



# Queueing Networks

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These slides and audio/video recordings are available on-line at:

<http://amplab.cs.berkeley.edu/courses/queue>

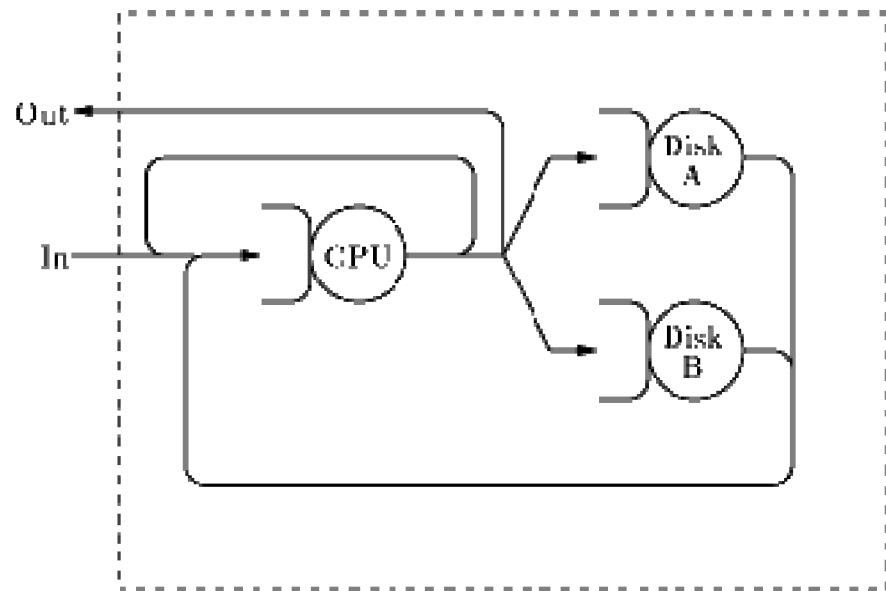
and <http://www.cse.wustl.edu/~jain/queue>



1. Open and Closed Queueing Networks
2. Product Form Networks
3. Queueing Network Models of Computer Systems

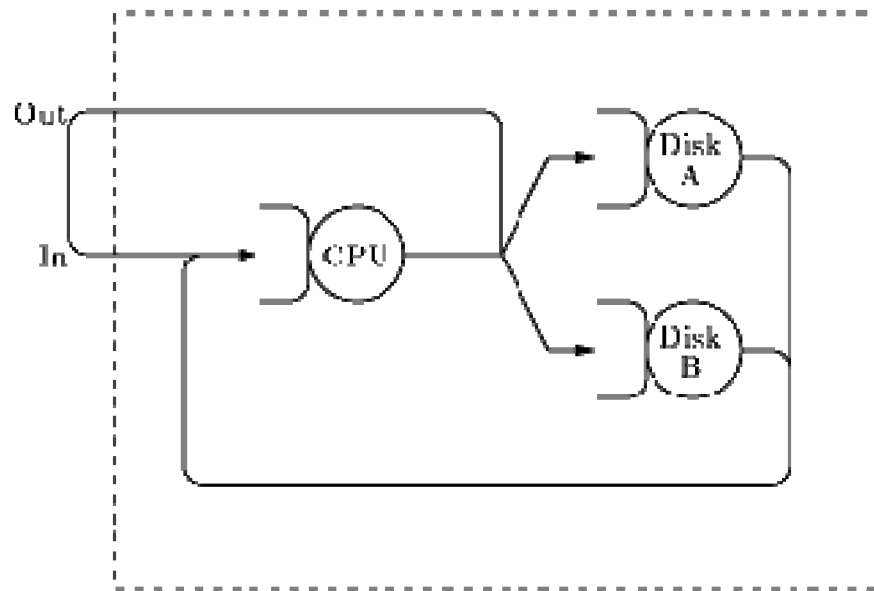
# Open Queueing Networks

- ❑ **Queueing Network:** model in which jobs departing from one queue arrive at another queue (or possibly the same queue)
- ❑ **Open queueing network:** external arrivals and departures
  - Number of jobs in the system varies with time.
  - Throughput = arrival rate
  - Goal: To characterize the distribution of number of jobs in the system.



