# Network QoS 371-2-0213

Lecture 10

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### Outline

- Introduction to Adversarial Queueing Theory
  - Classical Queueing Theory
  - Adversarial Queueing Theory
- Preliminary Observations
  - Stability vs. Delay
  - Traffic Characterization
  - Some Thoughts on Protocol Stability
- Protocols
  - FTG
  - FIFO
  - Epilogue (for now...)

# Classical Queueing Theory

- Single M/M/1 queue
  - ullet arrival: Exponential with parameter  $\lambda$
  - ullet service: Exponential with parameter  $\mu$
- Concerns
  - utilization
    - fraction of time server is busy  $\rho=\frac{\lambda}{\mu}$
  - stability
    - ullet mean number of customers in system  $ar{N}=rac{
      ho}{1ho}$
    - $\lim_{n\to 1} \bar{N} = \infty$
    - tail probability  $Pr[N > k] = \rho^{k+1}$
  - delay/response time
    - Little's Law: mean delay  $\bar{T} = \lambda^{-1} \bar{N}$
- Lessons learnt
  - overload  $\rho \geq 1$  is not manageable
  - stability implies  $\rho < 1$
  - stability related to delay

# Queuing Networks

- Network of queues
  - open
    - customers arrive from outside
    - potentially to any queue in the network
    - potentially infinite customers population
    - concerns: stability, delay
  - closed
    - customers circulate in the network
    - finitely many customers
    - concerns: delay
  - multi-class
    - probabilistic transitions from queue to queue
    - different customers may follow different paths

# System and Traffic Model

- Slotted time
- Directed graph G = (V, E)
  - each link  $e \in E$  has rate 1
    - ullet stochastic terms: " $\mu=1$ "
  - ullet single queue  $Q_e$  at link tail
  - apriori, unlimited buffer space
  - ullet employs scheduling policy  ${\cal P}$
  - d: max path-length in G
  - m: number of edges
- Unit size packets
  - $p = (\pi_p, a_p)$ 
    - $\pi_p$ : simple path in G (source routing)
      - $a_p$ : arrival time of p at path source end
  - take a single time slot to traverse a link
- Adversary
  - Injects packets into the various nodes in the network
    - stochastic terms: similar to multi-class open queuing networks

# Adversaries and Stability

- Notation:
  - N(e, I): # packets injected during interval I with  $e \in path$
  - $Q_e(t)$ : queue size at tail of e at time t
- Stability
  - $\sup_t \sum_{e \in E} Q_e(t) < \infty$
- For M/M/1, stability implies  $\rho < 1$
- What about adversarial traffic?
  - average injection rate of packets traversing e > 1
    - system unstable
  - what about injection rate = 1? < 1?
- (r, b)-adversary
  - for any time interval I and edge  $e \in E$

$$N(e, I) \leq r|I| + b$$

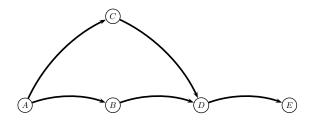
• note: injections made throughout the network!

# Elements of the Game

- Topology, traffic (adversary), protocol
- Recall concerns: delay and stability
- Questions we'd like to address
  - how each element affects these concerns
  - relation between stability and delay
    - "equivalent" to Little's Law?
  - identify stable triplets (topology,traffic,protocol)
  - are there protocols that are always stable
    - for any topology and traffic
    - universally stable
  - are there topologies that are always stable
    - for any work-conserving protocol and traffic
    - universally stable
  - are there protocols that are never stable
    - for any traffic (and appropriate topology)
    - for any topology (and appropriate traffic)

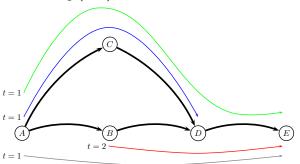
### **Protocols**

Work-conserving (WC)



### **Protocols**

Work-conserving (WC)



FIFO	Nearest-to-Go (NTG)	Farthest-to-Go (FTG)	Shortest-in-System (SIS)
LIFO	Farthest-from-Source (FFS)	Nearest-to-Source (NTS)	Longest-in-System (LIS)

# Stability and Underload vs. Bounded Delay (r < 1)

#### Theorem

For any  $(1 - \varepsilon, b)$ -adversary and any WC protocol, the system is stable iff it has bounded delay.

