

ECE560: Computer Systems Performance Evaluation



Lecture #15:

Queueing Networks

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Administration Issues (4/1/2024)

- Homework #5 due **Today**
- Homework #6 assigned
 - Due **April 8, Monday**
- Project final report
 - Due: **April 19, Friday**
 - Refer to Report Guidelines
- Today's topics
 - Finish L#14 (Priority Q Systems)
 - Then L#15 (Q Networks)

Review of Queueing Systems

- Birth-and-death queueing systems (Lecture #11, 13)
 - Fit the birth-and-death process
 - M/M/ Queues: M/M/1, M/M/1/N, M/M/c, M/M/ ∞ , M/M/1/k/k
 - Solution: Balance equations
- Embedded Markov-chain queueing systems (Lecture #14)
 - More general arrival process or service times are allowed: M/G/1, M/D/1, GI/M/1
 - Solution
 - constructing an embedded Markov chain
 - And applying Z-transform and Laplace-Stieltjes transform methods
 - $\pi_n = p_n$ *iff* the arrival process is Poisson
 - π_n : from “an arriving customer” point of view
 - p_n : from “a random observer” point of view
- Priority queueing systems (Lecture #14)
 - Some customers get preferential treatment
 - M/G/1, M/M/c

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Topic

- Concepts and notations
- Product-form queueing networks

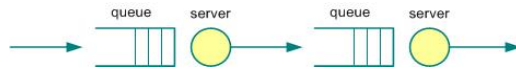
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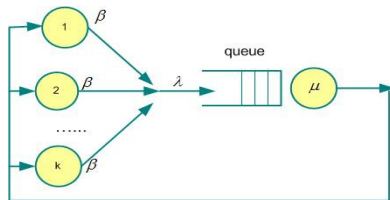
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Queueing Networks (QN)

- A QN is a collection of simple queueing systems interconnected by directed links



- In general, a model in which jobs departing from one queue arrive at another queue (possibly the same queue) is called a QN
 - $M/M/1/K/K$ is actually a QN



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Classification of QN

- In terms of whether or not the QN accepts customers from outside the system
 - Open QN,
 - Closed QN,
 - Mixed QN

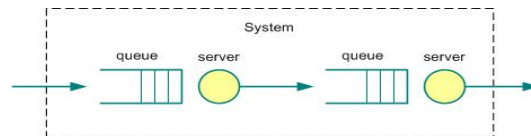
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Open QN

- Customers enter from outside the system, circulating among the service centers for service, and depart from the system
- Having external arrivals and departures



New customers enter and
Old customers eventually leave

- Number of customers/jobs in the system varies with time
- Usually assuming the throughput γ is known (to be equal to the arrival rate), the goal is to characterize the distribution of number of jobs in the system

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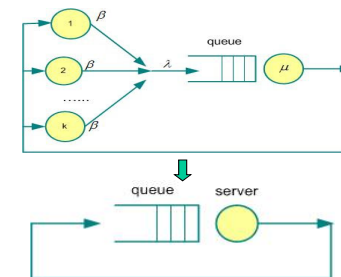
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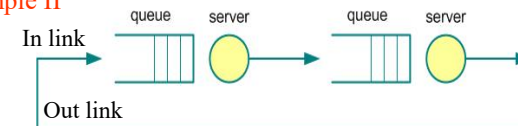
Closed QN

- A fixed number of customers circulate indefinitely among the service centers
- Having no external arrivals or departures

Example I:
M/M/1/k/k
(Machine repair model)



Example II



- Total number of customers/jobs in the system stays constant; a fixed number of customers contend for resources
- Usually assuming the number of jobs is given, the goal is to determine the throughput (i.e., the job completion rate)

