

Packet Arrival Rate

Related terms:

[Active Queue Management](#), [Congestion Control](#), [Average Packet Size](#), [Congestion Level](#)

[View all Topics](#)

Stream Sessions: Stochastic Analysis

Anurag Kumar, ... Joy Kuri, in [Communication Networking](#), 2004

5.5.2 Invariance of Mean System Time

In spite of its simplicity, Little's theorem can be a powerful analytical tool. We now demonstrate its use for establishing a basic result for a class of multiplexing problems. It will be useful to review the material in Section 4.1.1.

Packets enter the multiplexer at arrival instants ak , $k \geq 1$; the packet arriving at ak has the length Lk . The packet arrival rate is λ (packets per second). We make the following assumptions about the system:

- The packet lengths (Lk , $k \geq 1$) are independently and identically distributed, with some distribution $L(l)$; that is, $\Pr(\text{packet length} \leq l) = L(l)$.
- After the completion of the transmission of a packet, the scheduler chooses the next packet for transmission without any regard to the service times of the waiting packets. Thus, for example, a scheduling policy that transmits shorter packets first is not under consideration in this discussion.
- When the transmission of a packet is initiated, the link is dedicated to the packet and the packet is transmitted completely.

The second and third assumptions ensure that when the link completes the transmission of a packet and the scheduler looks for a new packet to transmit, the service times of the waiting packets are as if they were “freshly” sampled (in an independent and identically distributed (i.i.d.) fashion) from the distribution $L(l)$.

Let $NFCFS(t)$, $t \geq 0$, denote the number of packets in the system when the scheduling policy is FCFS. $NFCFS(t)$ is a random process; observe that it is completely determined by the random sequences a_k and L_k . Let P denote another policy that satisfies the preceding assumptions, and let $NP(t)$ denote the corresponding packet queue length process. Let us now modify the system under policy P in the following way. The packet arrival instants are unchanged, but the k th packet *to be transmitted* is assigned the length L_k *when it is scheduled for transmission*. Note that for a non-FIFO policy the k th packet to be transmitted need not be the k th packet to arrive. Denote the multiplexer queue length (for this alternative way of sampling packet lengths) by $\tilde{NP}(t)$. Because of the assumptions about the policies, a little thought shows that $NP(t)$ and $\tilde{NP}(t)$ are statistically indistinguishable; a probability question about either of these processes yields the same answer. By the preceding construction, it can also be easily seen that $\tilde{NP}(t) = NFCFS(t)$ for all t . Further assume that with the scheduling policies under consideration, the system is “stable” (formally discussed later in this chapter; see Section 5.6.2), and hence the following time averages exist with probability 1: $NFCFS = \tilde{NP} = NP$, $WFCFS$ and WP . By Little’s theorem we have

[illegible]

distribution of packet lengths in a real packet-switched network. Figure 9.1 shows the packet length distributions from the packet traces collected at NASA Ames Internet Exchange (AIX) over one week in May 1999 and is representative of the packet length distribution seen on the Internet. We see from the figure that whereas nearly 50% of the bytes are from 1500-byte packets (read the dashed curve), nearly 50% of the packets are small, 40-byte packets (read the solid curve). This means that although small packets do not contribute much to the utilization, they consume significant packet processing power. The packet-processing rate of a switch must be dimensioned with this in view.

distribution of packet lengths in a real packet-switched network. Figure 9.1 shows the packet length distributions from the packet traces collected at NASA Ames Internet Exchange (AIX) over one week in May 1999 and is representative of the packet length distribution seen on the Internet. We see from the figure that whereas nearly 50% of the bytes are from 1500-byte packets (read the dashed curve), nearly 50% of the packets are small, 40-byte packets (read the solid curve). This means that although small packets do not contribute much to the utilization, they consume significant packet processing power. The packet-processing rate of a switch must be dimensioned with this in view.

Figure 9.1. Example of cumulative packet length distribution collected at the NASA Ames Internet Exchange. Adapted from http://www.caida.org/analysis/AIX/plen_hist/asis/AIX/plen03_Aug2003.html. The dashed plot is the fraction of packets with length less than x bytes, and the solid plot is the fraction of bytes in packets with size less than x bytes.

Exercise 9.1

Exercise 9.1

Derive the solid plot from the dashed plot in Figure 9.1. Investigate the function of the packet length, of bytes, formed by packets of a given size. Observe the size bias (the Section 10.4) that occurs: If a random packet is observed, it is observed more likely that it is longer than a shorter packet.

Figure 9.2 summarizes the discussion of the Chapter 2 packet switch. To keep the discussion general, also draw a QoS capable switch that can provide delay and loss to the packets with the packets. We will discuss the performance

and design issues associated with each of the blocks shown in Figure 9.2. The receiving and transmission of bits and the extraction of packets are what can be called “physical layer functions,” and we do not discuss these functions in this book.

and design issues associated with each of the blocks shown in Figure 9.2. The receiving and transmission of bits and the extraction of packets are what can be called “physical layer functions,” and we do not discuss these functions in this book.

Figure 9.2. Block diagram of a packet switch.

Packet header processing typically has two main functions: *route lookup*, which determines the output link for the packet, and *packet classification*, which determines the specific service that is to be provided to the packet. Packet classification may be based on source or destination addresses of the packet, the application that generated it, that generated it, network address, or other information. In high-speed networks, route lookup and packet classification are typically done with very high probability, can be completed with small delay, and constant delay.

In Internet-like data networks, route lookup and packet classification are more complex, and the time taken to perform these tasks is possibly even exceeding packet interarrival times. We discuss the design and performance of route lookups in Chapter 10. The point is that the variability in processing time can cause a packet to wait a long time before it is processed, and a packet will experience variable delay before its destination is determined. Also, because the buffer space available for packets is finite, some packets may be lost. In providing delay and loss guarantees to the packet, it is imperative that the header processing be completed with a delay that is a small fraction of the packet arrival of the packet. Otherwise the switch will drop packets with delay guarantees and not even know it! The variability of packet header processing time at the input becomes an important performance issue.

