

- 10. A Demers, S Keshav, S Shenker, "Analysis and Simulation of a Fair Queueing Algorithm," SIGCOMM 1989.
- 11. JCR Bennett, H Zhang, "WF<sup>2</sup>Q: Worst-case fair weighted fair queueing," IEEE Infocom, 1996.



# Weighted Fair Queueing (WFQ)

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- Deals better with variable size packets and weights
- The idea is that assume GPS is fairest discipline
- Find the *finish time* of a packet, *had we been doing GPS*
- Then serve packets in order of their **finish times**
- The scheduler tries to emulate the order in which packets are processed by GPS



## WFQ: first cut

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- Suppose, in each *round*, the server served one bit from each active connection
  - begins with emulating bit-by-bit Round-Robin
- *Round number* is the number of rounds already completed
  - can be fractional
- Each round of service takes a variable amount of time
  - The more connections served, the longer the round takes

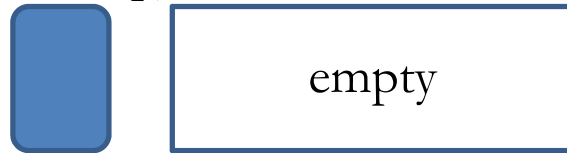


## WFQ (cont'd)

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- If a packet of length  $p$  arrives to an empty queue when the round number is  $R$ , it will complete service when the round number is  $R + p \Rightarrow$  *finish number* is  $R + p$ 
  - independent of the number of other connections!
- If a packet arrives to a non-empty queue, and the previous packet has a finish number of  $f$ , then the packet's finish number is  $f + p$
- Serve packets **in order of finish numbers**

Packet (p) Round number =  $r$



Round number =  $r$



Packet completes at round  $r+p$

Packet (p) Round number =  $r$



Packet  
completes at  
round  $f$



Round number =  $r$



Packet  
completes at  
round  $f+p$



# WFQ: computing the round number

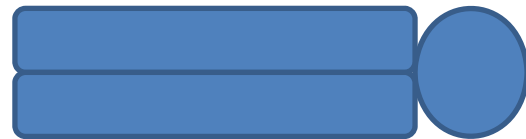
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- Naively: round number = number of rounds of service completed so far
  - what if a server has not served all connections in a round?
  - what if new conversations join in halfway through a round?
- *Redefine* round number as a real-valued variable that **increases at a rate inversely proportional to the number of currently active connections**
- With this change, **WFQ emulates GPS instead of bit-by-bit RR**

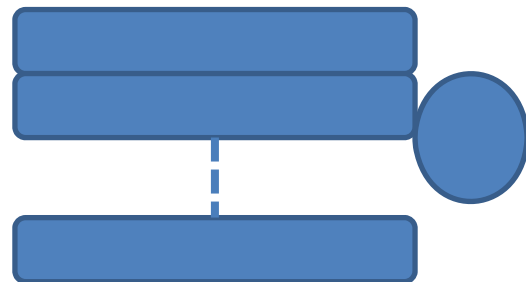
Increase in round number is proportional to rate of service for each per queue/flow



