

# Performance Modeling of Computer Systems and Networks

*Prof. Vittoria de Nitto Personè*

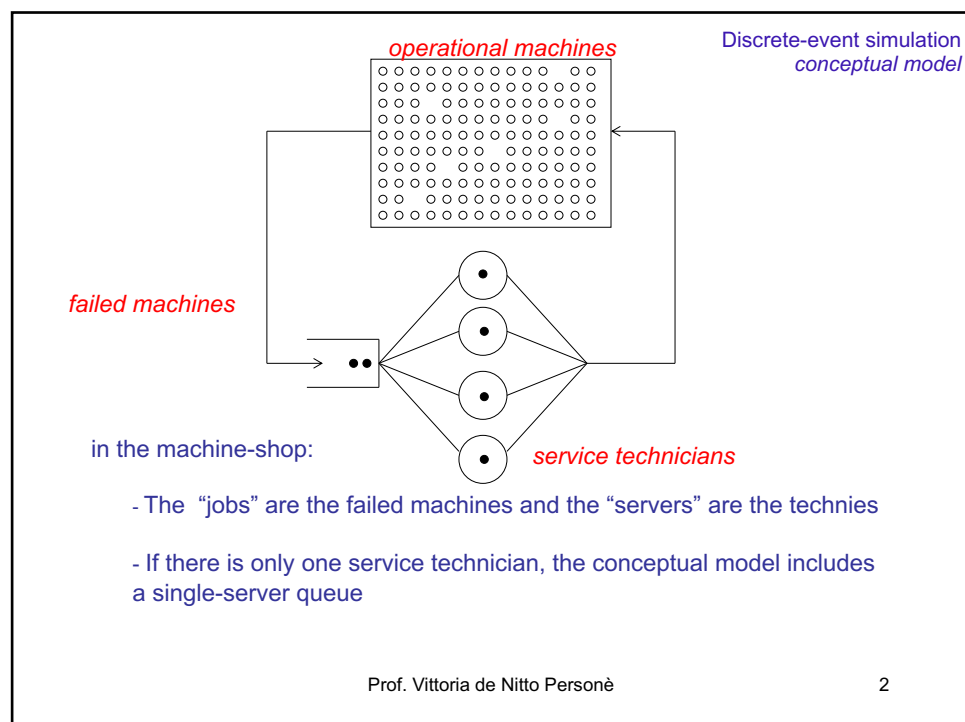
Trace-driven simulation  
Case study 1

Università degli studi di Roma Tor Vergata  
Department of Civil Engineering and Computer Science Engineering

Copyright © Vittoria de Nitto Personè, 2021  
<https://creativecommons.org/licenses/by-nc-nd/4.0/>



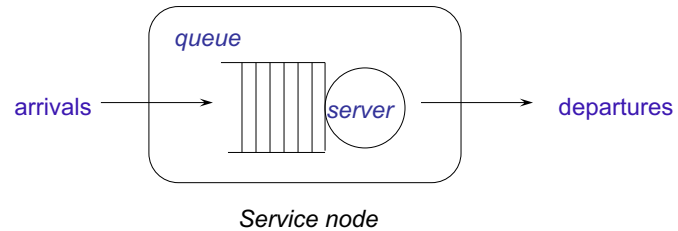
1



2

Discrete-event simulation  
conceptual model

## Single server queue



- *def. 1* a single server service node consists of a server plus its queue

Prof. Vittoria de Nitto Personè

3

3

## terminology

synonymous

- queue/center/node
- job/user/request

usual

- waiting time
- response/sojourn time

→

in the book

delay  
wait

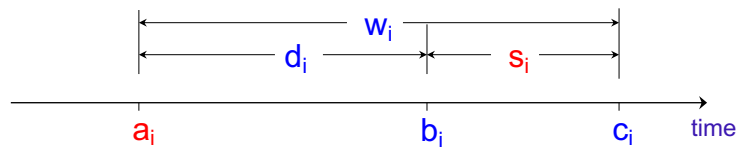
Prof. Vittoria de Nitto Personè

4

4

For a job  $i$ :