After the output link and the service category for the packet have been determined, the packet must be switched to the output link. There are three issues associated with the switching of packets to the output of a packet queue, scheduling of packets to the output queue, and the design of the fabric itself. After the scheduling of packets to the output queue, contention occurs when two or more packets arrive at input links different from what to leave from the same output link at the same time. If the packets are not scheduled, a packet may arrive for an output link while a packet is already in progress on that output. With time-slotted links, two packets may arrive from different inputs and may want to be output on the same link at the same time. All outgoing packets must be queued, and a packet queue is needed for each output link. This necessitates queuing packets at the input of the packet switch, then the switching capacity should be large enough to handle the input delay in the input is minimized. The queuing delay and the loss probability in the input or the output queue are

important performance measures for the switch and are a function of the switching capacity, the packet buffer sizes, and the packet arrival process. If packets are queued at the input to the switching fabric, then a scheduler must be used to decide when to offer a packet to the switch fabric.

important performance measures for the switch and are a function of the switching capacity, the packet buffer sizes, and the packet arrival process. If packets are queued at the input to the switching fabric, then a scheduler must be used to decide when to offer a packet to the switch fabric.

Now consider the design of the switch fabric. The switch fabric may or may not be able to switch packets without queuing. Consider an $N \times N$ switch, with $d = [d_1, \dots, d_N]$ representing the destinations of the packets at the N inputs. In a non-blocking switch, if the d_i is any permutation of $[1, \dots, N]$, then the packets can be switched to their destinations. If the switch is blocking, the blocking probability must be evaluated.

Remark: We have seen in Chapter 4 and in Chapter 5 that QoS for stream sessions can be guaranteed by appropriate packet scheduling. Thus, if a switch were to provide QoS to the packets in terms of delays, then the packets should have a delay that is less than a constant (or with a tightly upper-bounded delay) after its arrival at the switch. Alternatively, we could say that the packet should be available for transmission on the output link with an approximately constant delay. This is the primary design goal for packet switch design.

The control plane functions in a packet switch are the functions that manage the switch and include functions such as configuring the switch, monitoring the network state (e.g., network topology, network congestion), and exchanging control information. The details of the control plane functions depend on the network type and the type of switch. An example of a control plane function is the execution of a routing protocol. The determination of the routing table of the switch is a control plane function. The switch exchanges network topology information with its neighbors and computes the routing table after all the information is received from all the neighbors. The routing table can be computed depending on the size of the network and the processing capability of the control processor and the ability of the switch to adapt to changing network conditions. Typically, the control plane functions are performed in software on general-purpose processors. The MIPS (million instructions per second) rating of the processor is a good measure of the performance of the switch.

[Read full chapter](#)

Mesh Networks, Routing and Scheduling

Anurag Kumar, ... Joy Kuri, Kuri, Joy, Wireless Networking, 2008

Overview

Overview

In Section 8.1 we first describe the graph of a wireless network deployed in a given geographical area. Geographical area constraints on the simultaneous transmissions based on SINR, based on CSMA, and the network graph and the network graph are then described. In Section 8.2, for a given link activation vector, we obtain the network stability region, the set of end-to-end packet arrival rates for which the queues in all the network nodes will be stable. Section 8.3, we consider the joint optimal routing of a set of end-to-end flows of packets over the network, and the corresponding link scheduling. A static link scheduling is given in Section 8.4. In Section 8.4 we develop the important throughput based, backpressure algorithm for joint routing and transmission scheduling in a network. This algorithm is optimal in the sense that it can stabilize any stabilizable rate vector. The algorithm is a max-weight scheduling algorithm. The stability proof makes use of stochastic Lyapunov functions. Section 8.5 we consider end-to-end elastic traffic and, for a given set of flows, we obtain the joint optimal routing of the packet flows and the transmission scheduling. In this case, a utility function on the allocated rate is defined for each of the flows, and the total utility of all the users is maximized using max-weight scheduling. Using Lagrangian duality we obtain optimal joint packet flow routing, allocation, and scheduling policies. In this section, we also consider scheduling of packet flows in a slotted Aloha network. The optimal algorithm is obtained by maximizing their transmission probabilities using a bilinear programming problem to maximize the sum of link utility functions.

[Read full chapter](#)

Operating Systems Overview

Peter Barry, Patrick Crowley, Patrick Crowley, *Modern Computing*, 2012

Polling Interface

In many cases, the network interface driver provides a poll method to poll the network interface for received packets. The network interface driver provides a poll method to poll for network packets for two reasons. The first is to allow the network interface driver to poll for packets when a packet arrives at the network interface, it is not necessary for the network interface driver to interrupt the processor when each packet arrives, as it is with the interrupt-driven interface. The second is to allow the network interface driver to poll for packets when a packet arrives at the network interface, it is not necessary for the network interface driver to interrupt the processor when each packet arrives, as it is with the interrupt-driven interface. The network interface driver provides a poll method to poll for packets when a packet arrives at the network interface, it is not necessary for the network interface driver to interrupt the processor when each packet arrives, as it is with the interrupt-driven interface. The network interface driver provides a poll method to poll for packets when a packet arrives at the network interface, it is not necessary for the network interface driver to interrupt the processor when each packet arrives, as it is with the interrupt-driven interface.

of the first packet and then to poll the interface a number of times before the packet related interrupts are re-enabled from the device. This has the effect of reducing the total number of interrupts processed for the bursty traffic. In some cases where the network traffic is at a sustained high rate, a scenario known as *live lock* can occur. Live lock in this case is when the CPU is spending all of the time servicing network receive interrupts but never has an opportunity to process the packets. The Linux stack implements a concept known as New API (NAPI) (<http://www.linuxfoundation.org/collaborate/workgroups/networking/napi>) to switch between interrupt driven operation and polled operation based on the network load. There are also interrupt moderation schemes developed for some network interfaces to help moderate the interrupt rate using inter packet timers and network traffic load.

of the first packet and then to poll the interface a number of times before the packet related interrupts are re-enabled from the device. This has the effect of reducing the total number of interrupts processed for the bursty traffic. In some cases where the network traffic is at a sustained high rate, a scenario known as *live lock* can occur. Live lock in this case is when the CPU is spending all of the time servicing network receive interrupts but never has an opportunity to process the packets. The Linux stack implements a concept known as New API (NAPI) (<http://www.linuxfoundation.org/colaborate/workgroups/networking/napi>) to switch between interrupt driven operation and polled operation based on the network load. There are also interrupt moderation schemes developed for some network interfaces to help moderate the interrupt rate using inter packet timers and network traffic load.

The other reason to provide a network polling API to allow the network interface to be used as a debugging target is to allow the system. For example, you can connect to the daemon `netstat` and target the GDB and use the GDB debugger to debug the kernel code. The kernel code for a host machine is not an Ethernet interface that supports the polling. Network interfaces that only operate with interrupts cannot be used for this purpose, as for this purpose processing is preempted when a breakpoint is hit in the kernel.