1 queue/flow,  
round number  
increases at rate of  
1 unit



2 queues/flow,s  
round number  
increases at rate of  
 $1/2$



n queues/flow,s  
round number  
increases at rate of  
 $1/n$



# WFQ implementation

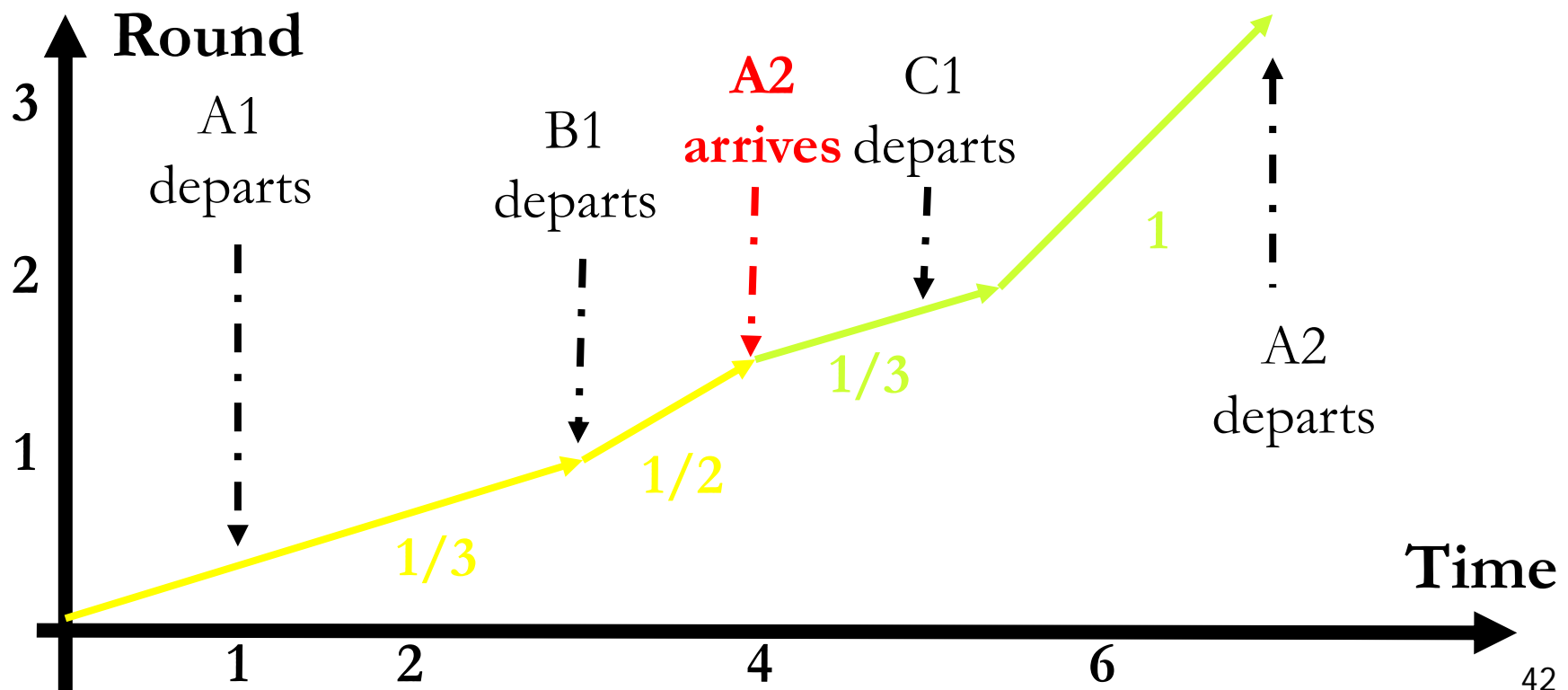
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- On packet arrival:
  - classify packet and look up finish number of last packet served (or waiting to be served)
    - $O(1)$  to  $O(N)$
  - re-compute round number
    - worst case  $O(N)$
  - compute finish number
  - insert in priority queue sorted by finish numbers
    - $O(\log N)$
  - if no space, drop the packet with largest finish number
- On service completion
  - select the packet with the lowest finish number



# Example: FQ

- Three connections: A,B,C. At  $t=0$ , packet of size 1,2 and 2 arrives. (A1,B1,C1). Finish time:  $A1 = 1$ ,  $B1 = C1 = 2$ .
- With GPS, at  $t=3$ , round 1 is completed, A1 departs, only 2 connections active
- At  $t=4$ , round is 1.5, A2 of size 2 arrives, finish time is  $(1.5+2) 3.5$





# Example: GPS

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- Three connections: A,B,C. At  $t=0$ , packet of size 1,2 and 2 arrives. (A1,B1,C1). At  $t=4$ , A2 of size 2 arrives
- Using GPS:
  - At  $t=3$ , all packets get 1 bit of service
    - A1 departs
  - At  $t=4$ , B1 and C1 get 1.5 bits of service
    - A2 arrives
  - At  $t=5 \frac{1}{2}$ , B1 and C1 get 2 bits of service
    - A2 gets  $\frac{1}{2}$  bits of service
    - B1 and C1 depart
  - At  $t=7$ , A2 departs
  - Sequence of service = A1, {B1,C1}, A2
  - Departure time = 3, 5.5, 5.5, 7



