bps, 1Mbps = 10^6 bps, 1Gbps = 10^9 bps [For memory: 1 Kbyte = 2^{10} bytes = 1024 bytes]
 - Some rates are expressed in packets per second (pps)
 - relevant for routers/switches where the bottleneck is the header processing

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Example: Windows Based Flow Control

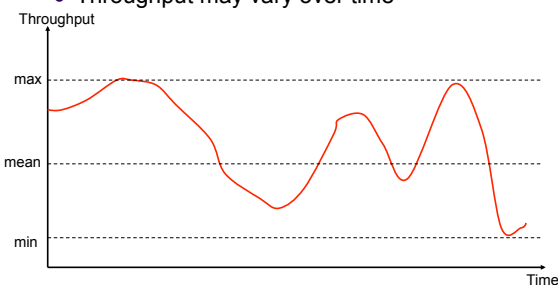
- Connection:
 - Send W bits (window size)
 - Wait for ACKs
 - Repeat
- Assume the round-trip-time is RTT seconds
- Throughput = W/RTT bps
- Numerical example:
 - $W = 64$ Kbytes
 - $RTT = 200$ ms
 - Throughput = $W/RTT = 64,000 \cdot 8 / 0.2s = 2.6$ Mbps



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Throughput: Fluctuations

- Throughput may vary over time



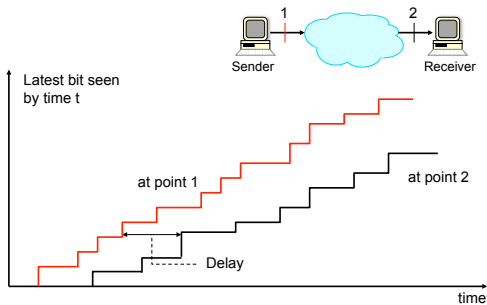
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Delay Related Metrics

- **Delay (Latency)** of bit (packet, file) from A to B
 - The time required for bit (packet, file) to go from A to B
- **Jitter**
 - Variability in delay
- **Round-Trip Time (RTT)**
 - Two-way delay from sender to receiver and back
- **Bandwidth-Delay product**
 - Product of bandwidth and delay → "storage" capacity of network

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Delay Illustration



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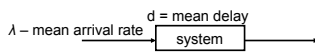
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Little's Theorem

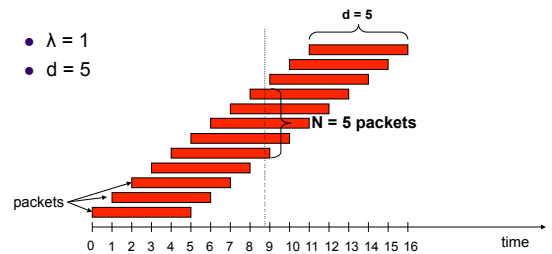
- Assume a system at which packets arrive at rate λ
- Let d be mean delay of packet, i.e., mean time a packet spends in the system
- Q: What is the mean (average) number of packets in the system (N) ?



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Example

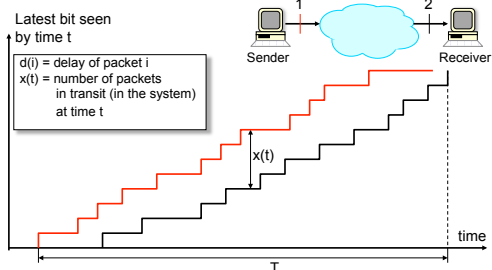
- $\lambda = 1$
- $d = 5$



- A: $N = \lambda \times d$
- E.g., $N = 1 \times 5 = 5$

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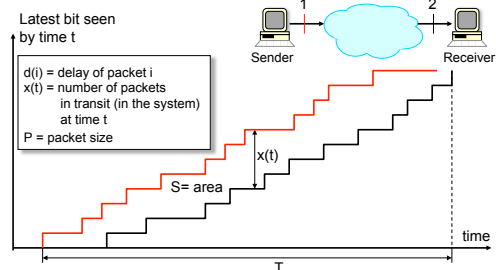
Little's Theorem: Proof Sketch



What is the system occupancy, i.e., average number of packets in transit between 1 and 2 ?

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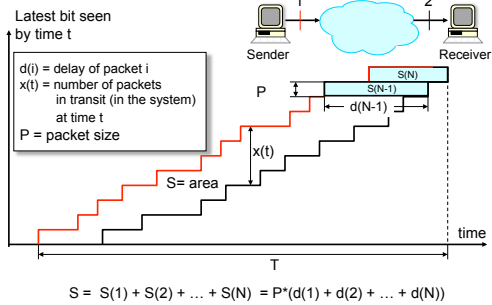
Little's Theorem: Proof Sketch



Average occupancy = S/T

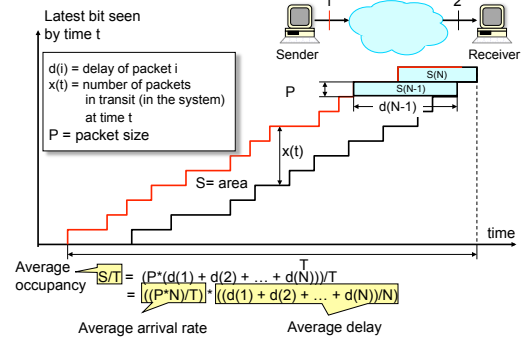
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Little's Theorem: Proof Sketch