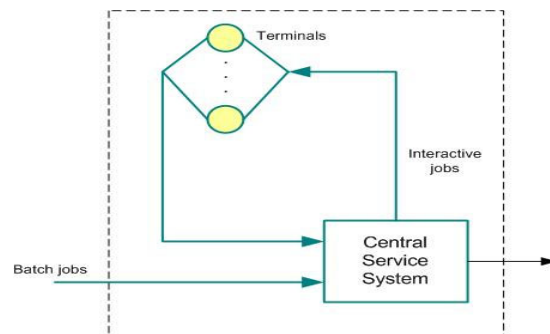
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Mixed QN

- **Open for some customers:** who enter from the outside the system and eventually leave
- **Closed for others:** who always remain inside the system



With more than one class/type of customers -- multi-class systems

Customers within a class are indistinguishable (have the same service demand)

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Notations

- **K:** the number of service centers in a QN
- **C:** number of customer classes
- **S_{ck} :** average service time per visit that the service center k provides for customers of class c
 - A customer may visit a service center several times to complete the service
- **V_{ck} :** average number of visits that a customer of class c makes to service center k
- Thus, the total service demand for customers of class c at service center k :

$$D_{ck} = V_{ck} * S_{ck}$$

- Thus, the total service demand at service center k :

$$D_k = \sum_c D_{ck}$$

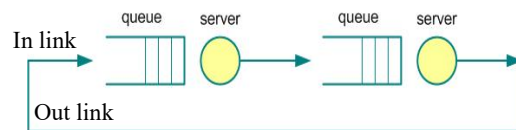
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Notations (Cont'd)

- γ : the average throughput of the system
(Recall: γ is the rate at which jobs successfully depart from the system)
 - For open QN
 - number of jobs leaving the system per unit time defines γ
 - For closed QN (no jobs actually leaves the system)
 - Traversing the outside link (the link connecting Out to In) is equivalent to leaving the system and immediately reentering it
 - γ is defined as the number of jobs traversing this link per unit time.



- γ_{ck} : the average throughput of class c at the service center k

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Forced Flow Law

- It's shown that:

$$\gamma = \frac{\gamma_{ck}}{V_{ck}}$$

- For a single-class system:

$$\gamma = \frac{\gamma_k}{V_k} \quad \text{or} \quad \gamma_k = \gamma V_k$$

- Called “the forced flow law”

- Showing that the throughput of any service center determines the throughput of all the others
- Relating the system throughput to individual device throughputs

- Example:

The measurements that a performance analyst made on his main batch processing systems show that the average number of visits each job makes to Drive 1 is 5; and that the disk throughput for Drive 1 is 10 requests per second. Find the system throughput γ .

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The Bottleneck

- Saturated device
 - a device (server) with a utilization of 100%
- A system is **saturated** when at least one of its servers or resources is saturated
- The bottleneck of the system
 - The first device (server) to saturate as the load on the system is increased
- Identification based on service demand $D_k, k=1, 2, \dots, K$:

The bottleneck is device j if

$$D_j = D_{\max} = \max\{D_1, \dots, D_K\}$$

The device with the highest service demand has the highest utilization and is the bottleneck device.

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The Bottleneck (Cont'd)

- The bottleneck is **workload dependent**
 - Different workloads may have different bottlenecks for the same computer systems
 - Scientific computing jobs tend to be CPU bound
 - Business-oriented jobs (E-mail, DBMS) tend to be I/O bound
 - The workload on computer systems usually varies during different period of the day, so do the bottleneck
 - Most interested in the bottleneck during the peak period of the day

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The Bottleneck (Cont'd)

- Example

A performance analyst measures a small batch processing computer system. He finds that the CPU (numbered by 1) has a visit ratio of 20 (i.e., $V_1=20$) with $S_1=0.05$ sec, the first I/O device has $V_2=11$ with $S_2=0.08$ sec, while the second I/O device has $V_3=8$ with $S_3=0.04$ sec. What is the bottleneck of the system, CPU, or the first I/O device or the second I/O?