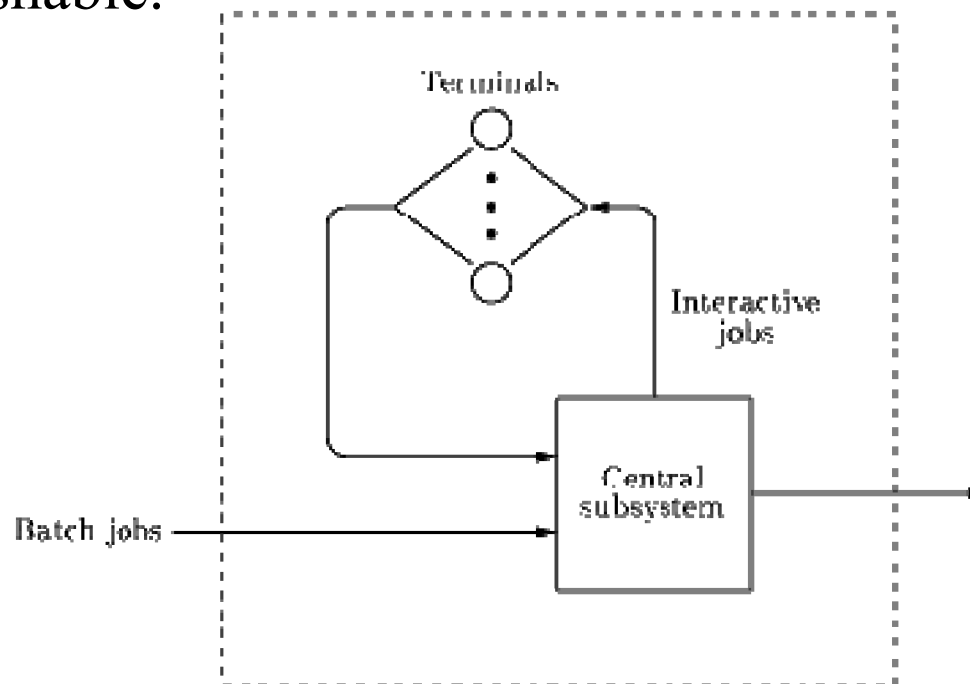
# Closed Queueing Networks

- ❑ Closed queueing network: No external arrivals or departures
  - Total number of jobs in the system is constant
  - 'OUT' is connected back to 'IN.'
  - Throughput = flow of jobs in the OUT-to-IN link
  - Number of jobs is given, determine the throughput

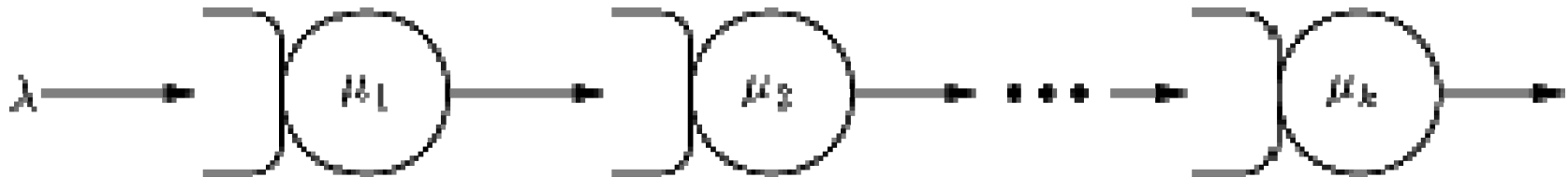


# Mixed Queueing Networks

- **Mixed queueing networks:** Open for some workloads and closed for others  $\Rightarrow$  Two classes of jobs. **Class** = types of jobs. All jobs of a single class have the same service demands and transition probabilities. Within each class, the jobs are indistinguishable.