[> Read full chapter](#)

Multiple Access Wireless Networks

Anurag Kumar, ... Joy Kuri, in [Networking, 2004](#)

Instability of Aloha

In the throughput discussion of Aloha and S-S Aloha, we saw that an important feature of random access MAC protocols is that a collision stays in the network and makes retransmission attempts successful. Such packets are called backlogs. Let B_k denote the backlog of slot k . We assume that all fresh arrivals at the beginning of slot k will attempt a transmission at the beginning of the next slot. We can write the evolution equation for B_k as follows:

where A_k is the number of arrivals in slot k , and D_k is the number of departures in slot k . If new packets arrive in slot k and if the backlogs attempt retransmission in slot k with probability r , then $\{B_k\}$ is a discrete time Markov chain. Consider the drift denoted by $d(n)$ and defined as

$d(n)$ is the average change in the backlog in one slot when the backlog is n . The backlog decreases by 1 if no new arrivals occur and if only one of the backlogs attempts transmission in the slot. The backlog increases by 1 if exactly one arrival occurs and if at least one of the backlogs attempts a retransmission. If the number of new arrivals is more than 1, the backlog increases by that amount. For all other combinations the backlog does not change. Thus we can write

$d(n)$ is the average change in the backlog in one slot when the backlog is n . The backlog decreases by 1 if no new arrivals occur and if only one of the backlogs attempts transmission in the slot. The backlog increases by 1 if exactly one arrival occurs and if at least one of the backlogs attempts a retransmission. If the number of new arrivals is more than 1, the backlog increases by that amount. For all other combinations the backlog does not change. Thus we can write

Using this and simplifying, we get

Clearly, as n becomes large, the first term of the right-hand side of the second term becomes very small. The second term is positive and it is positive for all large values of backlog (except finitely many values). It is a negative drift for the backlog at most one packet can depart the system in a slot. Therefore, the backlog cannot decrease. The backlog Markov chain is not positive recurrent. This means that if the backlog becomes large, the network will increase the backlog rather than decrease it. This indicates that the Aloha protocol, if it is running for a long time, can develop a large backlog that may never be cleared.

The assumption of the infinite number of nodes is for analytical convenience. It is also a worst case analysis because with a finite number of nodes, packets from the same node do not compete with each other, and each node can only improve. However, it can be shown that even if the number of nodes in the network is finite, the behavior is qualitatively similar to the infinite case. If the backlog becomes large, the network will operate with a large backlog for very long times. Now, to design mechanisms to make the network stable, we do this by making the probabilities adaptive. To see how this can be done, we consider the Aloha network where all the nodes know the size of the backlog of every node and also know the stationary packet arrival rate. A packet is successfully transmitted if either exactly one new packet arrives and one of the backlogs attempts a transmission, or if no new packet arrives and one of the backlogs attempts a transmission. Thus, P_s is given by

$$P_s = e^{-\lambda}(1-r)n + e^{-\lambda}r(1-e^{-\lambda}(1-r)n) + e^{-\lambda}nr(1-r)n$$

Given $B_k = n$, the probability of success (of success) is given by

If an adaptive retransmission probability is used instead of fixed r , the drift will become

In this case $d(n) \rightarrow 0$ as $n \rightarrow \infty$. Using Theorem 9.2, we conclude that for the Markov chain $\{B_k\}$ is positive recurrent, the Aloha network is stable.

It is not practical for the nodes to know B_k , and a node should learn the network state from the events that it can observe. Let Z_k be the event in slot k , with the possible events being idle (denoted by 0) if no transmission was attempted in it; success (denoted by 1) if exactly one transmission was attempted; and an error (denoted by e) if more than one transmission was attempted. Typically two kinds of event observations are used. For example, we could use

It is not practical for the nodes to know B_k , and a node should learn the network state from the events that it can observe. Let Z_k be the event in slot k , with the possible events being idle (denoted by 0) if no transmission was attempted in it; success (denoted by 1) if exactly one transmission was attempted; and an error (denoted by e) if more than one transmission was attempted. Typically two kinds of event observations are used. For example, we could use

$$S_{k+1} = \max\{1, S_k + \delta I\{Z_k=0\} - \alpha \max\{Z_k, S_k\} + \alpha I\{Z_k=e\}\} + b I\{Z_k=1\} + c I\{Z_k=e\}$$

and transmit with probability $\min\{1, S_k\}$ if the node has a fresh packet or a backlog. Note that backlog starts at 0, and a possible choice for the parameters is $a = -1$, $b = 0$, and $c = 1$. Alternatively,

$$S_{k+1} = \max\{1, a(Z_k) S_k\} = \max\{1, a(Z_k) \times S_k\}$$

where $a(Z_k)$ are probabilities that depend on the network state. It has been shown that $a(Z_k)$ exist to achieve the maximum possible throughput of .

Using the feedback from adapting network transmitting times requires that all nodes be active all the time. This is clearly undesirable. To make the protocol make the protocol more robust, access protocols made use of the nodes use their transmission attempts to adapt the history to adapt the times. After a collision is detected by a node, the node stops the transmission and does not attempt another transmission for a backoff period of x units of time. Here x is a uniformly distributed random variable in the interval $[0, B]$. The B is updated by the node at every event (collision or success). A typical update equation has the form

$$(8.18) \quad (8.18)$$

where a , b , B_{\min} , and B_{\max} are predefined.

> [Read full chapter](#)

Random Access and Wireless LANs

Anurag Kumar, ... Joy Kuri, Wiley, 2008

Stabilizing Aloha

An obvious issue new nodes sign on to make the network stable for some $\epsilon > 0$ so that the network can support new packets at that rate. This is done by making the probabilities adaptive. To see how this can be done, assume that all the nodes know the backlog size of the backlog at the beginning of every

slot and also the stationary [packet arrival](#) rate. A packet is successfully transmitted in a slot if either of the two conditions is satisfied: (1) Exactly one new packet arrives and none of the backlogs attempts a retransmission or (2) no new packet arrives and exactly one of the backlogs attempts a retransmission. Thus, the probability of a successful transmission when the backlog is n , $P_s(n)$, is given by

able. To make the protocol more robust, in many random access protocol standards, a node uses its own transmission attempt history to adapt the retransmission times. Usually, the history is reset after every successful transmission. A node will make the m -th transmission attempt after a backoff period of x_m units of time. Here x_m is a uniformly distributed random integer in the interval $[0, B_m - 1]$. B_m is updated by the node at every event (collision or a success). A typical update equation has the form

able. To make the protocol more robust, in many random access protocol standards, a node uses its own transmission attempt history to adapt the retransmission times. Usually, the history is reset after every successful transmission. A node will make the m -th transmission attempt after a backoff period of x_m units of time. Here x_m is a uniformly distributed random integer in the interval $[0, B_m - 1]$. B_m is updated by the node at every event (collision or a success). A typical update equation has the form

$$(7.3) \quad B_m = \min\{B_{\max}, 2B_{m-1}\}$$

where a , b , B_{\min} , and B_{\max} are predefined.

