Operational Laws



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- ☐ What is an Operational Law?
 - 1. Utilization Law
 - 2. Forced Flow Law
 - 3. Little's Law
 - 4. General Response Time Law
 - 5. Interactive Response Time Law
 - 6. Bottleneck Analysis

Operational Laws

- Relationships that do not require any assumptions about the distribution of service times or inter-arrival times.
- □ Identified originally by Buzen (1976) and later extended by Denning and Buzen (1978).
- \square **Operational** \Rightarrow Directly measured.
- **□** Operationally testable assumptions
 - \Rightarrow assumptions that can be verified by measurements.
 - > For example, whether number of arrivals is equal to the number of completions?
 - > This assumption, called job flow balance, is operationally testable.
 - > A set of observed service times is or is not a sequence of independent random variables is not is not operationally testable.

Operational Quantities

Quantities that can be directly measured during a finite observation period.

Black Box

- \Box T =Observation interval $A_i =$ Number of arrivals
- C_i = Number of completions C_i = Busy time B_i

$$B_i = \text{Busy time } B_i$$

Arrival Rate
$$\lambda_i = \frac{\text{Number of arrivals}}{\text{Time}} = \frac{A_i}{T}$$

Throughput
$$X_i = \frac{\text{Number of completions}}{\text{Time}} = \frac{C_i}{T}$$

Utilization
$$U_i = \frac{\text{Busy Time}}{\text{Total Time}} = \frac{B_i}{T}$$

Mean service time
$$S_i = \frac{\text{Total time Served}}{\text{Number served}} = \frac{B_i}{C_i}$$

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Utilization Law

Utilization
$$U_i$$
 = $\frac{\text{Busy Time}}{\text{Total Time}} = \frac{B_i}{T}$
= $\frac{C_i}{T} \times \frac{B_i}{C_i} = \frac{\text{Completions}}{\text{Time}} \times \frac{\text{Busy Time}}{\text{Completions}}$
= Throughput × Mean Service Time = $X_i S_i$

- ☐ This is one of the operational laws
- Operational laws are similar to the elementary laws of motion For example,

$$d = \frac{1}{2}at^2$$

■ Notice that distance *d*, acceleration *a*, and time *t* are **operational quantities**. No need to consider them as expected values of random variables or to assume a distribution.

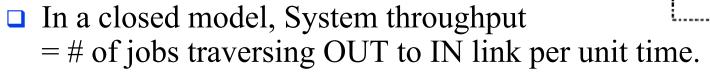
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Example 33.1

- □ Consider a network gateway at which the packets arrive at a rate of 125 packets per second and the gateway takes an average of two milliseconds to forward them.
- □ Throughput X_i = Exit rate = Arrival rate = 125 packets/second
- \square Service time $S_i = 0.002$ second
- Utilization $U_i = X_i S_i = 125 \times 0.002 = 0.25 = 25\%$
- □ This result is valid for any arrival or service process. Even if inter-arrival times and service times to are not IID random variables with exponential distribution.

Forced Flow Law

- Relates the system throughput to individual device throughputs.
- □ In an open model,
 System throughput
 = # of jobs leaving the system per unit time



- □ If observation period T is such that $A_i = C_i$ ⇒ Device satisfies the assumption of <u>job flow balance</u>.
- \square Each job makes V_i requests for i^{th} device in the system
- $C_i = C_0 V_i$ or $V_i = C_i / C_0 V_i$ is called visit ratio
- System throughput $X = \frac{\text{Jobs completed}}{\text{Total time}} = \frac{C_0}{T}$

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Forced Flow Law (Cont)

■ Throughput of i^{th} device:

Device Throughput
$$X_i = \frac{C_i}{T} = \frac{C_i}{C_0} \times \frac{C_0}{T}$$

■ In other words:

$$X_i = XV_i$$

☐ This is the **forced flow law**.