# Series Networks



- ❑  $k$   $M/M/1$  queues in series
- ❑ Each individual queue can be analyzed independently of other queues
- ❑ Arrival rate =  $\lambda$ . If  $\mu_i$  is the service rate for  $i^{\text{th}}$  server:

Utilization of  $i^{\text{th}}$  server  $\rho_i = \lambda / \mu_i$

Probability of  $n_i$  jobs in the  $i^{\text{th}}$  queue =  $(1 - \rho_i) \rho_i^{n_i}$

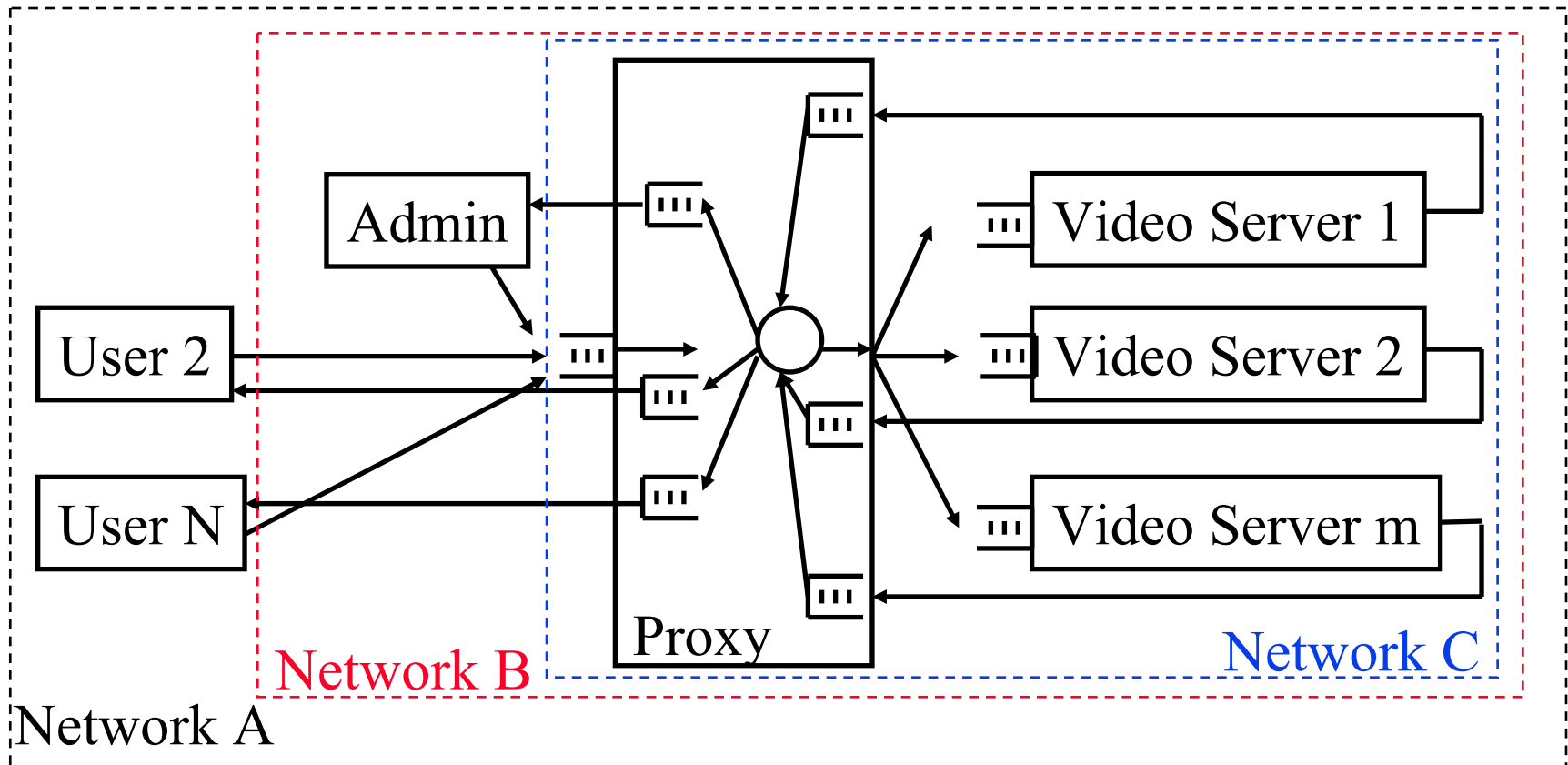
## Series Networks (Cont)