[Read full chapter](#)

Multiple Access Techniques

Vijay K. Garg, in [Wireless & Networking](#), 2007

6.11 Random Access Methods

So far we have discussed reservation-based schemes, now we focus on random-access schemes. A steady flow of information to transmit (for example, data for a file transfer, a data file transmission), reservation-based access methods make efficient use of communication resources. However, when the information to be transmitted is bursty in nature, the reservation-based access method is wasteful of communication resources. Furthermore, in a full-duplex system, where channels are charged based on a channel connection time, the reservation-based access method may be too expensive to transmit short messages. Random access provides a flexible and efficient method for managing channels to transmit short messages. The random-access method gives each user a free access to the network whenever the user has information to send. Because of this freedom, these schemes result in contention among users accessing the network. Contention may cause collisions and may require retransmission of the information. The commonly used random-access protocols are ALOHA, slotted ALOHA, and CSMA/CD. In the following section we describe details of each of these protocols and provide the necessary throughput expressions.

6.11.1 Pure ALOHA

In the pure ALOHA scheme, each user transmits information whenever the user has information to send. A user sends information in packets. After sending a packet, the user waits a time equal to the round-trip delay for an

acknowledgment (ACK) of the packet from the receiver. If no ACK is received, the packet is assumed to be lost in a collision and it is retransmitted with a randomly selected delay to avoid repeated collisions.* The normalized throughput S (average new packet arrival rate divided by the maximum packet throughput) of the pure ALOHA protocol is given as:

acknowledgment (ACK) of the packet from the receiver. If no ACK is received, the packet is assumed to be lost in a collision and it is retransmitted with a randomly selected delay to avoid repeated collisions.* The normalized throughput S (average new packet arrival rate divided by the maximum packet throughput) of the pure ALOHA protocol is given as:

$$(6.20) \quad S = G e^{-2G} \quad (6.20)$$

where G = normalized offered traffic load

From Equation 6.20, it can be noted that the maximum throughput occurs at traffic load $G = 0.5$ and is about 18.4%. Thus, the best channel utilization with the pure ALOHA protocol is only 18.4%.

6.11.2 Slotted ALOHA

In the slotted-ALOHA system, time is divided into time slots. Each time slot is made exactly equal to packet transmission time. Users are synchronized to the time slots, so that whenever a packet to send, the packet is held and transmitted in the next time slot. With time slots scheme, the interval of a possible collision of two packets is reduced to one packet time from two packet times, as in the pure ALOHA. The normalized throughput S for the slotted-ALOHA protocol is given as:

$$(6.21) \quad S = 2G e^{-G} \quad (6.21)$$

where G = normalized offered traffic load

The maximum throughput for the slotted ALOHA is 36.8% (Equation 6.21) and it is equal to 1/2 of the pure ALOHA. This implies that the maximum throughput, 36.8% of the time slots successfully transmitted packets. The best channel utilization with the slotted ALOHA protocol is 36.8% while the pure ALOHA protocol.

6.11.3 Carrier Sense Multiple Access (CSMA)

The carrier sense multiple access (CSMA) [8] provides a more efficient use of the channel than the ALOHA protocols. The CSMA protocols are achieved through the use of the additional capability to sense the channel before transmitting. The carrier sense information is used to detect the length of collision intervals. For carrier sense to be effective, the propagation delay must be less than packet transmission time. Two classes of CSMA protocols are nonpersistent and p-persistent.

Nonpersistent CSMA: A user station does not sense the channel continuously while it is busy. Instead, after sensing the busy condition, it waits for a randomly selected interval of time before sensing again. The algorithm works as follows: if the channel is found to be idle, the packet is transmitted; or if the channel is sensed busy, the user station backs off the packet to be scheduled for a later time. After backing off, the channel is sensed again, and the algorithm is repeated again.

- **p-persistent CSMA:** The probability selected for a station to transmit is typically selected to be the maximum propagation delay. When a station wants to transmit, it senses the channel. If the channel is found to be idle, it transmits with probability p . With probability $q = 1 - p$, the user station postpones its action to the next slot, where it senses the channel again. If the channel is idle, the station transmits with probability p or postpones with probability q . The procedure is repeated until either the frame has been transmitted or the channel is found to be busy. If the station initially senses the channel to be busy, it simply waits one slot and applies the above procedure.
- **1-persistent CSMA:** 1-persistent CSMA is the simplest form of the p-persistent CSMA. It signifies that a station transmits with probability 1 as soon as the channel becomes idle. After sending the packet, the user station waits for an ACK. If it is received within a specified amount of time, the user station waits for a random amount of time, and then resumes listening to the channel. If the channel is again found to be idle, the packet is retransmitted immediately.

For more details, the reader is referred to [18].

The throughput expressions for the CSMA protocols are:

- **Unslotted nonpersistent CSMA** (6.22)
- **Slotted nonpersistent CSMA** (6.23)
- **Unslotted 1-persistent CSMA** (6.24)
- **Slotted 1-persistent CSMA** (6.25)

where: where:

S = normalized throughput
 G = normalized offered traffic load
 $a = \tau/T_p$ $a = \tau/T_p$
 τ = maximum propagation delay
 T_p = packet transmission time

> [Read full chapter](#)

Overview

Overview

Michał Pióro, Deepankar Medhi, and Rami G. Gallager, *Capacity Design in Communication and Computer Networks*, 2004

1.3.1 Traffic in the Internet

When a user employs an application, the message generated is broken down into smaller data packets for transport. A large portion of applications on the Internet use the TCP/IP (Transmission Control Protocol/Internet Protocol) stack. The end computers responsible for breaking an application's messages (e.g., web pages, e-mail) into smaller packets and then re-assembling them in the right order at the other end before handing it over to the application; in the process, the two end computers need packets use that if a packet is by chance lost somewhere, they need a way to get notification of the lost packet and retransmit it so that the message is correctly delivered to the application. For the TCP/IP protocol, the TCP/IP reference books, refer to books such as [Com00], [RD2], [PD03], [RD03], [PD03], and [Tas03]. The network's job is to route these packets from one end to the other and, in fact, to do so considering reliability in delivery as per TCP/IP protocol. The packets are also known as IP datagrams.