- The *arrival time* is  $a_i$
  - The *service time* is  $s_i$
  - The *delay* in the queue is  $d_i$  (delay, usually this is known as "waiting time")
  - The time that service begins is  $b_i = a_i + d_i$  (begin)
  - The *wait* in the node is  $w_i = d_i + s_i$  (wait, aka response time)
  - The departure time is  $c_i = a_i + w_i$  (completion)
- output variables



Prof. Vittoria de Nitto Personè

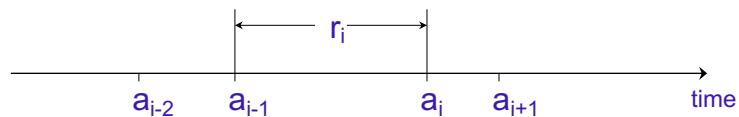
5

5

The *interarrival time* between jobs  $i - 1$  and  $i$  is

$$r_i = a_i - a_{i-1}$$

where, by definition,  $a_0 = 0$



Assume only one arrival per time instant  
 $r_i > 0, \forall i$

NO bulk

Prof. Vittoria de Nitto Personè

6

6

*trace-driven simulation*

- The model is driven by external data:  
Given the arrival times  $a_i$  and service times  $s_i$ , **can the delay times  $d_i$  be computed?**
- For some queue disciplines, this question is difficult to answer
- If the queue discipline is FIFO,  $d_i$  is determined by when  $a_i$  (the arrival) occurs relative to  $c_{i-1}$  (the previous departure)

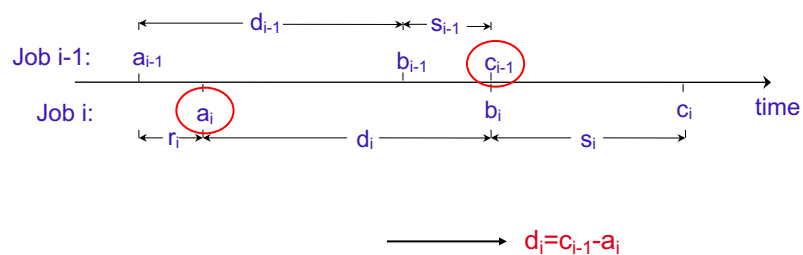
Prof. Vittoria de Nitto Personè

7

7

Case 1. The job arrives *before* the previous job completes

$$a_i < c_{i-1}$$



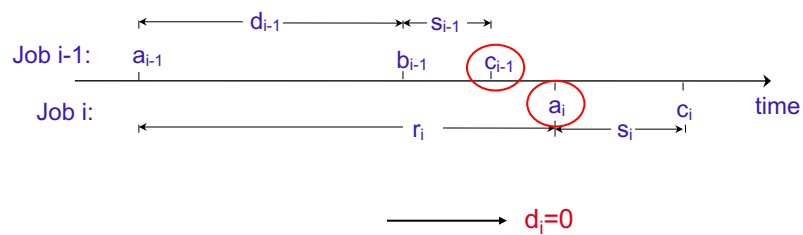
Prof. Vittoria de Nitto Personè

8

8

Case 2. The job arrives *after* the completion of the previous job

$$a_i \geq c_{i-1}$$



Prof. Vittoria de Nitto Personè

9

9

## Output statistics

- The purpose of simulation is insight — gained by looking at statistics
- The importance of various statistics varies on perspective:
  - User perspective (job): wait time is most important
  - Manager perspective: utilization is critical
- Statistics are broken down into two categories
  - Job-averaged
  - Time-averaged