#### Proof.

- Stability: no queue ever holds more than k packets
  - in particular,  $b \leq mk$
- Consider  $Q_e(t) \neq \emptyset$  and show it empties during  $I = [t, t + \frac{2mk}{\varepsilon}]$ 
  - by contradiction (and WC),  $\frac{2mk}{\varepsilon} + 1$  packets traverse e during I
  - however,
    - at t there are  $\leq mk$  packets in the system
    - arrivals during I at most  $|I|(1-\varepsilon)+b=(\frac{2mk}{\varepsilon}+1)-(2mk+\varepsilon)+b<(\frac{2mk}{\varepsilon}+1)-mk+(b-mk)\leq (\frac{2mk}{\varepsilon}+1)-mk$
    - ullet strictly less than  $rac{2mk}{arepsilon}+1$  could have traversed e during I
- ullet Every packet is absorbed in  $\frac{2mk}{arepsilon} \cdot d$  time

# Stability and Underload vs. Bounded Delay (r < 1)

#### Theorem

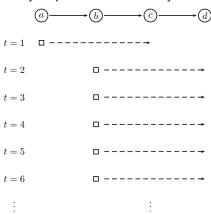
For any  $(1 - \varepsilon, b)$ -adversary and any WC protocol, the system is stable iff it has bounded delay.

#### Proof.

- Assume every packet is absorbed in T time
- If  $|Q_e(t)| > T$ , the last packet would have delay > T
- Hence, network load < mT

### What If r = 1?

- WC + Bounded delay implies stability?
  - proof unaffected
- WC + Stability implies bounded delay?



### Traffic Characterization

#### **Theorem**

Given G = (V, E), if traffic  $\sigma$  can be made stable by protocol  $\mathcal{P}$  then  $\sigma$  is generated by an  $(r \leq 1, b \geq 0)$ -adversary

#### Proof.

- Stability:  $\exists B \text{ s.t. network load under } \mathcal{P} \text{ is always} \leq B$
- Show that for every  $e \in E$  and interval I

$$N(e, I) \leq |I| + B$$

- By contradiction, N(e, I) > |I| + B
  - during I at most |I| packets traverse e
  - by end of I we have > B packets pending for e. Contradiction.
- By definition,  $\sigma$  is generated by a (1, B)-adversary.

# $\mathcal{P}$ Is Stable iff All WC Protocols Are?

- Why should it matter which packets we forward?
  - any WC protocol forwards the same amount on any link
  - stability is determined by quantity, not "quality"

It matters!!

- Why?
  - local scheduling decisions affect load downstream
- Is there a good way to tell if a protocol is stable?
- Is it intuitive?

Protocol	Universally Stable?
FIFO	
LIFO	
Nearest-to-Go (NTG)	
Farthest-from-Source (FFS)	
Farthest-to-Go $(FTG)$	
Nearest-to-Source (NTS)	
Shortest-in-System (SIS)	
Longest-in-System (LIS)	

# Farthest-To-Go (FTG)

### Theorem (FTG stability)

For any G = (V, E) and any  $(r \le 1, b)$ -adversary, FTG is stable

- Notation
  - Recall:  $d = \max \text{ path-length in } G, m = |E|$
  - $X_e^i(t)$ : number of packets in  $Q_e(t)$  with target-distance  $\geq i$
  - sequence  $k_i$ :

$$k_i = \begin{cases} 0 & i > d \\ m \cdot k_{i+1} + b & 0 \le i \le d \end{cases}$$

- non-increasing:  $k_i \ge k_{i+1}$
- $k_d = b$ ,  $k_{d-1} = (m+1)b$ ,  $k_{d-2} = (m(m+1)+1)b$ ....
- Plan
  - Show  $X_e^i(t) \leq k_i$
  - network load  $\leq \sum_{e} X_{e}^{1}(t) \leq m \cdot k_{1} = O(m^{d}b)$

# Farthest-To-Go is Universally Stable

#### Lemma

For any  $e \in E$ , time t and  $0 \le i \le d$ ,  $X_e^i(t) \le k_i$ 

### Proof (by reverse induction on i).

- Assume for simplicity system is empty at time 0
- i > d: trivial (no such packets in  $Q_e(t)$ )
- Assume true for j > i and consider i (and some  $e \in E$  and t)
- $t' = \arg\max\{t'' \le t \mid X_e^i(t'') = 0\}$ 
  - $X_e^i$  is "reset" at t'
  - exists since system is empty at time 0
- Consider packets "in"  $X_e^i(t)$ 
  - ullet some injected after t'
    - at most (t t') + b injected during [t' + 1, t]

# Farthest-To-Go is Universally Stable

#### Lemma

For any  $e \in E$ , time t and  $0 \le i \le d$ ,  $X_e^i(t) \le k_i$ 

### Proof (by reverse induction on i).

- $\bullet$  some in system at t'
  - none in  $Q_e(t')$
  - all at target-distance  $\geq i + 1$
  - at most  $m \cdot k_{i+1}$  (by I.H.)
- e delivers target-distance  $\geq i$  packets throughout [t'+1,t]
  - $X_e^i > 0$  throughout by choice of t' + WC + FTG criteria
- Hence

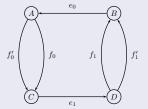
$$\begin{array}{ll} X_e^i(t) & = & X_e^i(t') + \text{type } 1 + \text{type } 2 - \text{departures} \\ & \leq & 0 + \overbrace{(t-t') + b} + \overbrace{m \cdot k_{i+1}} - \overbrace{(t-t')} \\ & = & m \cdot k_{i+1} + b = k_i \end{array}$$