There are many reasons why an IP datagram may not be delivered at the other end; for example, a physical transmission error corrupts the datagram along the way making it unusable. In fact, if a router in transit has a buffer space at the instant this particular datagram arrived. Unlike congested networks where any delay is unacceptable, in the Internet this delay can be tolerated only if the buffer capacity is still available and is subject to the capacity of the buffer at the well-being router as well. Going by the basic TCP/IP protocol stack, a router's job is to route packets towards the destination without necessarily taking into consideration whether buffer space is available at the arriving router; this is perfectly acceptable since the protocol allows for the end computers to re-generate any lost packets. While the rate to be adjusted due to congestion, any packet that is dropped can still possibly be dropped.

Let us recap a couple of issues that arise from traffic congestion. Traffic congestion can occur in a network (or in parts of a network) and packets may be dropped. Thus, the loss of packets is a fact of network design, and a professional, is to design a network to handle congestion in a way that is acceptable, and to minimize the loss of packets (or the loss of data) due to congestion. Note that congestion is a fact

of life; it is impossible to avoid it completely since traffic can be unpredictable at times. However, we can design a network in such a way that the congestion does not happen *all* the time, or, rather, happens only infrequently. Essentially, our situation would be equivalent to stating the following: in a particular highway in the road network, the delay is really bad; we need more lanes constructed. Precisely the same way, in the Internet, we need to have enough *lanes* (bandwidth or capacity) so that we can give an acceptable level of service; in addition, we need router buffers in place with sufficient memory to deal with traffic burst and real-time traffic so that **packet dropping** is minimized.

distribution, and the $M/M/1$ queueing system, for example, see [Med02]); then, there happens to be a nice analytical formula for computing the average packet delay due to queueing phenomenon. Specifically, if the average packet size is denoted by Kp bits, and the link capacity (speed) is given by C bits per second (e.g., T1-rate: 1.54 Mbps), then the average service rate of the link is $\mu = C/Kp$ pps. If the average arrival rate is denoted by λ pps, then the average delay (in seconds), $D(\lambda, \mu)$, is given by:¹¹

distribution, and the M/M/1 queueing system, for example, see [Med02]); then, there happens to be a nice analytical formula for computing the average packet delay due to queueing phenomenon. Specifically, if the average packet size is denoted by Kp bits, and the link capacity (speed) is given by C bits per second (e.g., T1-rate: 1.54 Mbps), then the average service rate of the link is $\mu = C/Kp$ pps. If the average arrival rate is denoted by λ pps, then the average delay (in seconds), $D(\lambda, \mu)$, is given by:

(1.3.1)

(1.3.1)

This simple relation provides multiple insights for performance analysis. First, if we can certainly assess the average delay, for example, of 100 pps arrival rate of 100 pps and service rate of 190 pps, the average delay, $D(100, 190)$, is $1/(190 - 100)$ seconds, or, 11.11 millisecond (ms). If the average arrival rate increases to 150 pps, then the average delay increases to 25 ms. It is usually helpful to average utilization of the system, ρ , which is given by λ/μ , arrival rate divided by the average service rate ($\rho = 100/190 = 0.526$ or 52.6%). To consider the typical delay behavior, we have plotted the average delay of the average utilization, ρ , in the x-axis and the average delay in the y-axis, keeping the arrival rate at 100 pps (Figure 1.9).

FIGURE 1.9. Average Delay Using M/M/1 Delay Formula

Now, when you see a number, you might wonder why such a minor delay would be of any interest or concern. There are a couple of ways to answer this question: 1) this delay is only a delay (other delays such as propagation and processing will be discussed later), and 2) this value is only for a single-link case (for a multi-link case, a packet would be required to traverse many links through the Internet).

We now illustrate the second point by answering the web page access example from Warsaw, Poland to Kansas City, Mo. If a domain is visited, which we have discussed earlier, it actually goes through several routers within each network. Specifically, in this case, we found that the path goes through 18 hops or routers.¹² To simplify the illustration, let us assume that each link between two adjacent

routers has the average delay of 11.11 ms. Then the end-to-end delay will be at least $11.11 \times 19 \approx 200$ ms! It is evident that when we consider the end-to-end delay, the delay components do add up due to the instantaneous store-and-forward nature of the Internet routing. Thus, it is important to keep the average delay on each link/network as low as possible.

routers has the average delay of 11.11 ms. Then the end-to-end delay will be at least $11.11 \times 19 \approx 200$ ms! It is evident that when we consider the end-to-end delay, the delay components do add up due to the instantaneous store-and-forward nature of the Internet routing. Thus, it is important to keep the average delay on each link/network as low as possible.

Returning to the plot (Figure 1.9), we notice that the average delay drastically increases as the average arrival rate increases, or the service rate of the link decreases. Thus, the average delay is a highly nonlinear function of the link utilization, ρ , and it becomes worse when the utilization, ρ , is close to 1.0 (100% link utilization). This graph can be used in another way by asking the question: what is the acceptable delay that we would like users to tolerate for a good quality service? If we know this graph (or the formula), we can determine the acceptable level of link utilization. Suppose, the acceptable average delay is 15 ms, then we can determine that the acceptable average utilization is 64.5% on the link. The good news is that at least for the purpose of network design considerations, it may be acceptable to use link utilization as a link utilization criterion alternative to the delay criterion. However, we need to take into account the factor that we have assumed thus far, that the packet arrival process follows the Poisson process. Unfortunately, as we have seen from the Internet measurements, the arrival process does not follow the Poisson process, and the delay is worse than the one calculated using the Poisson assumption. This simply means that the delay curve is above the $M/M/1$ delay curve. This, in turn, suggests that we have plotted such a delay curve in addition to the $M/M/1$ delay curve in Figure 1.10. The two important network design implications arise from this: first, the 64.5% average utilization would be acceptable at 15 ms average delay is perhaps an overestimate; in reality, we might need to hold the average utilization at about 50% on average to 50% or lower to achieve the 15 ms delay requirement.

FIGURE 1.10. Average $M/M/1$ Delay Using $M/M/1$ Delay Formula and a Fictitious Delay Formula

We now consider another important design issue referred to as the *scaling* (or *packing*) factor. Our $M/M/1$ illustration so far has been shown for a service rate of 190 pps (corresponding to T1-link rate). Now consider a link with 10 times the capacity of T1-link,¹³ and an arrival rate 10 times more, i.e., with the average rate of 1,900 pps. Reflecting back to the average delay function (Section 1.3.1), with a ten-fold increase in both the average service rate and the average arrival rate (i.e., while the utilization remains the same), the average delay *reduces* to one-tenth of the previous value since $1/(10\mu p - 10\rho p) = 0.1/(\mu p - \rho p)$. Thus, it is better to have one higher-speed link instead of having 10 parallel lower-speed links to carry the same amount of total traffic. This statement is valid without taking into consideration the cost of the link; in general, while taking the typical cost structure of links into consideration, the gain resulting from using high capacity links is even more profound.¹⁴ This is often referred to as the *statistical multiplexing* gain. Similar phenomena also occur with air travel network where big aircraft (fleets) are used in many segments to reduce cost by better packing.