Bottleneck Device

□ Combining the forced flow law and the utilization law, we get:

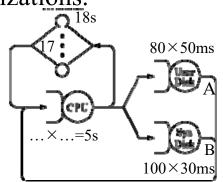
Utilization of
$$i^{\text{th}}$$
 device $U_i = X_i S_i$
= $XV_i S_i$
 $U_i = XD_i$

- □ Here $D_i = V_i S_i$ is the total service demand on the device for all visits of a job.
- \Box The device with the highest D_i has the highest utilization and is the **bottleneck device**.

Example 33.2

- ☐ In a timesharing system, accounting log data produced the following profile for user programs.
 - > Each program requires five seconds of CPU time, makes 80 I/O requests to the disk A and 100 I/O requests to disk B.
 - > Average think-time of the users was 18 seconds.
 - > From the device specifications, it was determined that disk A takes 50 milliseconds to satisfy an I/O request and the disk B takes 30 milliseconds per request.
 - > With 17 active terminals, disk A throughput was observed to be 15.70 I/O requests per second.
- □ We want to find the system throughput and device utilizations.

$$D_{CPU} = 5 \text{ seconds}$$
 $V_A = 80,$
 $V_B = 100,$ $Z = 18 \text{ seconds},$
 $S_A = 0.050 \text{ seconds},$ $S_B = 0.030 \text{ seconds},$
 $N = 17, \text{ and}$ $X_A = 15.70 \text{ jobs/second}$



Example 33.2 (Cont)

$$D_{CPU} = 5 \text{ seconds}$$
 $V_A = 80,$
 $V_B = 100,$ $Z = 18 \text{ seconds},$
 $S_A = 0.050 \text{ seconds},$ $S_B = 0.030 \text{ seconds},$
 $N = 17, \text{ and}$ $X_A = 15.70 \text{ jobs/second}$

Since the jobs must visit the CPU before going to the disks or terminals, the CPU visit ratio is: $V_{CPU} = V_A + V_B + 1 = 181$

$$D_{CPU} = 5 \text{ seconds}$$

$$D_A = S_A V_A = 0.050 \times 80 = 4 \text{ seconds}$$

$$D_B = S_B V_B = 0.030 \times 100 = 3 \text{ seconds}$$

□ Using the forced flow law, the throughputs are:

$$X = \frac{X_A}{V_A} = \frac{15.70}{80} = 0.1963 \text{ jobs/second}$$

$$X_{CPU} = XV_{CPU} = 0.1963 \times 181$$

= 35.48 requests/second

$$X_B = XV_B = 0.1963 \times 100$$

= 19.6 requests/second

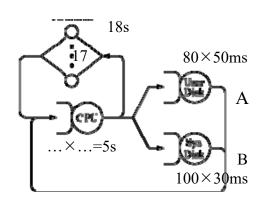
□ Using the utilization law, the device utilizations are:

$$U_{CPU} = XD_{CPU} = 0.1963 \times 5 = 98\%$$

$$U_A = XD_A = 0.1963 \times 4 = 78.4\%$$

$$U_B = XD_B = 0.1963 \times 3 = 58.8\%$$

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Homework 33A

- The visit ratios and service time per visit for a system are as shown:
- For each device what is the total service demand:

> CPU:

 $V_i =$ _____, $S_i =$ _____, $D_i =$ _____

> Disk A:

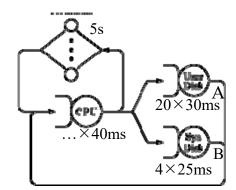
 $V_i =$ ______, $S_i =$ ______, $D_i =$ ______

> Disk B:

 $V_i =$ ______, $S_i =$ ______, $D_i =$ ______

 \triangleright Terminals: $V_i = , S_i = , D_i =$

- □ If disk A utilization is 50%, what's the utilization of CPU and Disk B?
 - \times $X_A = U_A/D_A = \underline{\hspace{1cm}}$
 - \rightarrow $U_{CPIJ} = X D_{CPU} = \underline{\hspace{1cm}}$
 - $\downarrow U_R = X D_R = \underline{\hspace{1cm}}$
- What is the bottleneck device?