Prof. Vittoria de Nitto Personè

10

10

## Job-averaged statistics

- *Average interarrival time*  $\bar{r} = \frac{1}{n} \sum_{i=1}^n r_i = \frac{a_n}{n}$   
*Arrival rate*  $\frac{1}{\bar{r}}$
- *Average service time*  $\bar{s} = \frac{1}{n} \sum_{i=1}^n s_i$   
*Service rate*  $\frac{1}{\bar{s}}$

Prof. Vittoria de Nitto Personè

11

11

## Job-averaged statistics

- The *average delay* and *average wait* are defined as

$$\bar{d} = \frac{1}{n} \sum_{i=1}^n d_i \quad \bar{w} = \frac{1}{n} \sum_{i=1}^n w_i$$

Recall  $w_i = d_i + s_i \quad \forall i$ , hence

$$\bar{w} = \frac{1}{n} \sum_{i=1}^n w_i = \frac{1}{n} \sum_{i=1}^n (d_i + s_i) = \frac{1}{n} \sum_{i=1}^n d_i + \frac{1}{n} \sum_{i=1}^n s_i = \bar{d} + \bar{s}$$

Sufficient to compute any two of  $\bar{w}, \bar{d}, \bar{s}$ 

Prof. Vittoria de Nitto Personè

12

12

## time-averaged statistics

For SSQ, need three additional functions

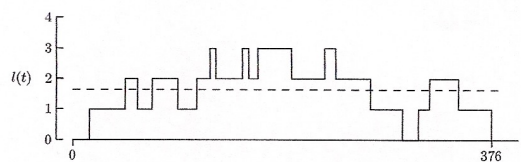
- $l(t)$ : number of jobs in the service node at time  $t$
- $q(t)$ : number of jobs in the queue at time  $t$
- $x(t)$ : number of jobs in service at time  $t$

By definition  $l(t)=q(t)+x(t) \quad \forall t$

$l(t) = 0, 1, 2, \dots$

$q(t) = 0, 1, 2, \dots$

$x(t) = 0, 1$



The three functions are *piecewise constant*

Prof. Vittoria de Nitto Personè

13

13

Over the time interval  $(0, \tau)$ :

time-averaged number in the node:  $\bar{l} = \frac{1}{\tau} \int_0^\tau l(t) dt$

time-averaged number in the queue:  $\bar{q} = \frac{1}{\tau} \int_0^\tau q(t) dt$

time-averaged number in service:  $\bar{x} = \frac{1}{\tau} \int_0^\tau x(t) dt$

**Def. Utilization**  
The proportion of  
time that the  
server is busy

Since  $l(t)=q(t)+x(t) \quad \forall t$

$$\bar{l} = \bar{q} + \bar{x}$$

Prof. Vittoria de Nitto Personè

14

14

How are job-averaged and time-average statistics related?

Little's Law (1961)

If (a) queue discipline is FIFO,  
(b) service node capacity is infinite, and  
(c) server is idle both at the beginning and end of the  
observation interval ( $t = 0, t = c_n$ )

then

$$\int_0^{c_n} l(t) dt = \sum_{i=1}^n w_i$$

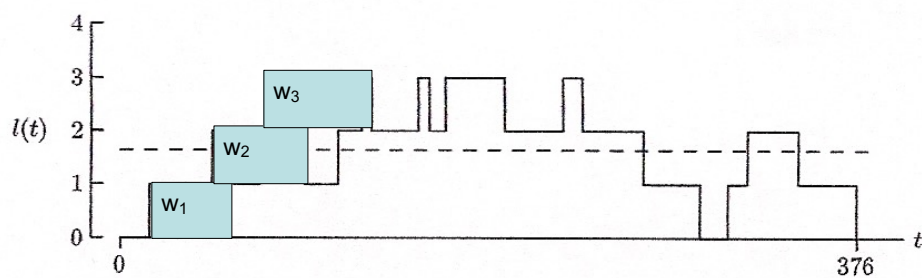
$$\int_0^{c_n} q(t) dt = \sum_{i=1}^n d_i$$

