

# Advanced Topics in Software Engineering: Operational Laws

#### Prof. Michele Loreti

### **Advanced Topics in Software Engineering** *Corso di Laurea in Informatica (L31) Scuola di Scienze e Tecnologie*



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- The laws are very general and make almost no assumptions about the behaviour of the random variables characterising the system.
- Another advantage of the laws is their simplicity: this means that they can be applied quickly and easily by almost anyone.





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- Each request generates a job or customer within the system.
- When the job has been processed the system responds to the environment with the completion of the corresponding request.



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- N, the average number of jobs in the system.



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- S = B/C, the mean service time per completed job.



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- This is a testable assumption because an analyst can always test whether the assumption holds.
- Note that if the system is job flow balanced the arrival rate will be the same as the completion rate, that is, λ = X.

Little's Law



# N = XWLittle's Law

The average number of jobs N in a system is equal to the product of the throughput of the system X and the average time W spent in that system by a job.



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Little's law tells us that the average time spent at the disk by a request must be 4/40 = 0.1 seconds.

If we know that each request requires 0.0225 seconds of disk service we can then deduce that the average queueing time is 0.0775 seconds.





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- A system may be regarded as being made up of a number of devices or resources.
- Each of these may be treated as a system in its own right from the perspective of operational laws.





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# Visit count





In an observation interval we can count not only completions external to the system, but also the number of completions at each resource within the system.

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# Visit count





We define the visit count,  $V_i$ , of the *i*th resource to be the ratio of the number of completions at that resource to the number of system completions  $V_i \equiv C_i/C$ .

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- ... 10 system completions
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The throughput at the *i*th resource is equal to the product of the throughput of the system and the visit count at that resource.

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- The throughput of the press will be  $X_{press} = X \times V_{press} = 2 \times 2 = 4$ .
- Thus the press throughput is 4 widgets per minute.



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- (Note that service time is not necessarily the same as the residence time of the job at that resource: in general a job might have to wait for some time before processing begins.)
- The total amount of service that a system job generates at the *i*th resource is called the service demand, D<sub>i</sub>:

$$D_i = S_i V_i$$



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Utilisation Law

The utilisation of a resource is equal to the product of the throughput of that resource and the average service requirement at that resource.





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### Utilisation Example



- Consider again the disk that is serving 40 requests/second, each of which requires 0.0225 seconds of disk service.
- The utilisation law tells us that the utilisation of the disk must be  $40 \times 0.0225 = 90\%$ .



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- However, if the mean number of jobs in the system, N, or the system level throughput, X, are not known an alternative method can be used.
- Applying Little's Law to the *i*th resource we see that N<sub>i</sub> = X<sub>i</sub>W<sub>i</sub>, where N<sub>i</sub> is the mean number of jobs at the resource and W<sub>i</sub> is the average response time of the resource.



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- From the Forced Flow Law we know that X<sub>i</sub> = XV<sub>i</sub>. Thus we can deduce that

$$N_i/X = V_i W_i$$
.



The total number of jobs in the system is clearly the sum of the number of jobs at each resource, i.e.  $N = N_1 + \cdots + N_M$  if there are M resources. From Little's Law that W = N/X and so:



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The average residence time of a job in the system will be the sum of the product of its average residence time at each resource and the number of visits it makes to that resource.

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**Operational Laws** 

### General Residence Time Law: Example



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- On average each CPU burst requires 30 milliseconds (waiting + processing time).
- Monitoring has shown that the throughput of disk A is 15 requests per second and the average number in the buffer is 4 whilst at disk B the throughput is 10 requests per second and the average number in the buffer is 3.



$$W_{diskA} = \frac{N_{diskA}}{X_{diskA}}$$



$$W_{diskA} = rac{N_{diskA}}{X_{diskA}} = rac{5}{15/1000}$$



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Then

$$W = W_{CPU}V_{CPU} + W_{diskA}V_{diskA} + W_{diskB}V_{diskB}$$

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$$W = W_{CPU}V_{CPU} + W_{diskA}V_{diskA} + W_{diskB}V_{diskB}$$
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$$W = W_{CPU}V_{CPU} + W_{diskA}V_{diskA} + W_{diskB}V_{diskB}$$
  