# Example

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## ■ FQ

### ■ Finish #:

- $A1 = 1, B1 = C1 = 2$
- $A2 = 3.5$

### ■ Sequence of service: $A1, \{B1, C1\}, A2$

### ■ Departure Time: 1, 3, 5, 7

## ■ GPS

### ■ Sequence of service: $A1, \{B1, C1\}, A2$

### ■ Departure time: 3, 5.5, 5.5, 7



# Example

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A queue has service rate of 3 bit/s. Packet arrived are shown in the table below and a GPS scheduler is used.

| Packet      | A | B    | C   |
|-------------|---|------|-----|
| Time        | 0 | 0.25 | 0.5 |
| Size (bits) | 2 | 1    | 1   |



# Evaluation

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## ■ Pros

- like GPS, it provides protection
- can obtain worst-case end-to-end delay bound
- gives users incentive to use intelligent flow control (and also provides rate information implicitly)

## ■ Cons

- needs per-connection state
- iterated deletion is complicated (occurs during round number computation)
- requires a priority queue

# Light Load

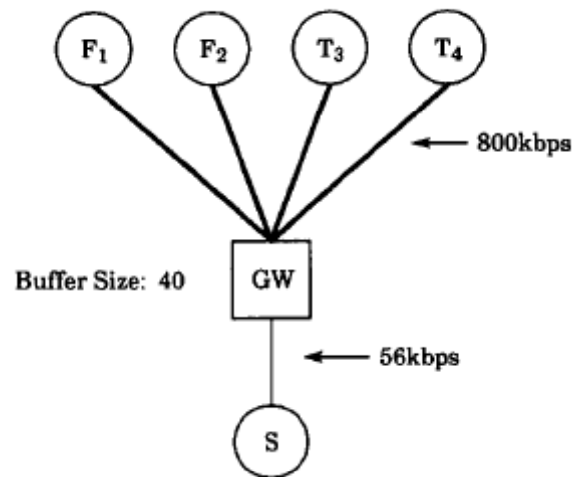


Table II. Scenario 1

| Quantity                | Policy    | FTP   |       | Telnet |       |
|-------------------------|-----------|-------|-------|--------|-------|
|                         |           | 1     | 2     | 3      | 4     |
| Throughput (packets)    | G/FCFS    | 1746  | 1746  | 99     | 96    |
|                         | G/FQ      | 1746  | 1746  | 102    | 94    |
|                         | JK/FCFS   | 1747  | 1745  | 102    | 104   |
|                         | JK/FQ     | 1746  | 1746  | 105    | 103   |
|                         | DEC/DEC   | 1746  | 1746  | 97     | 98    |
|                         | DEC/FQbit | 1745  | 1746  | 83     | 88    |
| Average round-trip time | G/FCFS    | 1.43  | 1.43  | 1.36   | 1.35  |
|                         | G/FQ      | 1.43  | 1.43  | 0.079  | 0.091 |
|                         | JK/FCFS   | 1.43  | 1.43  | 1.35   | 1.36  |
|                         | JK/FQ     | 1.43  | 1.43  | 0.084  | 0.089 |
|                         | DEC/DEC   | 0.286 | 0.286 | 0.206  | 0.218 |
|                         | DEC/FQbit | 1.38  | 1.39  | 0.088  | 0.074 |
| Retransmitted packets   | G/FCFS    | 0     | 0     | 0      | 0     |
|                         | G/FQ      | 0     | 0     | 2      | 1     |
|                         | JK/FCFS   | 0     | 0     | 0      | 0     |
|                         | JK/FQ     | 0     | 0     | 0      | 0     |
|                         | DEC/DEC   | 0     | 0     | 0      | 0     |
|                         | DEC/FQbit | 0     | 0     | 0      | 0     |
| Dropped packets         | G/FCFS    | 0     | 0     | 0      | 0     |
|                         | G/FQ      | 0     | 0     | 0      | 0     |
|                         | JK/FCFS   | 0     | 0     | 0      | 0     |
|                         | JK/FQ     | 0     | 0     | 0      | 0     |
|                         | DEC/DEC   | 0     | 0     | 0      | 0     |
|                         | DEC/FQbit | 0     | 0     | 0      | 0     |