- Joint probability of queue lengths:

$$\begin{aligned} & P(n_1, n_2, n_3, \dots, n_M) \\ &= (1 - \rho_1)\rho_1^{n_1} (1 - \rho_2)\rho_2^{n_2} (1 - \rho_3)\rho_3^{n_3} \cdots (1 - \rho_M)\rho_M^{n_M} \\ &= p_1(n_1)p_2(n_2)p_3(n_3) \cdots p_M(n_M) \end{aligned}$$

⇒ product form network

# Quiz 32A



Identify open/closed/mixed networks:

- A. Network A is \_\_\_\_\_
- B. Network B is \_\_\_\_\_
- C. Network C is \_\_\_\_\_



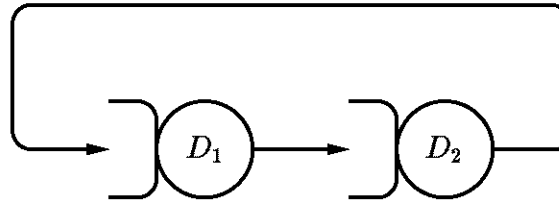
# Product-Form Network

- Any queueing network in which:

$$P(n_1, n_2, \dots, n_M) = \frac{1}{G(N)} \prod_{i=1}^M f_i(n_i)$$

- When  $f_i(n_i)$  is some function of the number of jobs at the  $i$ th facility,  $G(N)$  is a normalizing constant and is a function of the total number of jobs in the system.

## Example 32.1

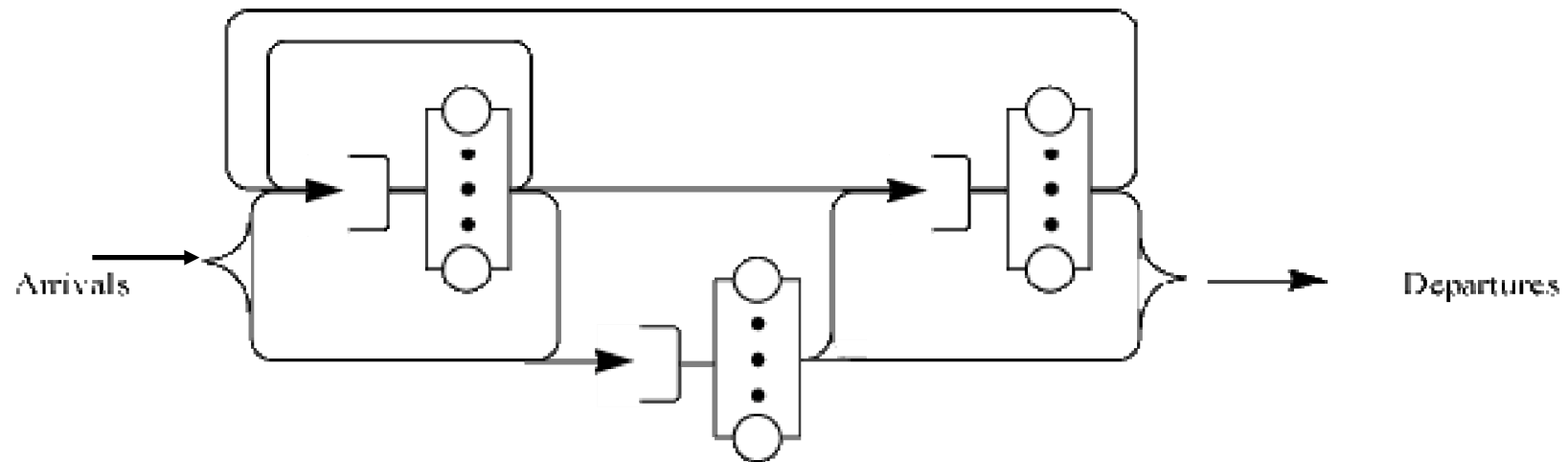


- Consider a closed system with two queues and  $N$  jobs circulating among the queues:
- Both servers have an exponentially distributed service time. The mean service times are 2 and 3, respectively. The probability of having  $n_1$  jobs in the first queue and  $n_2 = N - n_1$  jobs in the second queue can be shown to be:

$$P(n_1, n_2) = \frac{1}{3^{N+1} - 2^{N+1}} (2^{n_1} \times 3^{n_2})$$

- In this case, the normalizing constant  $G(N)$  is  $3^{N+1} - 2^{N+1}$ .
- The state probabilities are products of functions of the number of jobs in the queues. Thus, this is a ***product form network***.