Key: $U_i = X_i S_i = XD_i$, $D_i = S_i V_i$, $X = X_i/V_i$

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Transition Probabilities

- p_{ij} = Probability of a job moving to jth queue after service completion at ith queue
- □ Visit ratios and transition probabilities are equivalent in the sense that given one we can always find the other.
- □ In a system with job flow balance: $C_j = \sum_{i=0}^{\infty} C_i p_{ij}$ $i = 0 \Rightarrow$ visits to the outside link
- p_{i0} = Probability of a job exiting from the system after completion of service at i^{th} device
- $lue{}$ Dividing by C_0 we get:

$$V_j = \sum_{i=1}^M V_i p_{ij}$$

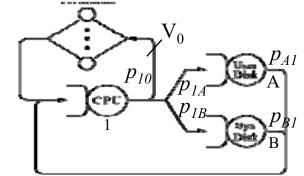
i=0

Transition Probabilities (Cont)

- □ Since each visit to the outside link is defined as the completion of the job, we have: $V_0 = 1$
- ☐ These are called visit ratio equations
- □ In central server models, after completion of service at every queue, the jobs always move back to the CPU queue:

$$p_{i1} = 1 \quad \forall i \neq 1$$

$$p_{ij} = 0 \quad \forall i, j \neq 1$$



Transition Probabilities (Cont)

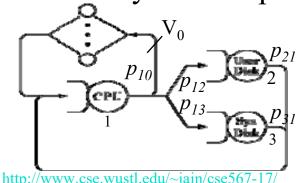
The above probabilities apply to exit and entrances from the system (i=0), also. Therefore, the visit ratio equations become:

$$1 = V_1 p_{10} \Rightarrow V_1 = \frac{1}{p_{10}}$$

$$V_1 = 1 + V_2 + V_3 + \dots + V_M$$

$$V_j = V_1 p_{1j} = \frac{p_{1j}}{p_{10}} \quad j = 2, 3, \dots, M$$

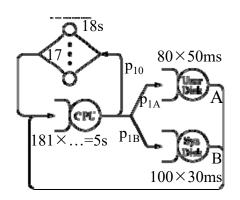
Thus, we can find the visit ratios by dividing the probability p_{1j} of moving to j^{th} queue from CPU by the exit probability p_{10} .



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Example 33.3

Consider the queueing network:



- The visit ratios are $V_A=80$, $V_B=100$, and $V_{CPI}=181$.
- □ After completion of service at the CPU the probabilities of the job moving to disk A, disk B, or terminals are 80/181, 100/181, and 1/181, respectively. Thus, the transition probabilities are p_{14} =0.4420, p_{18} =0.5525, and p_{10} =0.005525.
- □ Given the transition probabilities, we can find the visit ratios by dividing these probabilities by the exit probability (0.005525):

$$V_A = \frac{p_{1A}}{p_{10}} = \frac{0.4420}{0.005525} = 80$$

$$V_B = \frac{p_{1B}}{p_{10}} = \frac{0.5525}{0.005525} = 100$$

$$V_{CPU} = 1 + V_A + V_B = 1 + 80 + 100 = 181$$

Little's Law

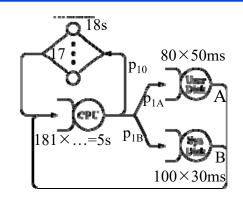
Mean number in the device = Arrival rate \times Mean time in the device $Q_i = \lambda_i R_i$

□ If the job flow is balanced, the arrival rate is equal to the throughput and we can write:

$$Q_i = X_i R_i$$

Example 33.4

☐ The average queue length in the computer system of Example 33.2 was observed to



be: 8.88, 3.19, and 1.40 jobs at the CPU, disk A, and disk B, respectively. What were the response times of these devices?