# High Load

Table III. Scenario 2

| Quantity                   | Policy    | FTP   |       |       |       |       |       | Telnet |       |
|----------------------------|-----------|-------|-------|-------|-------|-------|-------|--------|-------|
|                            |           | 1     | 2     | 3     | 4     | 5     | 6     | 7      | 8     |
| Throughput<br>(packets)    | G/FCFS    | 18    | 1154  | 1159  | 3     | 1149  | 15    | 31     | 3     |
|                            | G/FQ      | 178   | 838   | 591   | 600   | 615   | 621   | 96     | 98    |
|                            | JK/FCFS   | 582   | 583   | 585   | 585   | 583   | 582   | 3      | 0     |
|                            | JK/FQ     | 574   | 579   | 546   | 594   | 599   | 601   | 87     | 96    |
|                            | DEC/DEC   | 582   | 582   | 582   | 582   | 582   | 582   | 90     | 99    |
|                            | DEC/FQbit | 582   | 582   | 582   | 582   | 582   | 582   | 83     | 89    |
| Average round-trip<br>time | G/FCFS    | 403   | 2.18  | 2.16  | —     | 2.18  | 140   | 115    | —     |
|                            | G/FQ      | 16.8  | 3.31  | 4.88  | 4.83  | 4.53  | 4.47  | 0.079  | 0.078 |
|                            | JK/FCFS   | 1.85  | 1.93  | 1.93  | 1.85  | 1.93  | 1.85  | —      | —     |
|                            | JK/FQ     | 1.75  | 1.78  | 1.19  | 1.86  | 2.20  | 2.16  | 0.091  | 0.085 |
|                            | DEC/DEC   | 0.859 | 0.859 | 0.859 | 0.859 | 0.859 | 0.859 | 0.783  | 0.778 |
|                            | DEC/FQbit | 1.59  | 1.59  | 1.59  | 1.59  | 1.59  | 1.59  | 0.088  | 0.089 |
| Retransmitted<br>packets   | G/FCFS    | 43    | 10    | 7     | 6     | 9     | 17    | 25     | 5     |
|                            | G/FQ      | 73    | 224   | 176   | 168   | 243   | 159   | 2      | 2     |
|                            | JK/FCFS   | 57    | 57    | 57    | 57    | 57    | 57    | 6      | 0     |
|                            | JK/FQ     | 83    | 80    | 60    | 64    | 61    | 61    | 0      | 0     |
|                            | DEC/DEC   | 0     | 0     | 0     | 0     | 0     | 0     | 0      | 0     |
|                            | DEC/FQbit | 0     | 0     | 0     | 0     | 0     | 0     | 0      | 0     |
| Dropped packets            | G/FCFS    | 26    | 5     | 4     | 3     | 5     | 11    | 15     | 2     |
|                            | G/FQ      | 33    | 139   | 106   | 88    | 167   | 98    | 0      | 0     |
|                            | JK/FCFS   | 56    | 56    | 56    | 56    | 56    | 56    | 5      | 0     |
|                            | JK/FQ     | 80    | 76    | 48    | 61    | 57    | 54    | 0      | 0     |
|                            | DEC/DEC   | 0     | 0     | 0     | 0     | 0     | 0     | 0      | 0     |
|                            | DEC/FQbit | 0     | 0     | 0     | 0     | 0     | 0     | 0      | 0     |

