#### EP2210 Scheduling

- Lecture material:
	- Bertsekas, Gallager, 6.1.2.
	- MIT OpenCourseWare, 6.829
	- A. Parekh, R. Gallager, "A generalized Processor Sharing Approach to Flow Control - The Single Node Case," IEEE Infocom 1992

#### Scheduling



#### Scheduling - Problem definition

- Scheduling happens at the routers (switches) or at user nodes if there are many simultaneous connections
	- many flows transmitted simultaneously at an output link
	- packets waiting for transmission are buffered
- Question: which packet to send, and when?
- Simplest case: FIFO
	- packets of all flows stored in the same buffer in arrival order
	- first packet in the buffer transmitted when the previous transmission is complete
	- packet transmission in the order of packet arrival
	- packet arriving when buffer is full dropped
- Complex cases: separate queues for flows (or set of flows)
	- one of the first packets in the queues transmitted
	- according to some policy
	- needs separate queues and policy specific variable for each flow
		- **PER FLOW STATE**

#### Scheduling - Requirements

- Easy implementation
	- has to operate on a per packet basis at high speed routers
- Fair bandwidth allocation
	- for elastic (or best effort) traffic
	- all competing flows receive the some "fair" amount of resources
- Provide performance guarantees for flows or aggregates
	- service provisioning in the Internet (guaranteed service per flow)
	- guaranteed bandwidth for SLA, MPLS, VPN (guaranteed service for aggregates)
	- integrated services in mobile networks (UMTS, 4G)
- Performance metrics
	- throughput, delay, delay variation (jutter), packet loss probability
	- performance guarantees should be de-coupled (coupled e.g., high throughput -> low delay variation)

#### Scheduling – Implementation issues

- Scheduling discipline has to make a decision before each packet transmission – every few microseconds
- Decision complexity should increase slower than linearly with the number of flows scheduled
	- e.g., complexity of FIFO is 1
	- scheduling where all flows have to be compared scales linearly
- Information to be stored and managed should scale with the number of flows
	- e.g., with per flow state requirement it scales linearly (e.g., queue length or packet arrival time)
- Scheduling disciplines make different trade-off among the requirements on fairness, performance provisioning and complexity
	- e.g., FIFO has low complexity, but can not provide fair bandwidth share for flows

# Scheduling classes

- Work-conserving
	- server (output link) is never idle when there is packet waiting



- utilizes output bandwidth efficiently
- burstiness of flows may increase  $\rightarrow$  loss probability at the network nodes on the transmission path increases
- latency variations at each switch  $\rightarrow$  may disturb delay sensitive traffic

# Scheduling classes

- Nonwork-conserving
	- add rate control for each flow
	- each packet assigned an eligibility time when it can be transmitted
		- e.g, based on minimum *d* gap between packets
	- server can be idle if no packet is eligible



- burstiness and delay variations are controlled
- some bandwidth is lost
- can be useful for transmission with service guarantees

# Scheduling for fairness

- The goal is to share the bandwidth among the flows in a "fair" way
	- fairness can be defined a number of ways (see lectures later)
	- here fairness is considered for one single link, not for the whole transmission path

#### • Max-min fairness

- *Maximize* the *minimum* bandwidth provided to any flow not receiving all bandwidth it requests
- E.g.: no maximum requirement, single node the flows should receive the same bandwidth
- Specific cases: weighted flows and maximum requirements

## Max-min fairness

• *Maximize* the *minimum* bandwidth provided to any flow not receiving all bandwidth it requests

C: link capacity

B(t): set of flows with data to transmit at time t (backlogged (saturated) flows) n(t): number of backlogged flows at time t  $C_i(t)$ : bandwidth received by flow i at time t

**Case: without weights or max. requirements**

$$
C_i(t) = \frac{C}{n(t)}
$$

#### **Case: weights**

w<sub>i</sub>: relative weight of flow i

$$
C_i(t) = \frac{w_i}{\sum_{j \in B(t)} w_j} C
$$

#### **Case: max. requirements**

r<sub>i</sub>: max. bandwidth requirement for flow i  $\alpha(t)$ : fair share at time t

 $\alpha(t)$ :  $\sum \min(r_j, \alpha(t)) = C$  $C_i(t) = \min(r_i, \alpha(t))$  $j \in B(t)$ 

## Max-min fairness

C: link capacity B(t): set of backlogged flows at time t  $C_i(t)$ : bandwidth received by flow i at time t **Case: weights** w<sub>i</sub>: relative weight of flow I

$$
C_i(t) = \frac{w_i}{\sum_{j \in B(t)} w_j} C
$$

#### **Case: max. requirements**

 $r_i$ : max. bandwidth requirement for flow I  $\alpha(t)$ : fair share at time t

$$
C_i(t) = \min(r_i \alpha(t))
$$
  
 
$$
\alpha(t): \sum_{j \in B(t)} \min(r_j, \alpha(t)) = C
$$

- Calculate fair shares:
	- 3 backlogged (saturated) flows, equal weights, link capacity 10.
	- 3 backlogged flows, weights 1,2,2 link capacity 10
	- 4 backlogged flows, max requirements: 2, 3, 4, 5, link capacity 11.
	- 3 backlogged flows, rate requirements: 2,4,5, the link capacity is 11. What are the fair shares now?