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Topic

- ✓ Concepts and notations
- **Product-form queueing networks**
 - Concept
 - Case studies
 - Properties

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Product-Form QN

- In general, any QN in which the expression for joint equilibrium (steady-state) probability has the form of

$$\pi(n_1, n_2, \dots, n_K) = \frac{1}{G(N)} \prod_{i=1}^K f_i(n_i)$$

- $\pi(n_1, n_2, \dots, n_K)$: probability of n_1 customers in center 1, n_2 customers in center 2, ..., n_K customers in center K .
- K : total number of nodes in the QN
- n_i : number of customers at the i th service facility
- $f_i(n_i)$: some function of n_i
- N : total number of jobs in the system
- $G(N)$: a normalizing constant
- Also called **separable QN**

We focus on Product-Form QN!

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Case Studies

- Two open product-form QN
 - A series of K M/M/1 queues
 - Jackson QN
- A closed 3-stage product-form QN

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Case Study I: Open PF-QN

- Consider a series of K M/M/1 queues



- Jobs leaving a queue immediately join the next queue
- Each individual queue in the series can be analyzed independently
 - Arrival rate: λ
 - Service rate of the i -th server: μ_i
 - Thus,

utilization of the i -th server

$$\rho_i = \frac{\lambda}{\mu_i}$$

probability of n_i jobs in the i -th queue system
(including queue and server):

$$\pi_i(n_i) = (1 - \rho_i) \rho_i^{n_i}$$

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Case Study I (Cont'd)

- The joint probability of K queues
 $\pi(n_1, n_2, \dots, n_K)$:

$$\begin{aligned} \pi(n_1, n_2, \dots, n_K) \\ &= (1 - \rho_1) \rho_1^{n_1} \times (1 - \rho_2) \rho_2^{n_2} \times \dots \times (1 - \rho_K) \rho_K^{n_K} \\ &= \pi_1(n_1) \pi_2(n_2) \dots \pi_K(n_K) \end{aligned}$$

It is a product-form QN.

$$\pi(n_1, n_2, \dots, n_K) = \frac{1}{G(N)} \prod_{i=1}^K f_i(n_i)$$

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Case Studies (Agenda)

- Two open product-form QN
 - ✓ A series of K M/M/1 queues
 - **Jackson QN**
 - Jackson theorem and application
 - 3-step Jackson algorithm
 - An example
- A closed 3-stage product-form QN

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Case Study II: Jackson QN

- A Jackson QN contains K nodes satisfying 3 properties:
 - Each node k consists of c_k identical exponential servers, each with service rate μ_k
 - Customers arriving at node k from outside the system arrive in a Poisson pattern with average arrival rate λ_k . Customers also arrive at node k from other nodes within the QN.
 - Once served at node k , a customer immediately goes to node j ($j=1, \dots, K$) with probability p_{kj} ; or leaves the QN with probability

$$1 - \sum_{j=1}^K p_{kj}$$

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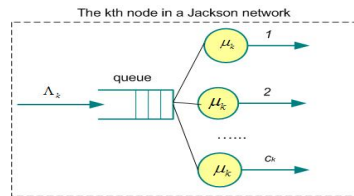
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Jackson's Theorem 6.2.1

- The average arrival rate to each node k :

$$\Lambda_k = \lambda_k + \sum_{j=1}^K \Lambda_j p_{jk}$$

- Each node k behaves like an independent M/M/ c_k queueing system with the average arrival rate Λ_k and average service rate μ_k for each of the c_k servers



- The steady state probability that there are n_k customers in the k -th node for $k=1,2,\dots,K$:

$$\pi(n_1, n_2, \dots, n_K) = \pi_1(n_1) \pi_2(n_2) \dots \pi_K(n_K)$$

given

$$\Lambda_k < c_k \mu_k$$

- $\pi_k(n_k)$ is the steady-state probability that there are n_k customers in the k -th node if treated as an M/M/ c_k with Λ_k and μ_k for each of the c_k servers

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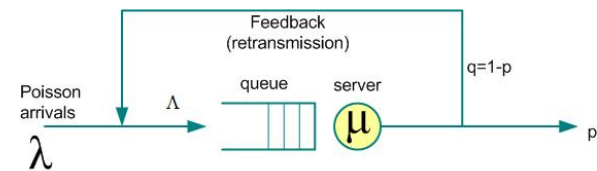
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Jackson QN (Cont'd)

- The QN in the case study I is a Jackson QN

- Application – M/M/1 queue with feedback

A message switching center represented by a M/M/1 queue transmits the message to the required destination. Assume the service (time to transmit a message and receive an ack of correct receipt) is exponential. Assume an error detecting code is used. The probability that a msg is received correctly is p ; with probability $q=1-p$ the msg must be retransmitted. Find ρ , L , W .