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= 3780 + 25000 + 20000

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Then

$$W = W_{CPU}V_{CPU} + W_{diskA}V_{diskA} + W_{diskB}V_{diskB}$$
  
=  $30 \times 126 + \frac{5000}{15} \times 75 + \frac{4000}{10} \times 50$   
=  $3780 + 25000 + 20000$ 

= 48780*milliseconds* 

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- Back when most processing was done on shared mainframes, think time, Z, was quite literally the length of time that a programmer spent thinking before submitting another job.
- More generally in interactive systems, jobs spend time in the system not engaged in processing, or waiting for processing: this may be because of interaction with a human user, or may be for some other reason.
- The key feature of such a system is that the residence time can no longer be taken as a true reflection of the response time of the system.

#### Example



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- At the end of this non-processing period the job generates a fresh request.

## Think time, residence time, response time

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• The think time represents the time between processing being completed and the job becoming available as a request again.

# Think time, residence time, response time



- The think time represents the time between processing being completed and the job becoming available as a request again.
- Thus the residence time of the job, as calculated by Little's Law as the time from arrival to completion, is greater than the system's response time.



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Note that if the think time is zero, Z = 0 and R = W, then the interactive response time law simply becomes Little's Law.

## Interactive Response Time Law: Example



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## Interactive Response Time Law: Example



- Suppose that the library catalogue system has 64 interactive users connected via Browsers, that the average think time is 30 seconds, and that system throughput is 2 interactions/second.
- Then the interactive response time law tells us that the response time must be 64/2 - 30 = 2 seconds.



The resource within a system which has the greatest service demand is known as the bottleneck resource or bottleneck device, and its service demand is max<sub>i</sub>{D<sub>i</sub>}, denoted D<sub>max</sub>.



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- The bottleneck resource is important because it limits the possible performance of the system.
- This will be the resource which has the highest utilisation in the system.

## Residence time, service demand, contention

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- The total amount of processing that a job requires is D, the total service demand,

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• In general, there will be some contention in the system meaning that jobs have to wait for processing so the residence time will be larger than this, i.e.  $W \ge D$ 



# Throughput, utilisation and overall performance

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# Throughput, utilisation and overall performance



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It follows that if we wish to improve throughput we should first concentrate on this resource—improving throughput at other resources in the system might have little effect on the overall performance.



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- Applying the Interactive Response Time Law to the throughput bound, X ≤ 1/D<sub>max</sub> we obtain:

 $R = N/X - Z \ge ND_{max} - Z$ 



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- Applying the Interactive Response Time Law to the throughput bound,  $X \le 1/D_{max}$  we obtain:

 $R = N/X - Z \ge ND_{max} - Z$ 

■ Applying Little's Law we obtain *W* ≥ *ND*<sub>max</sub>.



Thus the asymptotic bound for residence time or response time is:

 $W \geq \max\{D, ND_{max}\}$ **Residence** Time Bound

 $R \geq \max\{D, ND_{max} - Z\}$ **Response Time Bound** 



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• Applying Little's Law (when Z = 0) we obtain  $X \le N/D$ .

$$X \leq \min\{1/D_{max}, N/(D+Z)\}$$
  
Throughput Bound (lightly loaded system)



Notice that the bottleneck depends on both resource parameters (X<sub>i</sub> or S<sub>i</sub>) and the workload parameters (V<sub>i</sub>).



- Notice that the bottleneck depends on both resource parameters (X<sub>i</sub> or S<sub>i</sub>) and the workload parameters (V<sub>i</sub>).
- If we change the number of visits that each job makes to a resource we might move the bottleneck.



- As mentioned in the introduction, the operational laws do not rely on many assumptions.
- The only explicit assumption we have made is that the system is job flow balanced—the same number of requests are completed by the system as arrive at the system.
- We are also implicitly assuming that this holds at each of the resources or devices within a system. A consequence of this is that jobs are not created or destroyed anywhere in the system. This is sometimes called conservation of work.
- We have also assumed that the system is homogeneous, that is, that the behaviour of jobs or resources within a system does not depend on the global state of the system.



#### To be continued...

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**Operational Laws** 

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