# General Open Network of Queues



- ❑ Product form networks are easier to analyze
- ❑ Jackson (1963) showed that any arbitrary open network of  $m$ -server queues with exponentially distributed service times has a product form

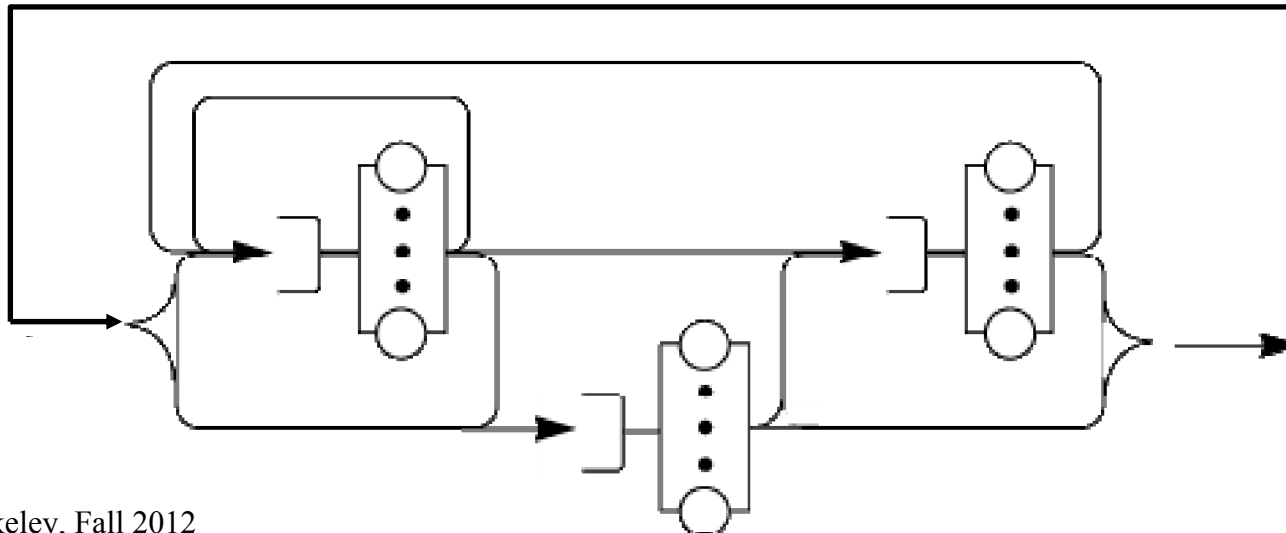
# General Open Network of Queues (Cont)

- If all queues are single-server queues, the queue length distribution is:

$$\begin{aligned} &P(n_1, n_2, n_3, \dots, n_M) \\ &= (1 - \rho_1)\rho_1^{n_1} (1 - \rho_2)\rho_2^{n_2} (1 - \rho_3)\rho_3^{n_3} \cdots (1 - \rho_M)\rho_M^{n_M} \\ &= p_1(n_1)p_2(n_2)p_3(n_3) \cdots p_M(n_M) \end{aligned}$$