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Note on Jackson Networks

- There is only one job class in the network
- The overall number of jobs in the network is unlimited
- Each of the K nodes in the network can have arrivals from outside (λ_k)
- A job can leave the network from any node
- All service times and inter-arrival times are exponentially distributed
- The service discipline at all nodes is FCFS.

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Case Studies (Agenda)

- Two open product-form QN
 - ✓ A series of K M/M/1 queues
 - ✓ Jackson QN
 - ✓ Jackson theorem and application
 - 3-step Jackson algorithm
 - An example
- A closed 3-stage product-form QN

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Jackson Networks Algorithm

- Based on Jackson Theorem

- **Step 1:** For all nodes, $i=1,\dots,K$, compute the average arrival rates Λ_i of the network by solving the **traffic equations**:

$$\Lambda_k = \lambda_k + \sum_{j=1}^K \Lambda_j p_{jk}$$

- **Step 2:** Consider each node as an $M/M/c_k$ queueing system. Check the stability (if $\rho_k < 1$), and compute the marginal state probabilities $\pi_k(n_k)$, and performance measures (L, W, L_q, W_q) of each node using the formulae for $M/M/c_k$ systems
- **Step 3:** Computer the (joint) steady-state probabilities of the overall queueing network.

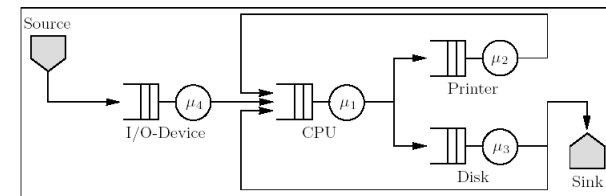
$$\pi(n_1, n_2, \dots, n_K) = \pi_1(n_1) \pi_2(n_2) \dots \pi_K(n_K)$$

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Hands-on Problem



- Number of nodes $K=4$
- Service times exponentially distributed with:
 $1/\mu_1 = 0.04, 1/\mu_2 = 0.03, 1/\mu_3 = 0.06, 1/\mu_4 = 0.05$
- Inter-arrival times exponentially distributed with $\lambda_4 = 4$ jobs/sec
- Scheduling discipline: FCFS
- Transition probabilities (0 – source/sink):

$$p_{12} = p_{13} = 0.5, \quad p_{41} = p_{21} = 1, \quad p_{31} = 0.6, \quad p_{30} = 0.4$$

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Hands-on Problem (Cont'd)

- Find the arrival rates to each node?
- Find the following performance measures:
 - Utilization of each node (1-4)
 - Mean number of jobs in each node
 - Mean response times of each node
 - Mean overall response time
 - Mean waiting time in the queue of each node
 - Mean queue length for each node
 - Marginal steady-state probabilities: for example, find $\pi_1(3)$, $\pi_2(2)$, $\pi_3(4)$, $\pi_4(1)$?
- Find the steady-state joint probabilities, for example, $\pi(3,2,4,1)$?