Table IV. Scenario 3

| Quantity                   | Policy    | FTP<br>1 | Telnet<br>2 | Ill-<br>behaved<br>3 |
|----------------------------|-----------|----------|-------------|----------------------|
| Throughput<br>(packets)    | G/FCFS    | 3        | 11          | 3497                 |
|                            | G/FQ      | 3491     | 95          | 5                    |
|                            | JK/FCFS   | 0        | 0           | 3500                 |
|                            | JK/FQ     | 3489     | 110         | 6                    |
|                            | DEC/DEC   | 0        | 0           | 3500                 |
|                            | DEC/FQbit | 3489     | 108         | 5                    |
| Average round-trip<br>time | G/FCFS    | 1362     | 2.87        | 2.97                 |
|                            | G/FQ      | 0.716    | 0.080       | 903                  |
|                            | JK/FCFS   | —        | —           | 2.83                 |
|                            | JK/FQ     | 0.716    | 0.085       | 860                  |
|                            | DEC/DEC   | —        | —           | 2.85                 |
|                            | DEC/FQbit | 0.626    | 0.077       | 918                  |
| Retransmitted<br>packets   | G/FCFS    | 7        | 139         | 0                    |
|                            | G/FQ      | 0        | 2           | 0                    |
|                            | JK/FCFS   | 2        | 0           | 0                    |
|                            | JK/FQ     | 0        | 0           | 0                    |
|                            | DEC/DEC   | 1        | 1           | 0                    |
|                            | DEC/FQbit | 0        | 0           | 0                    |
| Dropped packets            | G/FCFS    | 7        | 127         | 3504                 |
|                            | G/FQ      | 0        | 0           | 6995                 |
|                            | JK/FCFS   | 2        | 0           | 3500                 |
|                            | JK/FQ     | 0        | 0           | 6994                 |
|                            | DEC/DEC   | 1        | 1           | 3500                 |
|                            | DEC/FQbit | 0        | 0           | 6994                 |





# WFQ Variants

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- There are many WFQ variants that are easier to implement and provides different levels of performance bounds
  - SCFQ – self clock fair queueing (1994)
  - DRR – Deficit Round-Robin (1995)
  - $W^2$ FQ – worst-case fair WFQ (1996)
  - and many, many more ....
- In practice, when WFQ variants are available on routers, the number of classes/flows supported tend to be small



# How “fair” is WFQ

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- Unweighted case:
  - if GPS has served  $x$  bits from connection A by time  $t$
  - WFQ would have served at least  $x - P$  bits, where  $P$  is the largest possible packet in the network
  - However, WFQ could send *much more* than GPS would  $\Rightarrow$  absolute fairness bound  $> P$

$$d_{i,WFQ}^k - d_{i,GPS}^k \leq \frac{L_{max}}{r} \quad \forall i, k \quad (5)$$

$$W_{i,GPS}(0, \tau) - W_{i,WFQ}(0, \tau) \leq L_{max} \quad \forall i, \tau \quad (6)$$