- In Example 33.2, the device throughputs were determined to be: $X_{CPU} = 35.48$, $X_A = 15.70$, and $X_B = 19.6$
- □ The new information given in this example is:

$$Q_{CPU} = 8.88, \ Q_A = 3.19, \ \text{and} \ Q_B = 1.40$$

□ Using Little's law, the device response times are:

$$R_{CPU} = Q_{CPU}/X_{CPU} = 8.88/35.48 = 0.250 \text{ seconds}$$

 $R_A = Q_A/X_A = 3.19/15.70 = 0.203 \text{ seconds}$
 $R_B = Q_B/X_B = 1.40/19.6 = 0.071 \text{ seconds}$

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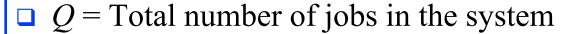
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General Response Time Law

- ☐ There is one terminal per user and the rest of the system is shared by all users.
- □ Applying Little's law to the central subsystem:

$$Q = XR$$

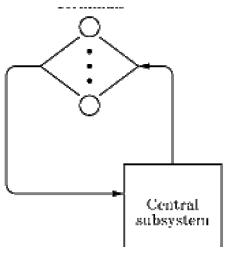




- ightharpoonup R = system response time
- $\supset X =$ system throughput

$$Q = Q_1 + Q_2 + \dots + Q_M$$

$$XR = X_1R_1 + X_2R_2 + \dots + X_MR_M$$



General Response Time Law (Cont)

$$XR = X_1R_1 + X_2R_2 + \dots + X_MR_M$$

□ Dividing both sides by *X* and using forced flow law:

$$R = V_1 R_1 + V_2 R_2 + \dots + V_M R_M$$

or,

$$R = \sum_{i=1}^{M} R_i V_i$$

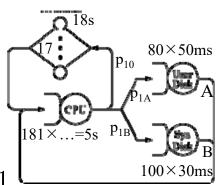
☐ This is called the **general response time law**.

Example 33.5

- Let us compute the response time for the timesharing system of Example 33.4
- □ For this system:

$$V_{CPU} = 181, V_A = 80, \text{ and } V_B = 100$$

$$R_{CPU} = 0.250, R_A = 0.203, \text{ and } R_B = 0.071$$



☐ The system response time is:

$$R = R_{CPU}V_{CPU} + R_AV_A + R_BV_B$$

= $0.250 \times 181 + 0.203 \times 80 + 0.071 \times 100$
= 68.6

□ The system response time is 68.6 seconds.

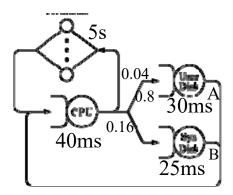
Homework 33B

- ☐ The transition probabilities of jobs exiting CPU and device service times are as shown.
- ☐ Find the visit ratios:

$$V_A = p_{1A}/p_{10} =$$

$$V_{\rm B} = p_{1\rm B}/p_{10} =$$

$$V_{CPU} = 1 + V_A + V_B = \underline{\hspace{1cm}}$$



□ The queue lengths at CPU, disk A, and disk B was observed to be 6, 3, and 1, respectively. The system throughput is 1 jobs/sec.

What is the system response time?

$$R_{CPU} = Q_{CPU} / X_{CPU} = Q_{CPU} / (XV_{CPU}) =$$
 $R_{A} = Q_{A} / (X_{A}) =$

$$R_B = Q_B/(X_B) = \underline{\hspace{1cm}}$$

$$R = R_{CPU}V_{CPU} + R_AV_A + R_BV_B = \underline{ }$$

$$\triangleright$$
 Check: $Q=XR$

Key:
$$U_i = X_i S_i = XD_i$$
, $D_i = S_i V_i$, $X = X_i / V_i$, $Q_i = X_i R_i$, $R = \sum_{i=1}^{M} R_i V_i$

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Interactive Response Time Law

- \square If Z = think-time, R = Response time
 - \triangleright The total cycle time of requests is R+Z
 - \triangleright Each user generates about T/(R+Z) requests in T
- □ If there are *N* users:

```
System throughput X = \text{Total} \# \text{ of requests/Total time}
= N(T/(R+Z))/T
= N/(R+Z)
```

or

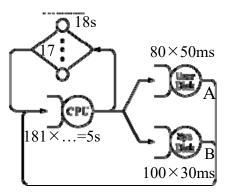
$$R = (N/X) - Z$$

□ This is the interactive response time law

Example 33.6

■ For the timesharing system of Example 33.2:

$$X = 0.1963, N = 17$$
, and $Z = 18$



The response time can be calculated as follows:

$$R = \frac{N}{X} - Z = \frac{17}{0.1963} - 18 = 86.6 - 18 = 68.6 \text{ seconds}$$

□ This is the same as that obtained earlier in Example 33.5.