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Reference

- Performance measures of the M/M/1 queue

$$\alpha = \rho = \lambda / \mu$$

$$\pi_0 = 1 - \frac{\lambda}{\mu} = 1 - \rho, \quad \pi_n = \left(\frac{\lambda}{\mu}\right)^n \pi_0 = \rho^n (1 - \rho)$$

$$\begin{aligned} \gamma &= \mu P[> 0 \text{ jobs in the system}] \\ &= \mu(1 - P[0 \text{ jobs in the system}]) \\ &= \mu(1 - \pi_0) = \mu(1 - (1 - \rho)) = \mu\rho = \lambda \end{aligned}$$

$$\begin{aligned} L &= \sum_{n=0}^{\infty} n \pi_n = (1 - \rho) \sum_{n=0}^{\infty} n \rho^n \\ &= (1 - \rho) \rho \sum_{n=1}^{\infty} n \rho^{n-1} = \frac{(1 - \rho)\rho}{(1 - \rho)^2} = \frac{\rho}{1 - \rho} \end{aligned}$$

$$W = L / \lambda = \frac{\rho}{1 - \rho} / \lambda = \frac{1}{\mu - \lambda}$$

$$\begin{aligned} L_q &= L - (1 * P[\text{Server is not empty}]) \\ &= L - (1 - P[0 \text{ jobs in the system}]) \\ &= L - (1 - \pi_0) = L - (1 - (1 - \rho)) \end{aligned}$$

$$= L - \rho = \frac{\rho}{1 - \rho} - \rho = \frac{\rho^2}{1 - \rho}$$

$$W_q = L_q / \lambda = \frac{\rho^2}{1 - \rho} \frac{1}{\lambda} \quad \text{or} \quad W_q = W - W_s = \frac{\rho}{(1 - \rho)\lambda} - \frac{1}{\mu} = \frac{\rho^2}{1 - \rho} \frac{1}{\lambda}$$

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Case Studies (Agenda)

- Two open product-form QN
 - ✓ A series of K M/M/1 queues
 - ✓ Jackson QN
 - Jackson theorem and application
 - 3-step Jackson algorithm
 - A computer system example

$$\Lambda_k = \lambda_k + \sum_{j=1}^K \Lambda_j p_{jk}$$

$\pi_k(n_k)$, and performance measures
(L, W, L_q, W_q) of each node

$$\pi(n_1, n_2, \dots, n_K) = \pi_1(n_1) \pi_2(n_2) \dots \pi_K(n_K)$$

- A closed 3-stage product-form QN

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Review

- Closed QN
 - Having no external arrivals or departures
 - A fixed number of customers circulate indefinitely among the service centers
 - Total number of customers/jobs in the system stays constant; a fixed number of customers contend for resources

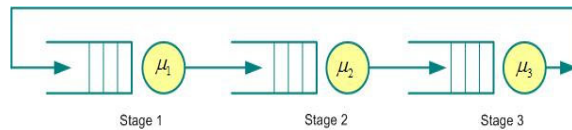
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Case Study III: An Example Closed PF-QN

- Consider a closed 3-stage QN



- There are two customers
- Jobs leaving a queue immediately join the next queue
- Each queue in the network has exponential service time with a mean of $1/\mu_i$ ($i=1,2,3$)
- Can be described as a Markov process with each state described as the triplet

$$S = \{n_1, n_2, n_3\} \text{ where } \sum_{i=1}^3 n_i = 2$$

- n_i : number of customers in the queue system i
- The state transition diagram (extra note)
- The steady-state solution:
 - Balance equations
 - Sum of all state probabilities equal 1

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Closed PF-QN (Cont'd)

- Balance equations:

State	Rate out=Rate in
1: (2,0,0)	$\pi(2,0,0)\mu_1 = \pi(1,0,1)\mu_3$
2: (1,1,0)	$\pi(1,1,0)(\mu_1 + \mu_2) = \pi(2,0,0)\mu_1 + \pi(0,1,1)\mu_3$
3: (1,0,1)	$\pi(1,0,1)(\mu_1 + \mu_3) = \pi(1,1,0)\mu_2 + \pi(0,0,2)\mu_3$
4: (0,2,0)	$\pi(0,2,0)\mu_2 = \pi(1,1,0)\mu_1$
5: (0,1,1)	$\pi(0,1,1)(\mu_2 + \mu_3) = \pi(0,2,0)\mu_2 + \pi(1,0,1)\mu_1$
6: (0,0,2)	$\pi(0,0,2)\mu_3 = \pi(0,1,1)\mu_2$