We now consider another important design issue referred to as the *scaling* (or packing) factor. Our $M/M/1$ illustration so far has been shown for a service rate of 190 pps (corresponding to T1-link rate). Now consider a link with 10 times the capacity of T1-link,¹³ and an arrival rate 10 times more, i.e., with the average rate of 1,900 pps. Reflecting back to the average delay function (Section 1.3.1), with a ten-fold increase in both the average service rate and the average arrival rate (i.e., while the utilization remains the same), the average delay *reduces* to one-tenth of the previous value since $1/(10\mu - 10\rho) = 0.1/(\mu - \rho)$. Thus, it is better to have one higher-speed link instead of having 10 parallel lower-speed links to carry the same amount of total traffic. This statement is valid without taking into consideration the cost of the link; in general, while taking the typical cost structure of links into consideration, the gain resulting from using high capacity links is even more profound.¹⁴ This is often referred to as the *statistical multiplexing* gain. Similar phenomena also occur with air travel network where big aircraft (fleets) are used in many segments to reduce cost by better packing.

Regardless, what we need to know from this is whether the utilization is observed to be high or not, and whether the utilization is acceptable for a particular link type; if so, it is probably time to increase the capacity of the link. Certainly, this problem is trivial if we were to travel if we were to have a single-link network where we can measure the arrival rate, observe the utilization, and determine if the utilization is to be increased if the utilization is, for example, more than 50%, or average 50% of the network. (In large networks (rather than just a set of serial links) where the utilization is impacted by routing of traffic flows, the problem of adding bandwidth is much more complex than this simple single-link network.) This will be covered extensively in this book, and we will illustrate a simple design example later in Section 1.4.

In any case, an important lesson learned from the above discussion is that determining the average rate (based on requirements) is required since this really refers to the traffic volume in a particular measuring unit for the Internet, for example, further, we need to know the difference between different nodes in the network, sometimes it is not clear where we need similar information between Kansas City and Chicago, and Detroit, and so on. In summary, we certainly need to identify the traffic demand volume as an input for all our network design problems.

Note that we have characterized traffic by pps since we have hidden the packet size information in the discussion of data traffic. Actually, the average packet size could have been taken into account and the demand for data traffic could be given in Mbps instead of pps; that is, pps and Mbps are valid units for data traffic. In fact, the link capacity is usually expressed in the appropriate context. It may be noted that many ISPs use Mbps (or Gbps) for link capacity, and

Gbps) as the unit for traffic demand volume for the purpose of routing optimization and network design.

Gbps) as the unit for traffic demand volume for the purpose of routing optimization and network design.

[Read full chapter](#)

IP Traffic Engineering

Deep Medhi, Karthikeyan Ramasamy, Kim R. Ramasamy, in *Network Engineering (Second Edition)*, 2018

7.1.4 Average Delay in a Single-Link System

First, we assume that a packet arrival process at a link follows a Poisson process with the average arrival rate λ packets per second. The packets are served at an average rate of packets by the link is assumed to be μ packets per second. We consider the case in which the average arrival rate is less than the average service rate, i.e., $\lambda < \mu$; otherwise, we would have an overflow situation. The service time is exponentially distributed (see Appendix B.12). If packet arrivals are Poissonian, then the average delay, \bar{d} , can be given by the following formula, which is based on the 1 queueing model (see Appendix B.15.2):

$$(7.1.4) \quad \bar{d} = \frac{1}{\mu - \lambda}$$

Now consider that the link speed is c Mbps, and that the packet size is exponentially distributed. Then, the service rate μ is the link speed c (in Mbps), the average packet size \bar{s} , and the packet arrival rate λ , which can be written as:

$$(7.1.5) \quad \bar{d} = \frac{1}{c - \lambda \bar{s}}$$

This is then essentially the relation in Eq. (7.1.4). Combining Eq. (7.1.5) with the packet arrival rate λ , we can consider the arrival rate in Mbps as follows:

$$(7.1.6) \quad \lambda \bar{s} = \frac{\lambda}{\mu}$$

If we multiply the numerator and denominator by μ , we can then transform Eq. (7.1.4) as follows:

$$(7.1.7) \quad \bar{d} = \frac{1}{\mu} \frac{1}{1 - \lambda \bar{s} / \mu}$$

This relation can be re-written as:

$$(7.1.8) \quad \bar{d} = \frac{1}{\mu} \frac{1}{1 - \lambda \bar{s} / \mu}$$

If we now compare Eq. (7.1.4) and Eq. (7.1.8), we see that the average packet delay can be derived directly from the link speed and arrival rate given in a measure such as Mbps; the only difference is the factor \bar{L} , the average packet size. Second, although it may sound odd, the quantity, \bar{L}/c , can be thought of as the average “bit-level” delay on a network link where the average traffic is assumed to be h Mbps. In other words, if we track the traffic volume in Mbps on a link and know the link data rate, we can get a pretty good idea about the average delay. There are a couple of advantages to this observation: first, we can use traffic volume, h , and link speed, c , in other units such as Gbps without changing the basic behavior on delay given by \bar{L}/c ; second, it is not always necessary to track the average packet size; third, if the delay is to be measured in millisec instead of sec, then \bar{L}/c must be multiplied by the constant, 1000, without changing the basic structure of the formula. Finally, whether we consider measures in packets per sec or Mbps (or Gbps), the link utilization parameter, ρ , that captures the ratio of traffic volume over the link rate, remains the same regardless of the average packet size since