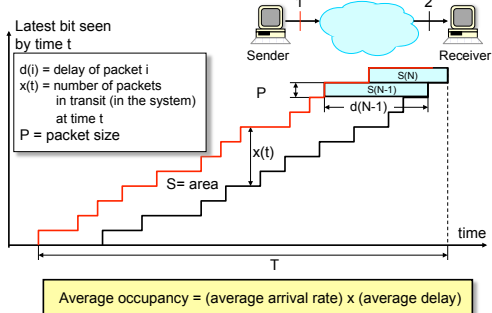
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Little's Theorem: Proof Sketch



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Little's Theorem: Proof Sketch



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Evaluation Techniques

- Measurements
 - gather data from a real network
 - e.g., ping www.berkeley.edu
 - realistic, specific
- Simulations: run a program that pretends to be a real network
 - e.g., NS network simulator, Nachos OS simulator
- Models, analysis
 - write some equations from which we can derive conclusions
 - general, may not be realistic
- Usually use combination of methods

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Simulation

- Model of traffic
- Model of routers, links
- Simulation:
 - Time driven:
 - $X(t)$ = state at time t
 - $X(t+1) = f(X(t), \text{event at time } t)$
 - Event driven:
 - $E(n)$ = n -th event
 - $Y(n)$ = state after event n
 - $T(n)$ = time when event n occurs
 - $[Y(n+1), T(n+1)] = g(Y(n), T(n), E(n))$
- Output analysis: estimates, confidence intervals

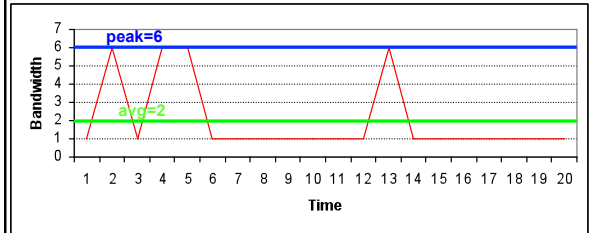
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Simulation Example

- Use trivial time-driven simulation to illustrate **statistical multiplexing**
- Probabilistically generate the bandwidth of a flow, e.g.,
 - With probability 0.2, bandwidth is 6
 - With probability 0.8, bandwidth is 1
- Average bandwidth, $\text{avg} = 0.2 \cdot 6 + 0.8 \cdot 1 = 2$
- $\text{peak} / \text{avg} = 6 / 2 = 3$

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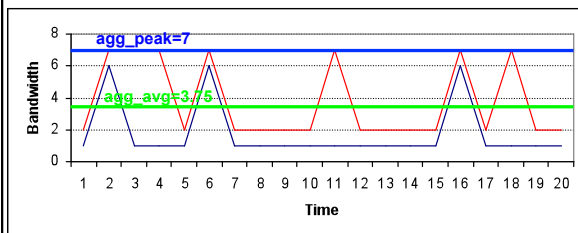
One Flow



$\text{peak} / \text{avg} = 3$

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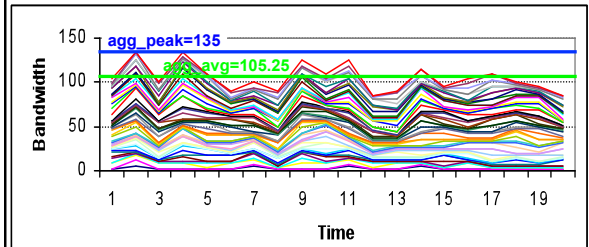
Two Flows



$\text{agg_peak} / \text{agg_avg} = 7 / 3.75 = 1.86$
 (agg_avg = average of aggregate bandwidth)
 (agg_peak = maximum value of aggregate bandwidth)

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50 Flows



$\text{agg_peak} / \text{agg_avg} = 7 / 3.75 = 135 / 105.25 = 1.28$

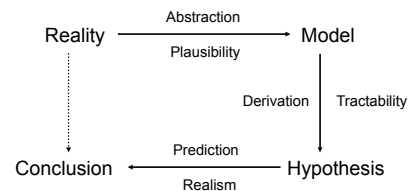
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Statistical Multiplexing

- As number of flows increases, $\text{agg_peak} / \text{agg_avg}$ decreases
 - For 1000 flows, $\text{peak} / \text{avg} = 2125 / 2009 = 1.057$
- **Q:** What does this mean?
- **A:** Multiplexing a large enough number of flows “eliminates” burstiness
 - Use average bandwidth to provision capacity, instead of peak bandwidth
 - E.g., For 1000 flows
 - Average of aggregate bandwidth = 2,000
 - Sum of bandwidth peaks = 6,000

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Evaluation: Putting Everything Together



- Usually favor plausibility, tractability over realism
 - Better to have a few realistic conclusions than none (could not derive) or many conclusions that no one believes (not plausible)

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Next Lecture

- Architecture, Layering, and the “End-to-End Principle”
- Read 1.4 & 1.5 of Kurose/Ross
- Pick up class computer account forms, if you haven't done it already

- Project 1 (tiny world or warcrafts) out today
 - First part (client) due Oct 7 @ 11:59:59pm
 - Second part (server) due Oct 26 @ 11:59:59pm

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