- The sum of all state probabilities equal 1

$$\sum_{i=1}^6 \pi(S_i) = 1$$

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Closed PF-QN (Cont'd)

- Steady-state solution has the form of

$$\pi(n_1, n_2, n_3) = G(1/\mu_1)^{n_1}(1/\mu_2)^{n_2}(1/\mu_3)^{n_3}$$

- G : a normalization constant to ensure all probabilities sum to 1

$$G = \frac{1}{\sum_{i=0}^2 \sum_{j=0}^2 \sum_{k=0}^2 \pi(i, j, k)}$$

- Expected # of customers in each stage:

$$L_i = E[N_i] = \sum_{j=0}^2 jP[N_i = j]$$

$$\text{Marginal probability: } P[N_1 = j] = \sum_m \sum_k \pi(j, k, m)$$

- Expected time spent in each stage:

$$\begin{aligned}\lambda_1 &= \mu_3 \Pr\{\text{server 3 is busy}\} = \mu_3(1 - P[N_3 = 0]) \\ \lambda_2 &= \mu_1 \Pr\{\text{server 1 is busy}\} = \mu_1(1 - P[N_1 = 0]) \\ \lambda_3 &= \mu_2 \Pr\{\text{server 2 is busy}\} = \mu_2(1 - P[N_2 = 0]) \\ W_i &= L_i / \lambda_i\end{aligned}$$

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Agenda

- ✓ Concepts and notations
- ✓ Product-form queueing networks
 - ✓ Concept
 - ✓ Case studies
 - ✓ Open PF-QN
 - ✓ Closed PF-QN
 - **Important properties of product-form QN**
 - Local balance
 - M → M property

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PF-QN Property (1)

- Global balance vs. Local balance

- The equations: (rate in=rate out)

$$\forall i \in S : \sum_{j \in S} \pi_j q_{ji} = \pi_i \sum_{j \in S} q_{ij}$$

with the normalizing condition: $\sum_{i \in S} \pi_i = 1$
are called the

“Global Balance Equations”

- Global balance:

The transition rate out of a state of a QN =
transition rate into this state of the QN

- For so-called product-form QN exists
also a *local balance*:

The transition rate out of a state of a QN
due to a departure from node i = transition
rate into this state of this QN due to an
arrival to node i .

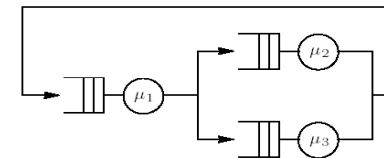
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Example

- Consider a closed QN with 3 nodes



- Number of customers $m=2$
- Service time exponentially distributed with:

$$\mu_1 = 4/\text{sec}, \mu_2 = 1/\text{sec} \text{ und } \mu_3 = 2/\text{sec}$$

- Scheduling discipline: FCFS
- Transition probabilities:

$$p_{12} = 0.4, p_{13} = 0.6, p_{21} = p_{31} = 1$$

- State space of the MC:

$$\{(2, 0, 0), (0, 2, 0), (0, 0, 2), (1, 1, 0), (1, 0, 1), (0, 1, 1)\}$$

where, state $S=(n_1, n_2, n_3)$: n_1 jobs in node 1, n_2 jobs
in node 2 and n_3 jobs in node 3

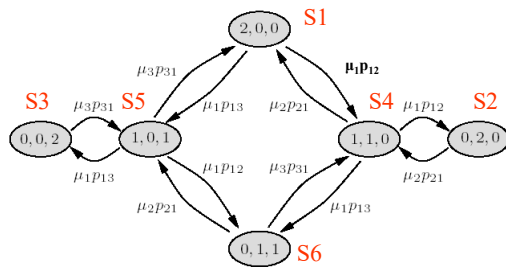
Find the steady-state probabilities $\pi(n_1, n_2, n_3)$