If we now compare Eq. (7.1.4) and Eq. (7.1.8), we see that the average packet delay can be derived directly from the link speed and arrival rate given in a measure such as Mbps; the only difference is the factor \bar{p} , the average packet size. Second, although it may sound odd, the quantity, \bar{p} , can be thought of as the average “bit-level” delay on a network link where the average traffic is assumed to be h Mbps. In other words, if we track the traffic volume in Mbps on a link and know the link data rate, we can get a pretty good idea about the average delay. There are a couple of advantages to this observation: first, we can use traffic volume, h , and link speed, c , in other units such as Gbps without changing the basic behavior on delay given by \bar{p} ; second, it is not always necessary to track the average packet size; third, if the delay is to be measured in millisecond instead of second, then \bar{p} must be multiplied by the constant, 1000, without changing the basic structure of the formula. Finally, whether we consider measures in packets per second or Mbps (or Gbps), the link utilization parameter, ρ , that captures the ratio of traffic volume over the link rate, remains the same regardless of the average packet size since

$$(7.1.9) \quad \rho = \frac{h}{c} \bar{p}$$

In essence, we can say that under the assumption that the average packet size, \bar{p} , can be given in terms of the link speed c and the traffic rate h where as

$$(7.1.10) \quad \rho = \frac{h}{c} \bar{p}$$

with utilization given by ρ , Eq. (7.1.10) tells us that the average delay, \bar{p} , is a functional relation mentioned earlier in Eq. (7.1.2). What in Eq. (7.1.2) we have to consider is self-similarity of traffic? Unfortunately, the formula is not like the one above when traffic is self-similar. It has been reported that the delay behavior with delay tail traffic is worse than that of self-similar traffic with delay tail traffic. Thus, we will have to find a delay function for self-similar traffic with delay tail traffic. In Figure 7.1, note that in this figure the link speed c is kept fixed while the traffic rate h is increased—this is why the x-axis is marked with link utilizations, ρ , in percentage as ρ goes from 0 to 100%.

Figure 7.1. The $M/M/1$ average delay $M/M/1$ average delay with a fictitious delay curve.

Figure 7.1 is, in fact, a very helpful reference for understanding the problem from the perspective of traffic engineering. Suppose that we provide acceptable perception to users, say 20 millisecond. From the graph, we can see that the link can handle an arrival traffic rate of 75% of the link capacity while maintaining the acceptable average delay. If the arrival traffic follows the Poisson process, then the delay would be the same as the delay for a Poisson process. In this fictitious graph, the delay would be about 40 millisecond instead. Certainly, this is not desirable. In order to keep the delay below 20 millisecond, the utilization must be below 50%. In other words, if we want to maintain the average delay below 20 millisecond, the utilization must be below 50%.

In regard to traffic engineering, there are two points to note from the above discussion. First, the relationship between delay and utilization; because of this, requiring a certain delay can be recast as requiring the utilization to be kept below a certain level. Second, since there is no simple formula to calculate delay for self-similar traffic, being conservative on the requirement of delay is sufficient for the purpose of traffic engineering. For instance, if we observe a link with utilization at 50%, it would be reasonable to keep it below 80%. Due to the relation between traffic volume and utilization, this means that for a fixed link speed c , we need to keep the traffic level below 80% of the link speed. This is indicated for Poisson traffic, but it is also true for self-similar traffic.

> [Read full chapter](#)

Markov Processes

Markov Processes

Scott L. Miller, Donald Chi Miller, in Donald Chi Miller, Paul D. Boal, Processes, 2004

9.5 Engineering Applications: A Computer Communication Network

Consider a local area network where a cluster of nodes is connected by a common communications line. Suppose for simplicity that these nodes occasionally need to transmit a message of some fixed length (or a fixed number of packets). Also, assume that the line is divided into slots, each of which is sufficiently long to support one packet. In this example, we consider a random access protocol known as **ALOHA**. Messages (packets) are assumed to arrive at each node according to a Poisson process. Assuming there are a total of n nodes, the packet arrival rate is assumed to be λ so that the total arrival rate of packets is fixed at λ packets/slot. Also, every time a new packet arrives at a node, that node attempts to transmit that packet during the next slot. During each slot, one of the following events can occur: (1) no node attempts to transmit a packet, in which case the slot is idle; (2) exactly one node attempts to transmit a packet, in which case the transmission is successful; or (3) more than one node attempts to transmit a packet, in which case a collision occurs and no transmission is successful.

All nodes involved in a collision will retransmit their packets, but if they all retransmit during the next slot, then they will collide and the packets will never be successfully transmitted. All nodes involved in a collision are said to be backlogged until their packet is successfully retransmitted. In the slotted Aloha protocol, each backlogged node chooses to retransmit with probability p (and hence probability $1 - p$) in the next slot with probability $1 - p$). Viewed in an alternative manner, every time a collision occurs, each node involved waits a random amount of time until they attempt retransmission, where that random time follows a geometric distribution.

This computer network can be described by a Markov chain, X_k = number of backlogged nodes backlogged of the k th slot. To obtain the transition probabilities of the Markov chain, the assumption that the number of nodes (or a finite number of nodes, each of which has, at least, an arbitrary number of backlogged packets in the buffer), we note that

(9.65) (9.65)

(9.66) (9.66)

Using these equations, it is straightforward to determine that the transition probabilities are given by

Using these equations, it is straightforward to determine that the transition probabilities are given by

$$(9.67) \quad (9.67)$$

In order to get a feeling for the steady state of the system, we define the drift of the chain in state i as

$$(9.68) \quad (9.68)$$

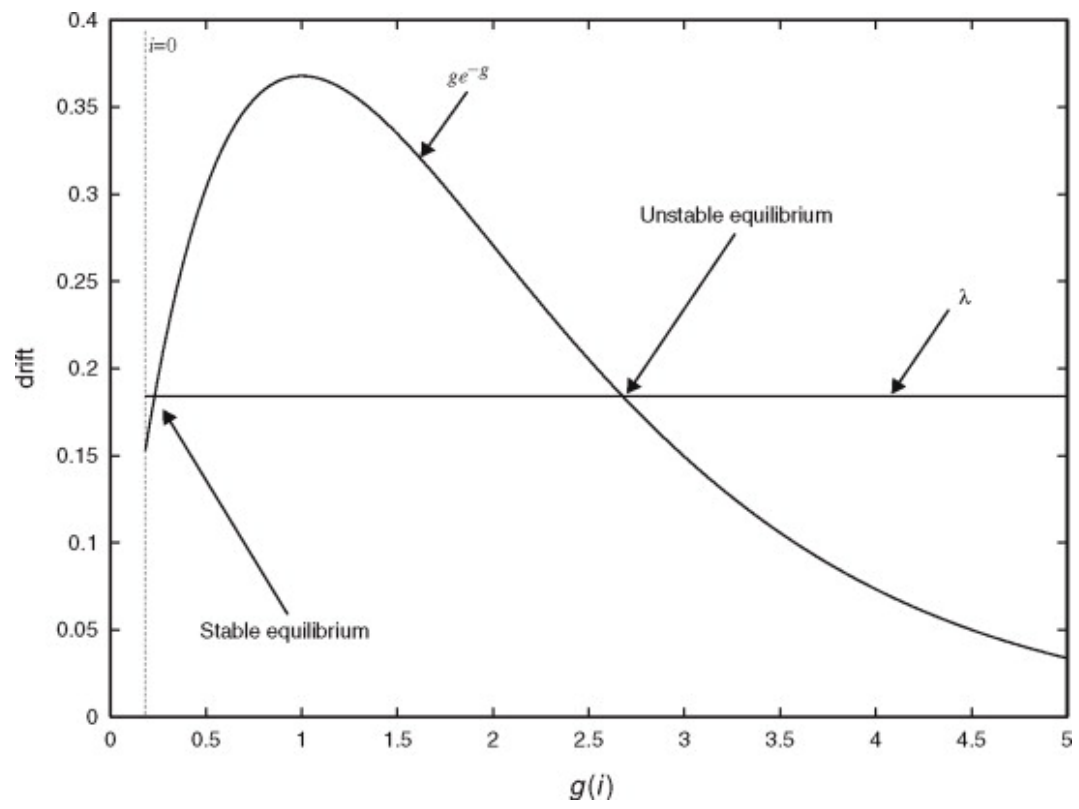
Given that the chain is in state i , if the drift is positive, the number of backlogged nodes will tend to increase; if the drift is negative, the number of backlogged nodes will tend to decrease. Crudely speaking, a drift of zero represents some sort of equilibrium for the Markov chain. Given the preceding transition probabilities, the drift works out to be