#### Fair queuing-for max-min fairness

- Fluid approximation
	- fluid fair queuing (FFQ) or generalized processor sharing (GPS)
	- idealized policy to split bandwidth
	- assumption: dedicated buffer per flow
	- assumption: flows from backlogged queues served simultaneously (like fluid)
	- not implementable, used to evaluate real approaches
	- used for performance analysis if per packet performance is not interesting



# Packet-level Fair queuing

- How to realize GPS/FFQ?
- Bit-by-bit fair queuing
	- one bit from each backlogged queue in rounds (round robin) still not possible to implement



- Packet-level fair queuing
	- one packet from each backlogged queue in rounds ???



Flows with large packets get more bandwidth! More sophisticated schemes required!

# Packetized GPS (PGPS)

- How to realize GPS/FFQ?
- Try to mimic GPS
- Transmit packets that would arrive earliest with GPS
	- Finishing time (F(p))
- Quantify the difference between GPS and PGPS



#### Fair queuing – group work

- Packet-by-packet GPS (PGPS)
- Compare GPS (fluid) and PGPS (packetized) in the following scenarios – draw diagrams "backlogged traffic per flow vs. time".
- Consider one packet in each queue.  $C=1$  unit/sec
- 1. Two flows, equal size packets, same weight, L1=L2=1 unit
- 2. Two flows, different size packets, same weight  $L1=1$ ,  $L2=2$  units
- 3. Two flows, same packet size, different weight, L1=L2=1 unit,  $w1=1$ ,  $w2=2$

$$
C_i(t) = \frac{W_i}{\sum_{j \in B(t)} W_j} C
$$

### Fair queuing – group work

- Compare GPS (fluid) and PGPS (packetized) in the following scenarios draw diagrams "backlogged traffic per flow vs. time".
- Consider one packet in each queue. C=1 unit/sec
- 1. Two flows, equal size packets, same weight,  $L1=L2=1$  unit
- 2. Two flows, different size packets, same weight  $L1=1$ ,  $L2=2$  units
- 3. Two flows, same packet size, different weight, L1=L2=1 unit,  $w1=1$ ,  $w2=2$



## Scheduling summary

- Scheduling:
	- At the network nodes and at the edge
	- To provide quality guarantees or fairness
	- Work-conserving and non-work-conserving
- Max-min fairness in a single link, with weights and max. rate requirement
- GPS for max-min fairness in a fluid model
- PGPS (or WFQ) in the packetized version
	- Schedule according to finish time in GPS
	- Guaranteed performance compared to GPS
- Next lecture: PGPS in detail, work-conserving and non-work-conserving scheduling

## Reading assignment

- A. Parekh, R. Gallager, "A Generalized Processor Sharing Approach to Flow Control - The Single Node Case," IEEE Transaction on Networking, 1993, Vol.1, No.3.
	- Read from I to III-before part A
- H. Zhang, "Service Disciplines for Guaranteed Performance Service in Packet-Switching Networks," Proceedings of the IEEE, Oct, 1995, pp. 1374-1396
	- Read sections I, II, and III.

## Lecture plan

- GPS versus PGPS student presentation
- GPS under random arrivals, the M/M/1-PS queue
- Effect of scheduling over multiple hops the Zhang Paper

### Scheduling - GPS, PGPS

- Consider two flows sharing a link. Packet arrivals and sizes are shown on the figure. Draw a figure explaining how the packets are served with GPS and give the finishing time of each packet. (arrivals:  $t=0,6$  and  $t=1,3,5,7$ )
- How are the same packets transmitted under PGPS (packet based GPS)?



- The performance of GPS (single link or single resource) under stochastic request arrival.
- Recall: for FIFO service, Poisson arrivals, Exp service time
	- FIFO, single server M/M/1
	- FIFO, multiple servers M/M/m
	- FIFO, infinite servers M/M/inf
- Question: how can we model the GPS service?
	- Assume Poisson arrivals
	- Assume Exponential service time

- The performance of GPS (single link or single resource) under stochastic request arrival. Fluid model.
- Single server (single link, transmission medium or resource)
- The capacity of the server equally shared by the requests
	- if there are n requests, each receives service at a rate 1/n
	- customers do not have to wait at all, service starts as the customer arrives (there is no queue…)
- $M/M/1$ -PS
	- $-$  Poisson customer arrival process  $(\lambda)$
	- Service demand (job size) is exponential in the sense, that if the customer got all the service capacity, then the service time would be  $Exp(\mu)$  (models e.g., exponential file size)
	- Note: if the number of requests is higher, a request stays in the server for a longer time.