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State Transition Diagram



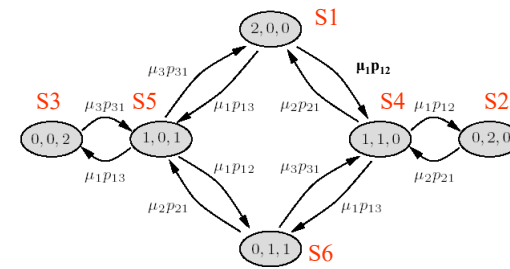
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Global Balance Equations

- State transition diagram



Rate Out = Rate In

- (1) $\pi(2,0,0)(\mu_1 p_{12} + \mu_1 p_{13}) = \pi(1,0,1)\mu_3 p_{31} + \pi(1,1,0)\mu_2 p_{21}$,
- (2) $\pi(0,2,0)\mu_2 p_{21} = \pi(1,1,0)\mu_1 p_{12}$,
- (3) $\pi(0,0,2)\mu_3 p_{31} = \pi(1,0,1)\mu_1 p_{13}$,
- (4) $\pi(1,1,0)(\mu_2 p_{21} + \mu_1 p_{13} + \mu_1 p_{12}) = \pi(0,2,0)\mu_2 p_{21} + \pi(2,0,0)\mu_1 p_{12} + \pi(0,1,1)\mu_3 p_{31}$,
- (5) $\pi(1,0,1)(\mu_3 p_{31} + \mu_1 p_{12} + \mu_1 p_{13}) = \pi(0,0,2)\mu_3 p_{31} + \pi(0,1,1)\mu_2 p_{21} + \pi(2,0,0)\mu_1 p_{13}$,
- (6) $\pi(0,1,1)(\mu_3 p_{31} + \mu_2 p_{21}) = \pi(1,1,0)\mu_1 p_{13} + \pi(1,0,1)\mu_1 p_{12}$.

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Local Balance Equations

- State (1,1,0)
 - Node 2: transition rate out of state (1,1,0) due to a departure from node 2 = transition rate into this state due to an arrival to node 2.

$$(4') \quad \pi(1, 1, 0) \cdot \mu_2 \cdot p_{21} = \pi(2, 0, 0) \cdot \mu_1 \cdot p_{12}$$
 - Node 1

$$(4'') \quad \pi(1, 1, 0) \cdot \mu_1 \cdot (p_{13} + p_{12}) = \pi(0, 1, 1) \cdot \mu_3 \cdot p_{31} + \pi(0, 2, 0) \cdot \mu_2 \cdot p_{21}$$
 - By adding these local balance equations, (4') and (4''), we get the global balance equation (4) for state (1,1,0).
- The equations (1), (2), (3) are already local balance equations!
 - State (2,0,0), node 1 \rightarrow Eq. (1)
 - State (0,2,0), node 2 \rightarrow Eq. (2)
 - State (0,0,2), node 3 \rightarrow Eq. (3)

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Local Balance Equations (Cont'd)

- The equations (5) and (6) can be split to local balance equations similar to equation (4)

$$(5') \quad \pi(1, 0, 1) \mu_1 (p_{12} + p_{13}) = \pi(0, 1, 1) \mu_2 p_{21} + \pi(0, 0, 2) \mu_3 p_{31},$$

$$(5'') \quad \pi(1, 0, 1) \mu_3 p_{31} = \pi(2, 0, 0) \mu_1 p_{13},$$

$$(6') \quad \pi(0, 1, 1) \mu_2 p_{21} = \pi(1, 0, 1) \mu_1 p_{12},$$

$$(6'') \quad \pi(0, 1, 1) \mu_3 p_{31} = \pi(1, 1, 0) \mu_1 p_{13},$$

$$(5') + (5'') = (5) \text{ und } (6') + (6'') = (6)$$

- (5'): state (1,0,1), node 1
- (5''): state (1,0,1), node 3
- (6'): state (0,1,1), node 2
- (6''): state (0,1,1), node 3