#### Theorem

FIFO is unstable against (r, b)-adversaries, for r > 0.85

#### Proof.

• Consider the "baseball" graph



- Assume s packets with path e0 in B at t
  - all other queues empty
- Adversary forces s' > s packets with path  $e_1$  in C at t' > t
  - all other queues empty

#### Theorem

FIFO is unstable against (r, b)-adversaries, for r > 0.85

#### Proof.

- Phase 1 (s time):
  - rs packets with path  $e_0 f_0' e_1$  (set W)
  - end of phase 1: W in B
    - recall we start with s packets with path  $e_0$  in B

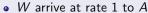


#### Theorem

FIFO is unstable against (r, b)-adversaries, for r > 0.85

#### Proof.

- Phase 2 (rs time):
  - $r^2s$  packets with path  $e_0f_0e_1$  (set X)
  - $r^2s$  packets with path  $f'_0$  (set Y)
  - end of phase 2: X in B
    - since W are forwarded before



• serviced at rate 
$$\frac{1}{r+1}$$
 by  $f_0'$ 

• 
$$rs - rs \frac{1}{r+1} = \frac{r^2s}{r+1}$$
 packets of W remain in A

Y arrive at rate r to A

• serviced at rate 
$$\frac{r}{r+1}$$
 by  $f_0'$ 

$$r^2s$$
 waiting at  $f_0'$  tail

• 
$$r^2s - r^2s\frac{r}{r+1} = \frac{r^3s}{r+1}$$
 packets of Y remain in A



#### **Theorem**

FIFO is unstable against (r, b)-adversaries, for r > 0.85

### Proof.

- Phase 3 ( $r^2s$  time):
  - $r^3s$  packets with path  $e_1$  (set Z)
  - remaining W arrive at rate  $\frac{1}{r+1}$  to C
    - slowed down by remaining Y on  $f'_0$
    - all  $\frac{r^2s}{r+1}$  remaining packets arrive
  - X arrive at rate 1 to C
    - flow freely through  $f_0$
    - all  $r^2s$  packets arrive
  - Total arrivals to C(W,X,Z):  $\frac{r^2s}{r+1} + r^2s + r^3s$
  - packets served on  $e_1$ :  $r^2s$  (FIFO is WC)

#### Theorem

FIFO is unstable against (r, b)-adversaries, for r > 0.85

#### Proof.

• Pending packets for e<sub>1</sub> after phase 3

$$\phi(r,s) = \frac{r^2s}{r+1} + r^3s$$

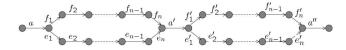
Requirement:

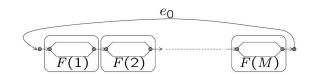
$$\phi(r,s) > s$$

- $\phi(1,s) = \frac{3}{2}s$
- $\phi(0,s) = \bar{0}$
- Satisfied for r > 0.85
- Initialization: burst b

# FIFO Instability (only for large enough r?)

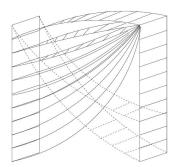
Rate	Reference	
> 0.85	Andrews et al. (2001)	
> 0.8357	Díaz et al. (2001)	
> 0.749	Koukopoulos et al. (2002)	
> 0.5	Lotker et al. (2002)	
any $\varepsilon>0$	Bhattacharjee et al. (2003)	





# FIFO Instability (only for large enough r?)

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any $\varepsilon > 0$	$\operatorname{iny}  \varepsilon > 0 \qquad \operatorname{Bhattacharjee}  \operatorname{et}  \operatorname{al.}  \left( 2003 \right)$	



# Universal Stability of WC Protocols

Protocol	Universally Stable?
FIFO	No
LIFO	
Nearest-to-Go (NTG)	
Farthest-from-Source (FFS)	
Farthest-to-Go (FTG)	Yes
Nearest-to-Source (NTS)	
Shortest-in-System (SIS)	
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# Towards Universally Stable Topologies

(or, Is FIFO Never Stable?)

- Next week
  - Alternative adversarial models
  - Easy traffic
    - are there rates for which any WC protocol is stable?
    - depends on topology?
  - Universally stable topologies
    - are there topologies for which any WC protocol is stable?
    - at any rate  $\leq 1$ ?

#### References

- Borodin, Kleinberg, Raghavan, Sudan and Williamson. Adversarial Queueing Theory, Journal of the ACM 48(1):13–38 (2001)
- Andrews, Awerbuch, Fernández, Leighton, Liu, Kleinberg.
   Universal-Stability Results and Performance Bounds for Greedy
   Contention-Resolution Protocols, Journal of the ACM 48(1):39–69 (2001)
- Cholvi and Echagüe. Stability of FIFO networks under adversarial models:
   State of the art, Computer Networks 51(15):4460-4474 (2007)