$$(9.69) \quad (9.69)$$

Assuming that $\lambda \approx 1$ and $p \approx 1$, the approximations $(1 - p)^i \approx 1 - ip$ and $(1 - p)^i \approx e^{-ip}$ simplify the expression for the drift:

$$(9.70) \quad (9.70)$$

The parameter $g(i)$ has the physical interpretation of the average number of transmissions per slot given by backlogged states. To understand the significance of this result, the expressions for the drift are plotted in Figure 9.6. The first curve, $\lambda(1 - p)^i$, is the average number of new arrivals per slot, while the second curve, $g(i)p$, is the average number of successful transmissions per slot. The average departure rate is a very small number of backlogged states, $\lambda(1 - p)^i$, that is greater than the departure rate and the number of backlogged states tends to increase. For moderate values of i , the departure rate is greater than the arrival rate and the number of backlogged states tends to decrease. Hence, the drift of the Markov chain is zero at the stable state, which is the point marked in Figure 9.6. This is the first point where the two curves cross. Note, however, that if the drift becomes positive again. If the number of backlogged states ever becomes large enough to push the system to the right of the stable equilibrium state, then the number of backlogged nodes will continue to grow and the system will become unstable.



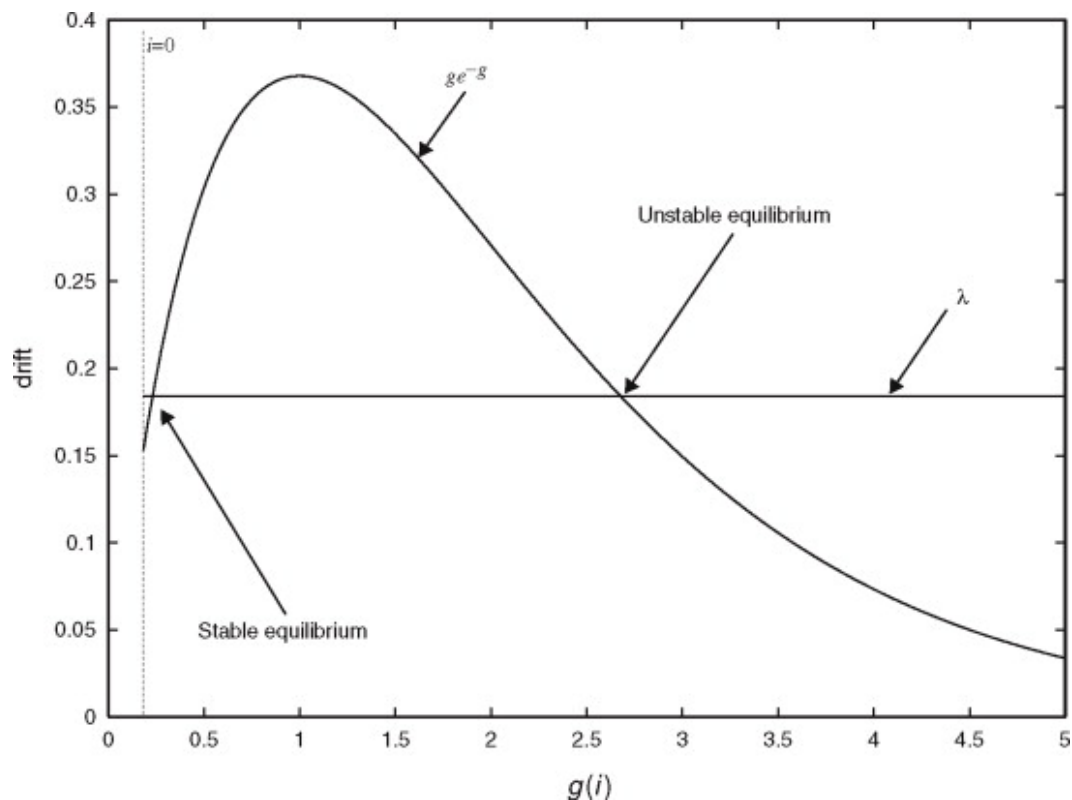


Figure 9.6. Arrival rate and drift for a system. Note that the value of λ represents the throughput of the system. If we try to use a value of λ that is greater than the peak value of the curve, the drift will always be positive and the system will be unstable. This maximum throughput occurs when $g(i) = 1$ and has a value of $1/e$. By choosing an arrival rate less than λ_{max} , we can get the system to reach a stable equilibrium, but sooner or later it will get a bad packet and the system will drift into the unstable region. The system will then reach a new equilibrium. If the system becomes unstable, it will eventually reach the stable region. Hence, the system is stable.

Note that the value of λ represents the throughput of the system. If we try to use a value of λ that is greater than the peak value of the curve, the drift will always be positive and the system will be unstable. This maximum throughput occurs when $g(i) = 1$ and has a value of $1/e$. By choosing an arrival rate less than λ_{max} , we can get the system to reach a stable equilibrium, but sooner or later it will get a bad packet and the system will drift into the unstable region. The system will then reach a new equilibrium. If the system becomes unstable, it will eventually reach the stable region. Hence, the system is stable.

> [Read full chapter](#)