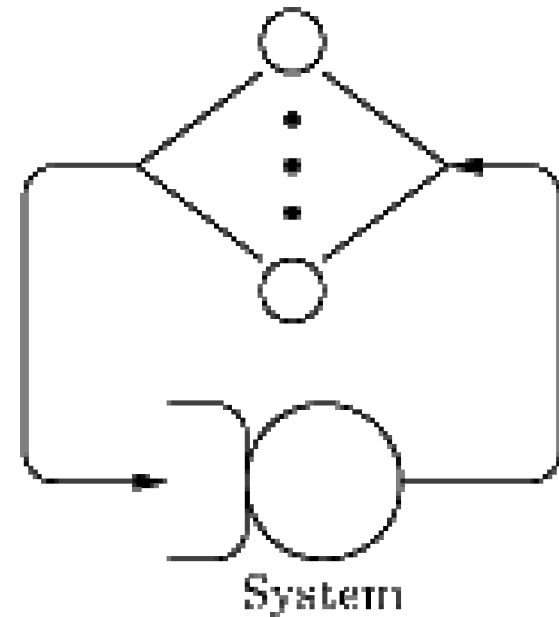
# Closed Product-Form Networks

- Gordon and Newell (1967) showed that any arbitrary closed networks of  $m$ -server queues with exponentially distributed service times also have a product form solution.
- Baskett, Chandy, Muntz, and Palacios (1975) and then Denning and Buzen (1978) showed that product form solutions exist for an even broader class of networks.
- Note: Internal flows are not Poisson.



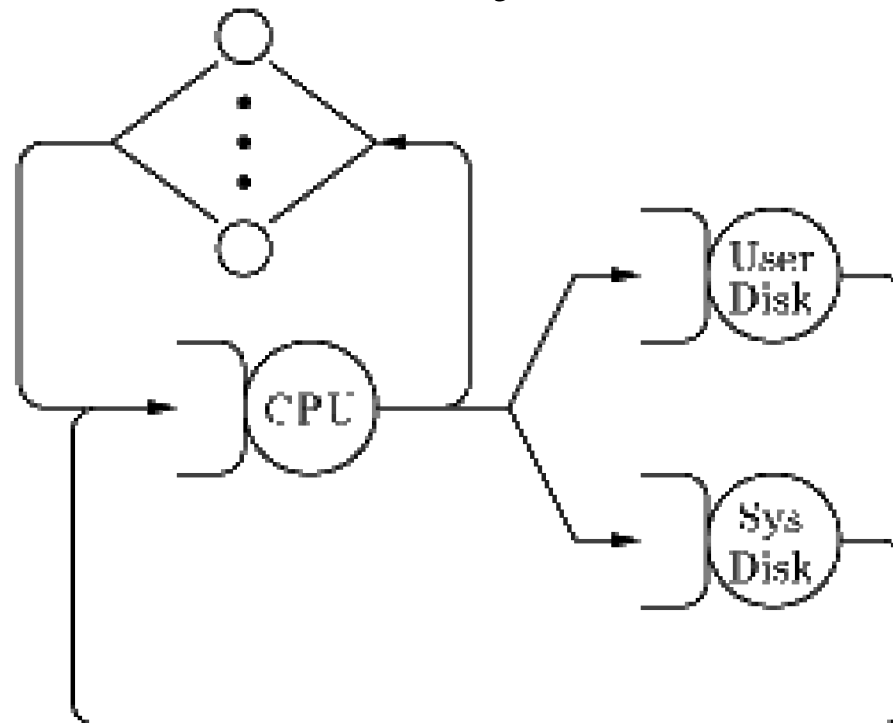
# Machine Repairman Model

- ❑ Originally for machine repair shops
- ❑ A number of working machines with a repair facility with one or more servers (repairmen).
- ❑ Whenever a machine breaks down, it is put in the queue for repair and serviced as soon as a repairman is available
- ❑ Scherr (1967) used this model to represent a timesharing system with  $n$  terminals.
- ❑ Users sitting at the terminals generate requests (jobs) that are serviced by the system which serves as a repairman.
- ❑ After a job is done, it waits at the user-terminal for a random "think-time" interval before cycling again.



# Central Server Model

- ❑ Introduced by Buzen (1973)
- ❑ The CPU is the "central server" that schedules visits to other devices
- ❑ After service at the I/O devices the jobs return to the CPU



# Types of Service Centers

Three kinds of devices

**1. Fixed-capacity service centers:** Service time does not depend upon the number of jobs in the device

For example, the CPU in a system may be modeled as a fixed-capacity service center.