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Review of Operational Laws

□ Operational quantities:

Can be measured by operations personnel

 $V_i = \#$ of visits per job to device i

 S_i = Service time per job at device i

 D_i = Total service demands per job at device $i = S_i V_i$

 X_i = Throughput of device i

X = Throughput of the system

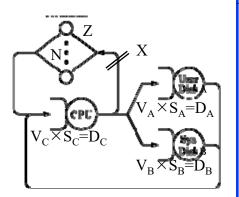
Z = User think time

N = Number of users in a time shared system



Input = # output (flow balance) can be validated Distributions and independence can not be validated.

- Operational Laws: Relationships between operational quantities These apply regardless of distribution, burstiness, arrival patterns. The only assumption is flow balance.
 - 1. Utilization Law: $U=X_iS_i=XD_i$
 - 2. Forced Flow Law: $X_i = XV_i$
 - 3. Little's Law: $Q_i = X_i R_i$
 - 4. General Response Time Law: $R = \sum R_i V_i$
 - 5. Interactive Response Time Law: R = N/X Z



Example

□ Operational quantities:

Can be measured by operations personnel

 $V_i = \#$ of visits per job to device $i = 181,80 \ 100$

 S_i = Service time per job at device i = 27.6ms, 50ms, 30ms

 D_i = Total service demands per job at device $i = S_i V_i = 5s$, 4s, 3 s

Z = User think time = 18s

N = Number of users in a time shared system = 12

\Box Operational Laws: Given $U_A = 75\%$, $Q_A = 2.41$, $Q_B = 1.21$, $Q_C = 5$

- 1. Utilization Law: $U=X_iS_i=XD_i$ $X=U_A/D_A=0.75/4=0.188 \text{ jobs/s}$ $U_C=X\times D_C=0.188\times 5=0.939$ $U_B=X\times D_B=0.188\times 3=0.563$
- 2. Forced Flow Law: $X_i = XV_i$ $X_A = X \times 80 = 0.188 \times 80 = 15 \text{ jobs/s}$ $X_B = X \times 100 = 0.188 \times 100 = 18.8 \text{ jobs/s}$ $X_C = X \times 181 = 0.188 \times 181 = 34 \text{ jobs/s}$
- 3. Little's Law: $Q_i = X_i R_i$ $R_A = Q_A / X_A = 2.41 / 15 = 0.161$, $R_B = 1.21 / 18.8 = 0.064$, $R_C = 5 / 34 = 0.147$
- 4. General Response Time Law: $R = \sum_{i} R_{i} V_{i} = 0.161 \times 80 + 0.064 \times 100 + 0.147 \times 181 = 45.89s$

18s

 $181 \times 27.6 \text{ms} = 5 \text{s}$

 $80 \times 50 \text{ms}$

 $100 \times 30 \text{ms}$

5. Interactive Response Time Law: R = N/X –Z = 12/0.188-18 = 45.83s Washington University in St. Louis http://www.cse.wustl.edu/~jain/cse567-17/

Homework 33C

□ Operational quantities:

Can be measured by operations personnel

 $V_i = \#$ of visits per job to device i = 91, 50, 40

 $S_i = Service time per job at device <math>i = 0.044s$, 0.040s, 0.025s

Z = User think time = 5s N = Number of users = 6

- **Operational Laws**: Given $U_A = 48\%$, $R_A = 0.0705s$, $R_B = 0.0323s$, $R_C = 0.1668s$
 - 1. D_i = Total service demands per job at device $i = S_i V_i$ $D_C = S_C V_C =$ ____ \times __ = ___, $D_A =$ ___ \times __ = ___, $D_B =$ ___ \times __ = ___