- *Is this fair enough?*

# Motivation

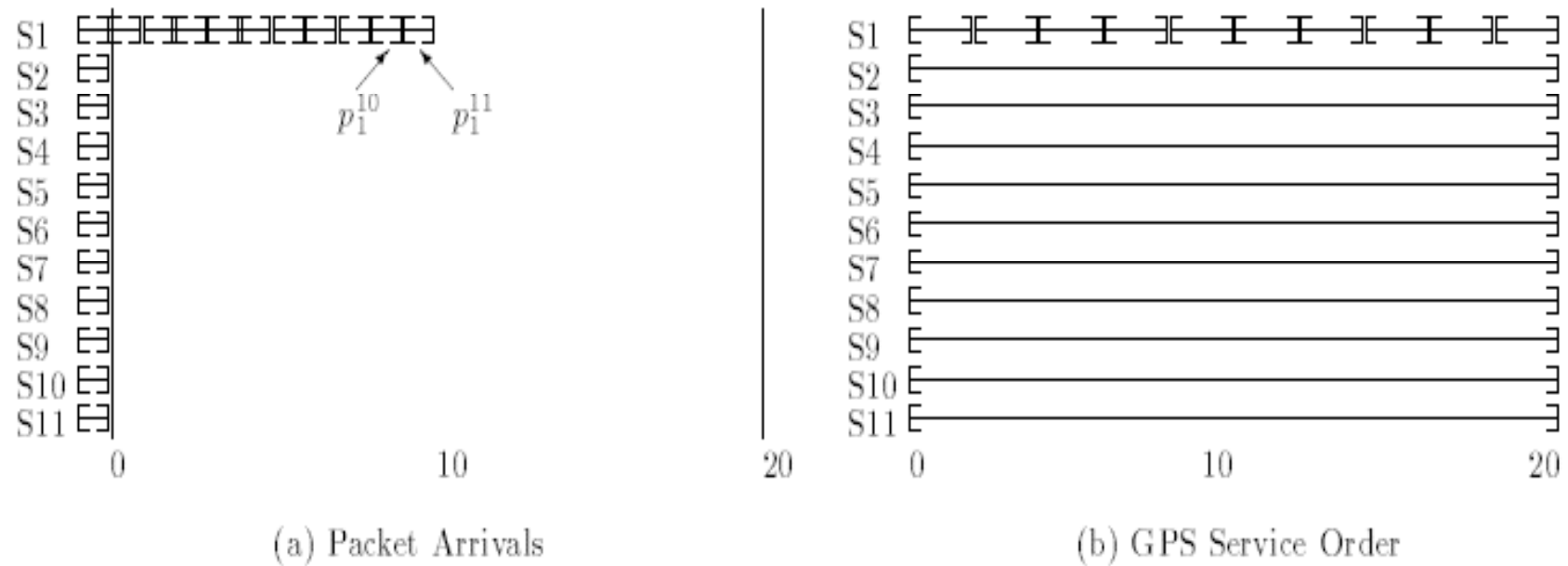


Figure 1: An Example

**Weight of S1 = 10, all the rest are 1**

# Example of “unfairness”

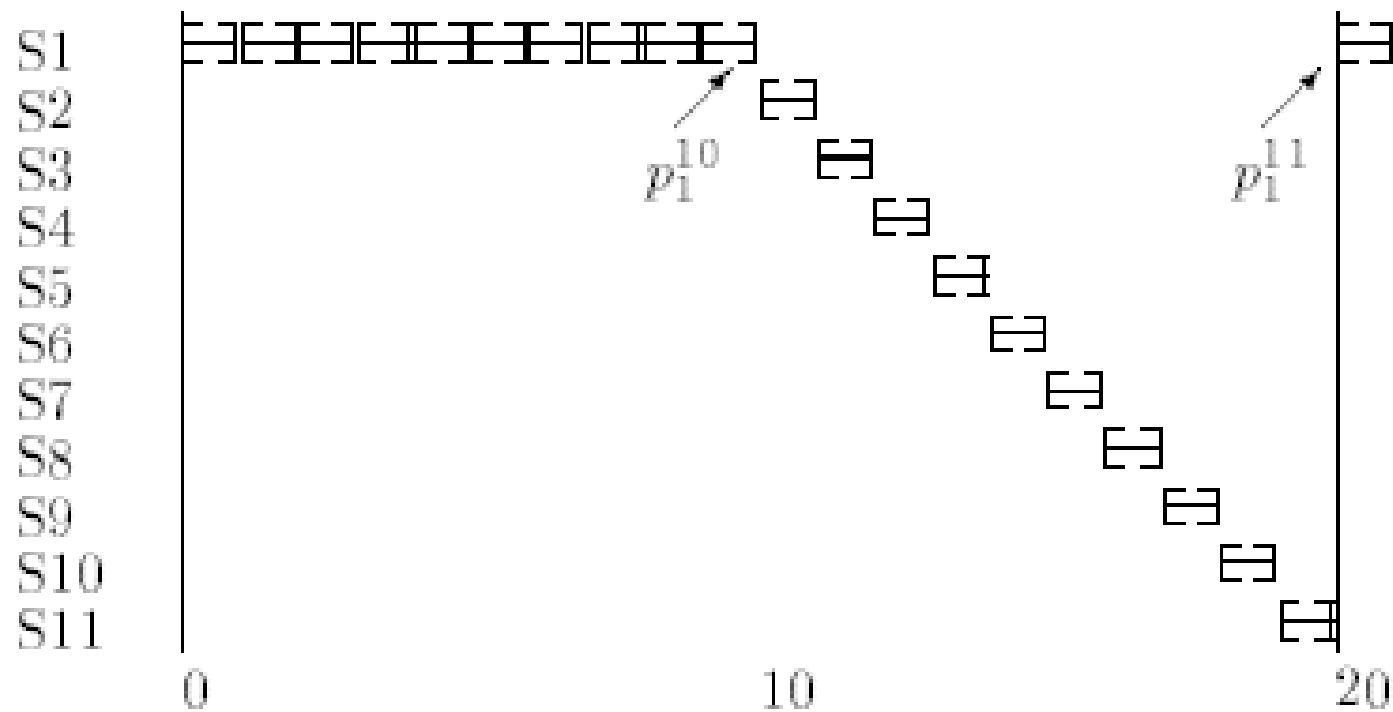


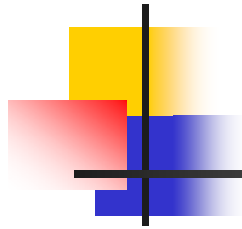
Figure 2: WFQ Service Order



# W2FQ

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- A packet can arrive later and yet be served earlier