**2. Delay centers or infinite server:** No queueing. Jobs spend the same amount of time in the device regardless of the number of jobs in it. A group of dedicated terminals is usually modeled as a delay center.

**3. Load-dependent service centers:** Service rates may depend upon the load or the number of jobs in the device., e.g.,  $M/M/m$  queue (with  $m \geq 2$  )

A group of parallel links between two nodes in a computer network is another example



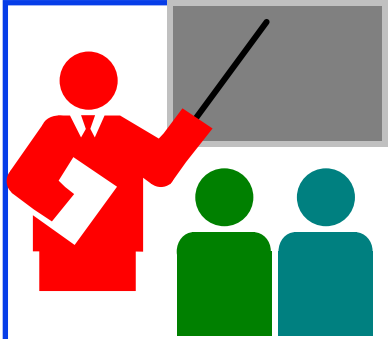
## Quiz 32B

- The probability function for jobs in a system with  $m$  queues is:

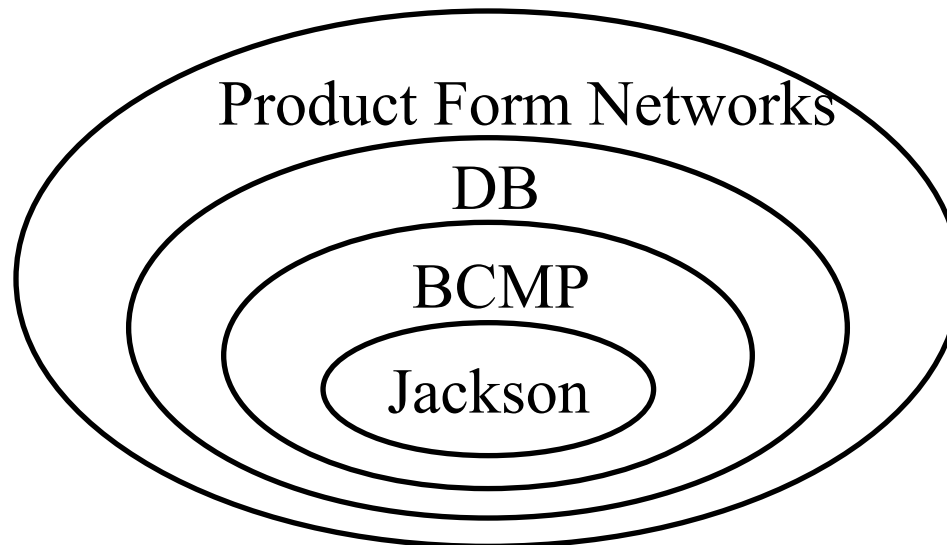
$$P(n_1, n_2, \dots, n_m) = \frac{g(n_1)g(n_2)g(n_{m-1})}{g(N - n_m)}$$

Is this a product form network? \_\_\_\_\_

- Identify the type of server:
  - A. Multi-core CPU: \_\_\_\_\_
  - B. Single-core CPU (No dynamic frequency scaling): \_\_\_\_\_
  - C. Single-core CPU (with dynamic frequency scaling): \_\_\_\_\_
  - D. Hard disk drives: \_\_\_\_\_
  - E. Solid state drives: \_\_\_\_\_
  - F. Multiple users each handling one window: \_\_\_\_\_
  - G. A user handling multiple windows: \_\_\_\_\_



# Summary



- ❑ Open, Closed, and Mixed queueing networks
- ❑ Product form networks: Any network in which the system state probability is a product of device state probabilities
- ❑ Jackson: Network of  $M/M/m$  queues.  
BCMP: More general conditions  
Denning and Buzen: Even more general conditions
- ❑ Service centers: Fixed capacity, delay centers, load dependent

# Homework 32

- Select a system in which jobs go to another queue after finishing service at one queue. Draw the queueing network model.
  - A. Show the possible paths the jobs follow.
  - B. Number of classes of jobs in the system?
  - C. Is the system open/closed/mixed?
  - D. Are the transition probabilities fixed for each class and at each server exit?