 $50 \times 40 \text{ms}$

 $40 \times 25 \text{ms}$

 91×44 ms=4s

- 2. Utilization Law: $U=X_iS_i=XD_i$ $X=U_A/D_A=$ _____/ =____ jobs/s $U_C=XD_C=$ _____ × ___ = ____
- 3. Forced Flow Law: $X_i = XV_i$ $X_A = XV_A = X = X = jobs/s$ $X_B = XV_B = X = jobs/s$ $X_C = XV_C = X = jobs/s$
- 4. Little's Law: $Q_i = X_i R_i$ $Q_A = X_i = X_i Q_B = X_i Q_B = X_i Q_B = X_i Q_C = X_i Q_C$
- 5. General Response Time Law: $R=\sum R_i V_i$ = ___ × __ + __ × __ + __ × __ = __ s
- 6. Interactive Response Time Law: R = N/X –Z = / = s Washington University in St. Louis http://www.cse.wustl.edu/~jain/cse567-17/ ©2017 Rai Jain

Bottleneck Analysis

□ From forced flow law:

$$U_i \propto D_i$$

- \Box The device with the highest total service demand D_i has the highest utilization and is called the bottleneck device.
- Note: Delay centers can have utilizations more than one without any stability problems. Therefore, delay centers cannot be a bottleneck device.
- \square Only queueing centers used in computing D_{max} .
- □ The bottleneck device is the key limiting factor in achieving higher throughput.

Bottleneck Analysis (Cont)

- □ Improving the bottleneck device will provide the highest payoff in terms of system throughput.
- □ Improving other devices will have little effect on the system performance.
- □ Identifying the bottleneck device should be the first step in any performance improvement project.

Asymptotic Bounds

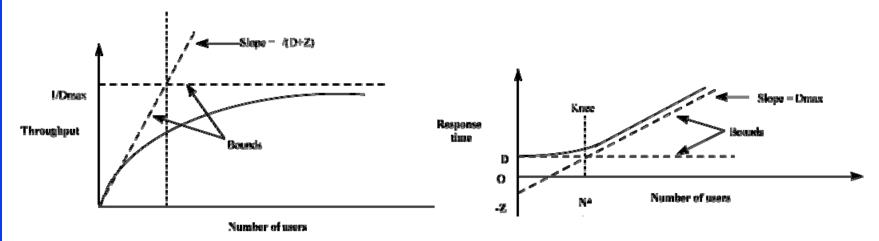
□ Throughput and response times of the system are bound as follows:

$$X(N) \le \min\{\frac{1}{D_{max}}, \frac{N}{D+Z}\}\$$

and

$$R(N) \ge max\{D, ND_{max} - Z\}$$

□ Here, $D = \sum D_i$ is the sum of total service demands on all devices except terminals.



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Asymptotic Bounds: Proof

- ☐ The asymptotic bounds are based on the following observations:
 - 1. The utilization of any device cannot exceed one. This puts a limit on the maximum obtainable throughput.
 - 2. The response time of the system with N users cannot be less than a system with just one user. This puts a limit on the minimum response time.
 - 3. The interactive response time formula can be used to convert the bound on throughput to that on response time and vice versa.

Proof (Cont)

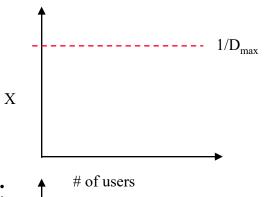


$$U_b = XD_{max}$$

Since U_b cannot be more than one:

$$XD_{max} \leq 1$$

$$X \le \frac{1}{D_{max}}$$





2. With just one job in the system, there is no queueing and the system response time is simply the sum of the service demands:

R

$$R(1) = D_1 + D_2 + \dots + D_M = D$$

With more than one user there may be some queueing and so the response time will be higher. That is:

$$R(N) \ge D$$

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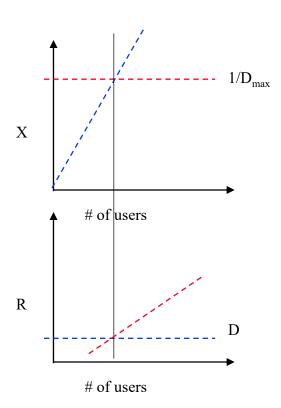
Proof (Cont)

3. Applying the interactive response time law to the bounds:

$$R = (N/X) - Z$$

$$R(N) = \frac{N}{X(N)} - Z \ge ND_{max} - Z$$

$$X(N) = \frac{N}{R(N) + Z} \le \frac{N}{D + Z}$$



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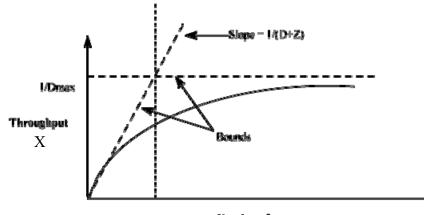
Optimal Operating Point

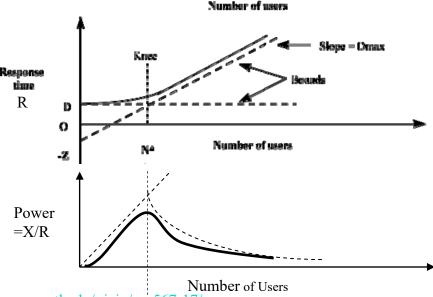
☐ The number of jobs N^* at the knee is given by:

$$D = N^* D_{max} - Z$$

$$N^* = \frac{D+Z}{D_{max}}$$

- ☐ If the number of jobs is more than N^* , then we can say with certainty that there is queueing somewhere in the system.
- ☐ The asymptotic bounds can be easily explained to people who do not have any background in queueing theory or performance analysis.
- Control Strategy: Increase N iff dP/dN is positive





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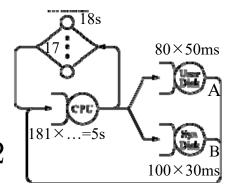
Example 33.7

□ For the timesharing system of Example 33.2:

$$D_{CPU} = 5, D_A = 4, D_B = 3, Z = 18$$

 $D = D_{CPU} + D_A + D_B = 5 + 4 + 3 = 12$

 $D_{max} = D_{CPU} = 5$

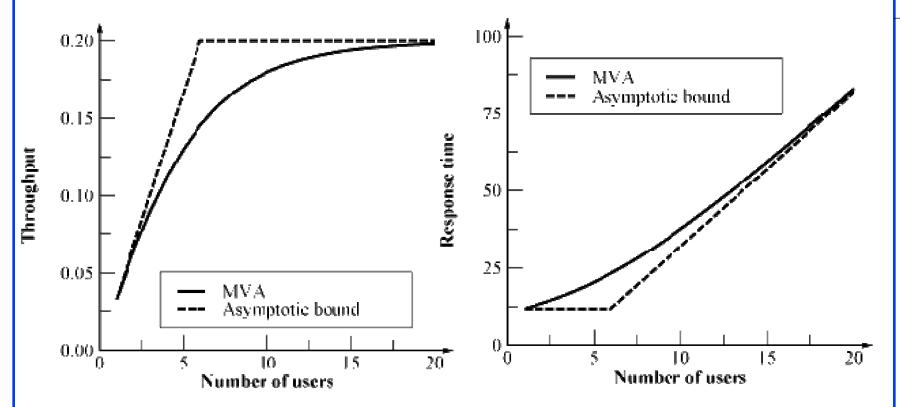


■ The asymptotic bounds are:

$$X(N) \le \min\left\{\frac{N}{D+Z}, \frac{1}{D_{max}}\right\} = \min\left\{\frac{N}{30}, \frac{1}{5}\right\}$$

$$R(N) \ge \max\{D, ND_{max} - Z\} = \max\{12, 5N - 18\}$$

Example 33.7: Asymptotic Bounds



The knee occurs at:

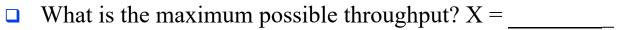
$$12 = 5N^* - 18$$

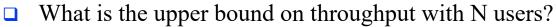
$$N^* = \frac{12 + 18}{5} = \frac{30}{5} = 6$$
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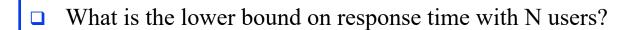
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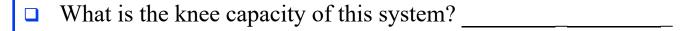
Homework 33D

- ☐ The total demands on various devices are as shown.
- What is the minimum response time? $R = D = D_{CPU} + D_A + D_B =$ ______
- What is the bottleneck device?
- What is the maximum possible utilization of disk B? $U_{\rm R}$ =









Key:
$$R \ge \max\{D, ND_{max}-Z\}, X \le \min\{1/D_{max}, N/(D+Z)\}$$

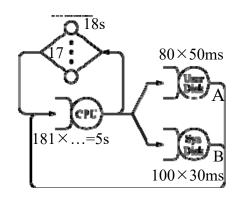
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Example 33.8

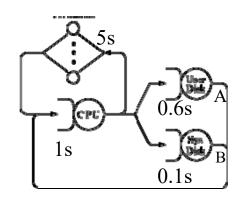
- How many terminals can be supported on the timesharing system of Example 33.2 if the response time has to be kept below 100 seconds?
- Using the asymptotic bounds on the response time we get:

$$R(N) \ge \max\{12, 5N - 18\}$$



- □ The response time will be more than 100, if: $5N 18 \ge 100$
- That is, if: $N \ge 23.6$ the response time is bound to be more than 100. Thus, the system cannot support more than 23 users if a response time of less than 100 is required.

Homework 33E



- For this system, which device would be the bottleneck if:
- □ The CPU is replaced by another unit that is twice as fast? _____
- □ Disk A is replaced by another unit that is twice as slow? _____
- □ Disk B is replaced by another unit that is twice as slow? _____
- The memory size is reduced so that the jobs make 25 times more visits to disk B due to increased page faults?

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Summary

 $U_i = X_i S_i = X D_i$ Utilization Law:

 $X_i = XV_i$ Forced Flow Law:

 $Q_i = X_i R_i$ Little's Law:

General Response Time Law: $R = \sum_{i=1}^{M} R_i V_i$ Interactive Response Time Law: $R = \frac{N}{X} - Z$ Asymptotic Bounds: $R \geq \max\{D, ND_{max} - Z\}$

 $X \leq min\{1/D_{max}, N/(D+Z)\}$

Symbols:

Sum of service demands on all devices = $\sum_i D_i$ D

 D_i Total service demand per job for ith device = S_iV_i

Service demand on the bottleneck device = $\max_{i} \{D_i\}$ D_{max}

NNumber of jobs in the system

Number in the *i*th device Q_i

RSystem response time

 R_i Response time per visit to the ith device

 S_i Service time per visit to the *i*th device

Utilization of ith device U_i

 V_i Number of visits per job to the *i*th device

XSystem throughput

 X_i Throughput of the *i*th device

ZThink time

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Related Modules



CSE567M: Computer Systems Analysis (Spring 2013),

https://www.youtube.com/playlist?list=PLjGG94etKypJEKjNAa1n_1X0bWWNyZcof

CSE473S: Introduction to Computer Networks (Fall 2011),

https://www.youtube.com/playlist?list=PLjGG94etKypJWOSPMh8Azcgy5e_10TiDw





Wireless and Mobile Networking (Spring 2016),

https://www.youtube.com/playlist?list=PLjGG94etKypKeb0nzyN9tSs HCd5c4wXF

CSE571S: Network Security (Fall 2011),

https://www.youtube.com/playlist?list=PLjGG94etKypKvzfVtutHcPFJXumyyg93u





Video Podcasts of Prof. Raj Jain's Lectures,

https://www.youtube.com/channel/UCN4-5wzNP9-ruOzQMs-8NUw

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