$$\int_0^{c_n} x(t) dt = \sum_{i=1}^n s_i$$

Prof. Vittoria de Nitto Personè

15

15

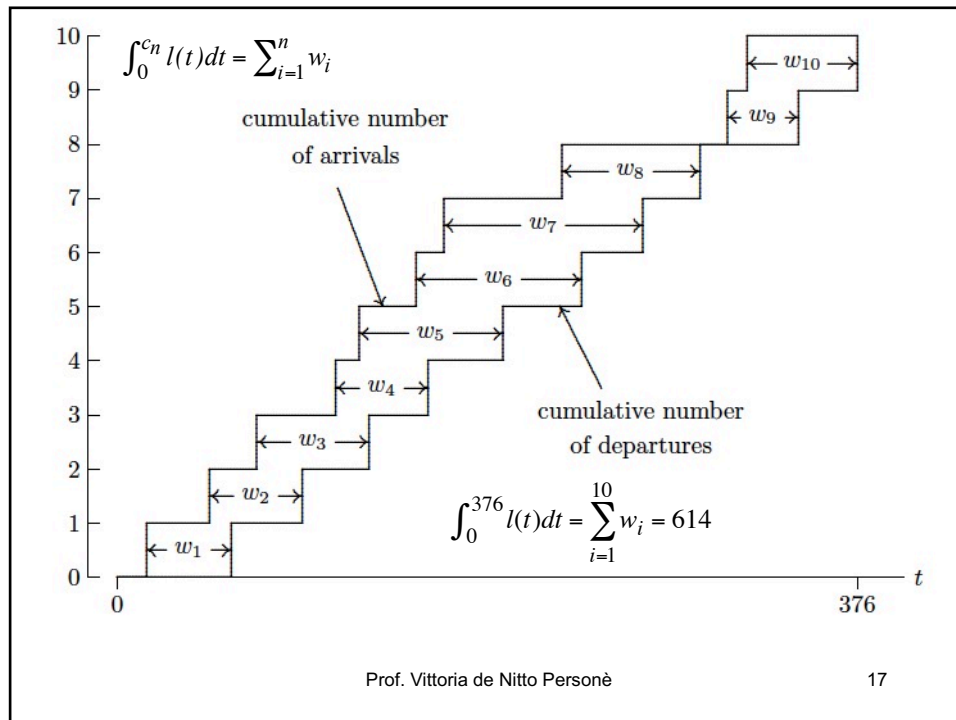


Prof. Vittoria de Nitto Personè

16

16





17

Discrete-event simulation  
Output statistics

Using  $\tau = c_n$  in  $\bar{l} = \frac{1}{\tau} \int_0^{\tau} l(t)dt$

along with Little's Theorem, we have:

$$c_n \bar{l} = \int_0^{c_n} l(t)dt = \sum_{i=1}^n w_i = n\bar{w}$$

As a consequence:

$$\bar{l} = \frac{n}{c_n} \bar{w}$$

Same holds for:

$$\bar{q} = \frac{n}{c_n} \bar{d} \quad \bar{x} = \frac{n}{c_n} \bar{s}$$

$\frac{n}{c_n}$  represents the *average system throughput* in  $c_n$   
 Note that, for infinite queue, this corresponds to the average arrival rate

Prof. Vittoria de Nitto Personè 18

18

*Def. Traffic intensity*

The ratio of the arrival rate to the service rate

$$\frac{1/\bar{r}}{1/\bar{s}} = \frac{\bar{s}}{\bar{r}} = \frac{\bar{s}}{a_n/n} = \left( \frac{c_n}{a_n} \right) \bar{x}$$

$$\downarrow$$

$$\bar{x} = \frac{n}{c_n} \bar{s}$$

When  $c_n/a_n$  is close to 1.0, the traffic intensity and utilization will be nearly equal