

## Recap - Basic Quantities

$T$	length of an observation interval
$A_k$	number of arrivals observed
$C_k$	number of completions observed
$\lambda_k$	arrival rate
$X_k$	throughput
$B_k$	busy time
$U_k$	utilization
$S_k$	service requirement per visit
$W$	accumulated system time
$N$	customer population
$R_k$	residence time
$Z$	think time of a terminal user
$V_k$	number of visits
$D_k$	service demand

$$\lambda_k \equiv \frac{A_k}{T}$$

$$X_k \equiv \frac{C_k}{T}$$

$$U_k \equiv \frac{B_k}{T}$$

$$S_k \equiv \frac{B_k}{C_k} = \frac{U_k T}{C_k}$$

$$N \equiv \frac{W}{T}$$

$$R_k \equiv \frac{W}{C_k}$$

$$V_k \equiv \frac{C_k}{C}$$

$$D_k \equiv V_k S_k = \frac{B_k}{C} = \frac{U_k T}{C}$$

## Recap - Fundamental Laws

Utilization Law:  $U_k = X_k S_k = X D_k$

Little's Law:  $N = X R$

Response Time Law:  $R = \frac{N}{X} - Z$

Forced Flow Law:  $X_k = V_k X$

## Example on Little's Law [2] i

Caroline is a wine buff and bon vivant. She likes to stop at her local wine store, *Transcendental Tastings*, on the way home from work. She browses the aisles looking for the latest releases from her favorite vineyards. Occasionally she picks up a few bottles. She stores these in a rack in a cool corner of her cellar. She and her partner eat out frequently but when they are at home they usually split a bottle of wine at dinner. Sometimes they have friends over and that puts a bigger dent in the wine inventory.

They have been doing this for some time. Her wine rack holds 240 bottles. She notices that she seldom fills the rack to the top but sometimes after a good party the rack is empty. On

## Example on Little's Law [2] ii

average it seems to be about 2/3rds full, which would equate to 160 bottles.

Many wines improve with age. After reading an article about this, Caroline starts to wonder how long, on average, she has been keeping her wines. She went back through a few months of wine invoices from *Transcendental* and estimates that she has bought, on average, about eight bottles per month. But she certainly doesn't know when she drank which bottle and so there seems to be no way she can find out, even approximately, the average age of the bottles she has been drinking.

This is a good task for Little's Law.

160 bottles on average

96 bot/year  
→



Average age?

## Example on Utilization law

Erik Mora, the fastest bartender in the world, poured 1559 drinks in 60 minutes. Since he was competing for a world record, we can imagine that he's been busy the whole hour. How much time did it take, on average, to prepare a single drink?

If he works in a bar serving 1000 drinks per hour, how much time will he have to slack off, assuming he works at full speed?



## Example on Response time law

In a course there 100 students. Each student studies for a week, then sends an email to the professor, waits for an answer, studies one more week and then sends another email and so on. The professor replies to 5 emails every day. How much time does every student wait, on average, for an answer?



## Example on Forced flow law

A ski resort accommodates 1000 visitors per day. The resort has a nice ski slope which every skiers visits, on average, 10 times.

How many visits does the slope see in an entire day?

## Exercise 1 [1]

Software monitor data for an interactive system shows a CPU utilization of 75%, a 3 second CPU service demand, a response time of 15 seconds, and 10 active users. What is the average think time of these users?

## Exercise 2 [1]

An interactive system with 80 active terminals shows an average think time of 12 seconds. On average, each interaction causes 15 paging disk accesses. If the service time per paging disk access is 30 ms and this disk is 60% busy, what is the average system response time?

## Exercise 3 [1]

Suppose an interactive system is supporting 100 users with 15 second think times and a system throughput of 5 interactions/second.

1. What is the response time of the system?
2. Suppose that the service demands of the workload evolve over time so that system throughput drops to 50% of its former value (i.e., to 2.5 interactions/second). Assuming that there still are 100 users with 15 second think times, what would their response time be?
3. How do you account for the fact that response time in (2) is more than twice as large as that in (1)?

## Exercise 4 [1]

A user request submitted to the system must queue for memory, and may begin processing (in the central subsystem) only when it has obtained a memory partition.

1. If there are 100 active users with 20 second think times, and system response time (the sum of memory queueing and central sub- system residence times) is 10 seconds, how many customers are competing for memory on average?
2. If memory queueing time is 8 seconds, what is the average number of customers loaded in memory?

## Exercise 5 [1]

In a 30 minute observation interval, a particular disk was found to be busy for 12 minutes. If it is known that jobs require 320 accesses to that disk on average, and that the average service time per access is 25 milliseconds, what is the system throughput (in jobs/second)?

## Exercise 6 [1] i

Consider the following measurement data for an interactive system with a memory constraint:

T	1 hour
N	80
R	1 second
N in memory	6
C	36000
$U_{cpu}$	75%
$U_{D1}$	50%
$U_{D2}$	50%
$U_{D3}$	25%

## Exercise 6 [1] ii

1. What was throughput (in requests / second)?
2. What was the average “think time”?
3. On the average, how many users were attempting to obtain service (i.e., not “thinking”)?
4. On the average, how much time does a user spend waiting for memory (i.e., not “thinking” but not memory-resident) ?



## How to measure the service time? i

We know that  $S_k = \frac{B_k}{C_k}$ , but how can we measure it in a real situation?

We can build a simple monitoring infrastructure by using <https://prometheus.io/>, which collects metrics from monitored targets by scraping metrics HTTP endpoints on these targets. It also offers a powerful query language.

## How to measure the service time? ii

Let's download prometheus and modify the `prometheus.yml` to scrape from localhost:

```
# my global config
global:
  scrape_interval:      15s

scrape_configs:
  - job_name: 'prometheus'
    static_configs:
      - targets: ['localhost:9090']

  - job_name: 'example_python'
    static_configs:
      - targets: ['localhost:9999']
```

## How to measure the service time? iii

And write a simple python example:

```
import time
import numpy as np
from prometheus_client import start_http_server, Counter

def server():
    sleep = np.random.normal(2)
    sleep = int(max(0, sleep))
    time.sleep(sleep)

if __name__ == '__main__':
    completions = Counter('completions', 'number of completed requests')
    time_passed = Counter('time_passed', 'amount of time passed')
    start_http_server(9999)

    for n in range(60):
        tic = time.time()
        server()
        toc = time.time()
        time_passed.inc(toc-tic)
        completions.inc(1)
```

## How to measure the service time? iv

Which value do we expect for the service time?

Now start prometheus, run the script and head to **`http://localhost:9090`**. With the tab *graph* we can check the metrics *completions\_total* and *time\_passed\_total*, we can also graph the value of *time\_passed\_total* / *completions\_total*, obtaining an estimate of the service time of our server.

## References

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Edward D Lazowska et al. *Quantitative system performance: computer system analysis using queueing network models*. Prentice-Hall, Inc., 1984.



John DC Little and Stephen C Graves. “Little’s law”. In: *Building intuition*. Springer, 2008, pp. 81–100.