- $M/M/1$ -PS
- Poisson customer arrival process  $(\lambda)$
- service demand (job size) is exponential in the sense, that if the customer got all the service capacity, then the service time would be  $Exp(\mu)$
- Draw the Markov chain
- Compare it to the M/M/1-FIFO queue.
- Consequently,  $p$ ,  $E[N]$ , and  $E[T]$  is the same as  $M/M/1$ -FIFO

$$
p(n) = (1 - \lambda/\mu)(\lambda/\mu)^n, \quad E[N] = \frac{\lambda/\mu}{1 - \lambda/\mu}, \quad E[T] = \frac{E[N]}{\lambda} = \frac{1/\mu}{1 - \lambda/\mu}
$$

Moreover, the average results are the same for  $M/G/1$ -PS – average measures are insensitive to the service time distribution

- M/M/1-PS example
- WLAN access point (10Mbit/s) is shared for large file transfer. File transfers are initiated randomly by a large population, the file sizes are considered to be exponential. The average file size is 1MByte.
- We assume that the medium access control does not waste capacity
- How much time does it take in average to download a file, if noone else is downloading?

Assume, file downloads are initiated with a rate of 0.5 per second

- Give the MC of the system
- What is the probability that the network is empty?
- What is the mean number of concurrent downloads and time to download a file?
- Express the probability that the instantaneous rate is less than 1Mbit/s?...

## Back to scheduling algorithms

- Introduction to the Hui Zhang paper
- Scheduling for guaranteed services all flows have some limited requirements (average rate, traffic envelope …)
- Work-conserving: WFQ, WFFQ
- Non-work-conserving: Jitter EDD, Stop-and-Go

## Work conserving: WFQ and WFFQ

- Weighted Fair Queuing (same as PGPS)
	- Orders packets according to finishing times in FFQ (fluid fair…)
	- Can schedule packets too much ahead of FFQ
- WFFQ Worst-case fair weighted fair …
	- Considers only the packets that have started service under FFQ
	- Leads to less bursty traffic



Guaranteed rate: Connection 1: 0.5 Connections 2-11: 0.05

## Work conserving: troubles

- Increasing burstiness
- Traffic characterization and stability region
	- Set of equations
- E.g., feedback network
	- Set of equations may be unsolvable…
	- The network can become unstable



## Non-work-conserving: jitter-EDD, Stop-and-Go

- Jitter-Earliest-Due-Date
	- Keep jitter limited
	- While utilize free link under some constraints



Fig. 10. Packet service in jitter-EDD.



Fig. 11. Synchronization between input and output links in stop-and-go.

- Stop-and-Go
	- Window based control
	- Received in one window is transmitted in one window (with some delay…)

#### Performance comparison





Table 4 End-to-End Delay, Delay Jitter, and Buffer Space Requirement for Nonwork-Conserving Disciplines

	traffic constraint	end-to-end delay bound	end-to-end delay-jitter bound	buffer space at $hth$ switch
Stop-and-Go	$(r_j,T_j)$	$nT_j + \sum_{i=1}^n \theta_i$		$r_j(2T_j+\theta_i)$
HRR	$(r_j,T_j)$	$2nT_i$	2nT	$2r_jT_j$
Rate-Controlled Servers with $b^*(\cdot)$	$b_j(\cdot)$	$D(b_j, b^*) + \sum_{i=1}^n d_{i,j}$	$D(b_i, b^*) + \sum_{i=1}^n d_{i,j}$	$\sigma_i + b^*(d_{1,i})$ for 1st switch
RJ regulators				$b^*(d_{i-1,j} + d_{i,j})$ for $j^{th}$ switch
Rate-Controlled Servers with $b^*(\cdot)$	$b_j(\cdot)$	$D(b_j, b^*) + \sum_{i=1}^n d_{i,j}$	$D(b_j, b^*) + d_{n,j}$	$\sigma_j + b^*(d_{1,j})$ for 1st switch
RJ regulator for 1st switch and DJ regulators for other switches				$b^*(d_{i-1,j} + d_{i,j})$ for $j^{th}$ switch i > 1

## Scheduling - summary

- Scheduling: local algorithms to decide which packet to transmit
- Scheduling for fairness
	- Generalized processor sharing, fluid fair queueing, M/M/1-PS
	- Packetized versions
- Scheduling for performance guarantees
	- Work-conserving examples: WFQ, WFFQ
	- Non-work-conserving examples: Jitter-EDD, S&G
	- Performance evaluation:
		- Delay bound, jitter bound, buffer space
		- Dependence on number of hops
		- Correlated performance (e.g., rate vs jitter)
- Material for test: everything discussed in class
- Material for home assignment: more reading....