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Solution

- Steady state probabilities

$$\begin{aligned}\pi(1, 0, 1) &= \pi(2, 0, 0) \frac{\mu_1}{\mu_3} p_{13}, & \pi(1, 1, 0) &= \pi(2, 0, 0) \frac{\mu_1}{\mu_2} p_{12}, \\ \pi(0, 0, 2) &= \pi(2, 0, 0) \left(\frac{\mu_1}{\mu_3} p_{13} \right)^2, & \pi(0, 2, 0) &= \pi(2, 0, 0) \left(\frac{\mu_1}{\mu_2} p_{12} \right)^2, \\ \pi(0, 1, 1) &= \pi(2, 0, 0) \frac{\mu_1^2}{\mu_2 \mu_3} p_{12} p_{13}.\end{aligned}$$

- Normalizing condition leads to

$$\pi(2, 0, 0) = \left[1 + \mu_1 \left(\frac{p_{13}}{\mu_3} + \frac{p_{12}}{\mu_2} + \frac{\mu_1 p_{13}^2}{\mu_3^2} + \frac{\mu_1 p_{12}^2}{\mu_2^2} + \frac{\mu_1 p_{12} p_{13}}{\mu_2 \mu_3} \right) \right]^{-1}$$

- Resulted steady-state probabilities:

$$\begin{aligned}\pi(2, 0, 0) &= \underline{0.103}, & \pi(0, 0, 2) &= \underline{0.148}, & \pi(1, 0, 1) &= \underline{0.123}, \\ \pi(0, 2, 0) &= \underline{0.263}, & \pi(1, 1, 0) &= \underline{0.165}, & \pi(0, 1, 1) &= \underline{0.198}.\end{aligned}$$

- From these joint steady-state probabilities, the marginal probabilities and performance measures (L_i , W_i) can be calculated

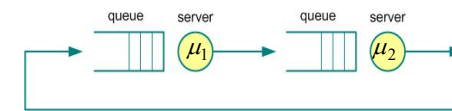
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Hands-On Problem

- Consider a closed QN with 2 nodes



- Number of customers $N=2$
- Service time exponentially distributed with:

$$\mu_1 = 4/\text{sec} \quad \mu_2 = 3/\text{sec}$$

- Scheduling discipline: FCFS
- Transition probabilities:

$$p_{12} = 1 \quad p_{21} = 1$$

- Draw the state transition diagram for this system
- Find the global balance equations for each state
- Find the local balance equations for each state
- Find the joint steady-state probabilities for all states
- Find the mean number of customers in each stage/node
- Find the average time a customer spent in each stage/node

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Note!

- The local balance equations can be solved much easier than the global balance equations
 - The rate at which jobs enter a single node of the QN is equal to the rate at which they leaves it
 - Thus, local balance is concerned with a local situation and reduces the computational effort.
- The solution is still very complex for greater QN.

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Product Form and Local Balance

- Local balance yields a solution with the product-form property.

$$\pi(n_1, n_2, \dots, n_K) = \frac{1}{G} \prod_{i=1}^K \pi_i(n_i)$$

- The steady-state probability for the state (n_1, n_2, \dots, n_K) is the product of the marginal probabilities $\pi_i(n_i)$ for the single nodes
- The normalizing constant G can be obtained from the normalizing condition (sum of all steady-state probabilities equals 1)
- For QN with product-form solution, the local balance property holds.

A necessary and sufficient condition for the existence of product form solutions is given in the local-balance property.

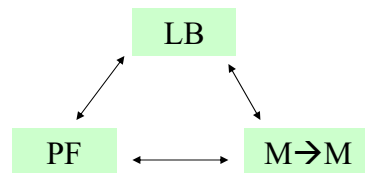
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PF-QN Property (2)

- $M \rightarrow M$ property (Markov implies Markov)
 - A node (service center) has the $M \rightarrow M$ property *iff* the node transforms a Poisson arrival process into a Poisson departure process.
- Muntz has shown that a QN has a product form solution if all nodes of the network have the $M \rightarrow M$ property.
- If a node satisfies local balance, it must have $M \rightarrow M$ property



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Next Topics

- Petri Nets Modeling

Things to Do

- Homework
- Class project

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