- WFQ: choose among all packets, the first packet that would complete its service
- W2FQ: considers only packets that would have started (even completed) under GPS
  - Among these (eligible) packets, choose the packet that would have completed first



# Example

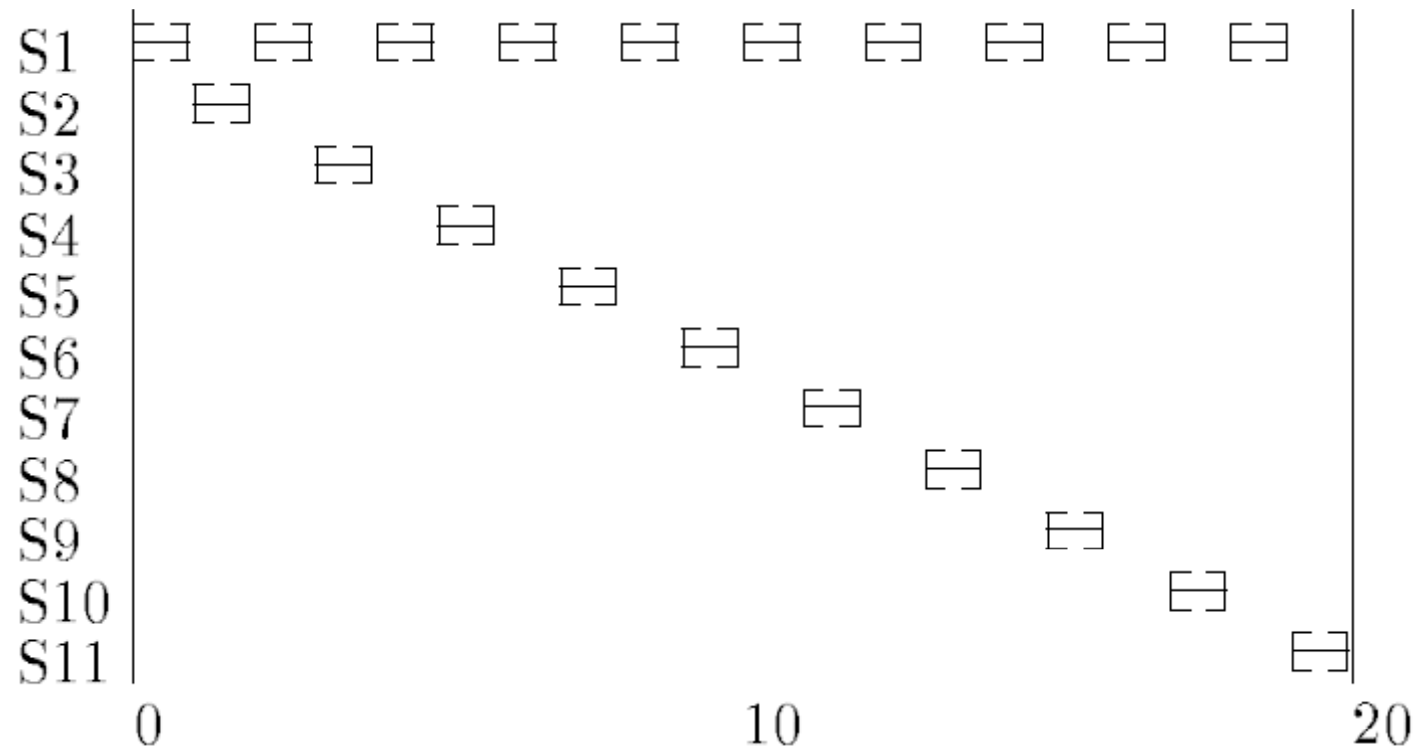


Figure 4:  $WF^2Q$  Service Order