

Analysis and Simulation of a Fair Queueing Algorithm

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SUMMARY

We discuss gateway queueing algorithms and their role in controlling congestion in datagram networks. A fair queueing algorithm, based on an earlier suggestion by Nagle, is proposed. Analysis and simulations are used to compare this algorithm to other congestion control schemes. We find that fair queueing provides several important advantages over the usual first-come-first-served queueing algorithm: fair allocation of bandwidth, lower delay for sources using less than their full share of bandwidth, and protection from ill-behaved sources.

KEY WORDS Congestion control Queueing algorithms Fair queueing

INTRODUCTION

Datagram networks have long suffered from performance degradation in the presence of congestion (Gerla and Kleinrock, 1980). The rapid growth, in both use and size, of

computer networks has sparked a renewed interest in methods of congestion control (Jain and Ramakrishnan, 1988; Ramakrishnan and Jain, 1988; Chiu and Jain, 1989; Ramakrishnan, Chiu and Jain, 1987; Jain, Ramakrishnan and Chiu, 1987; Jacobson, 1988; Mankin and Thompson, 1989; Nagle, 1984, 1987). These methods have two points of implementation. The first is at the source, where flow control algorithms vary the rate at which the source sends packets. Of course, flow control algorithms are designed primarily to ensure the presence of free buffers at the destination host, but we are more concerned with their role in limiting the overall network traffic. The second point of implementation is at the gateway. Congestion can be controlled at gateways through routing and queueing algorithms. Adaptive routing, if properly implemented, lessens congestion by routing packets away from network bottlenecks. Queueing algorithms, which control the order in which packets are sent and the usage of the gateway's buffer space, do not affect congestion directly, in that they do not change the total traffic on the gateway's outgoing line. Queueing algorithms do, however, determine the way in which packets from different sources interact with each other which, in turn, affects the collective behavior of flow control algorithms. We shall argue that this effect, which is often ignored, makes queueing algorithms a crucial component in effective congestion control.

Queueing algorithms can be thought of as allocating three nearly independent quantities: bandwidth (*which* packets get *transmitted*), promptness (*when* do those packets get *transmitted*), and buffer space (*which* and *when* packets get *discarded* by the gateway). Currently, the most common queueing algorithm is first-come-first-served (FCFS). FCFS queueing essentially relegates all congestion control to the sources, since the order of arrival completely determines the bandwidth, promptness, and buffer space allocations. Thus, FCFS inextricably intertwines these three allocation issues. There may indeed be flow control algorithms that, when universally implemented throughout a network with FCFS gateways, can overcome these limitations and provide reasonably fair and efficient congestion control. This point is discussed more fully later in the paper, when several flow control algorithms are compared. However, with today's diverse and decentralized computing environments, it is unrealistic to expect universal implementation of any given flow control algorithm. This is not merely a question of standards, but also one of compliance. Even if a universal standard such as OSI (International Organization for Standardization, 1986) were adopted, malfunctioning hardware and software could violate the standard, and there is always the possibility that individuals would alter the algorithms on their own machine to improve their performance at the expense of others. Consequently, congestion control algorithms should function well even in the presence of ill-behaved sources. Unfortunately, irrespective of the flow control algorithm used by the well-behaved sources, networks with FCFS gateways do not have this property. A single source, sending packets to a gateway at a sufficiently high speed, can capture an arbitrarily high fraction of the bandwidth of the outgoing line. Thus, FCFS queueing is not adequate; more discriminating queueing algorithms must be used in conjunction with source flow control algorithms to control congestion effectively in noncooperative environments.

Following a similar line of reasoning, Nagle (1987) proposed a *fair queueing* (FQ) algorithm in which gateways maintain separate queues for packets from each individual source. The queues are serviced in a round-robin manner. This prevents a source from arbitrarily increasing its share of the bandwidth or the delay of other sources. In fact, when a source sends packets too quickly, it merely increases the length of its own queue.

Nagle's algorithm, by changing the way packets from different sources interact, does not reward, nor leave others vulnerable to, antisocial behavior. On the surface, this proposal appears to have considerable merit, but we are not aware of any published data on the performance of datagram networks with such fair queueing gateways. In this paper, we will first describe a modification of Nagle's algorithm, and then provide simulation data comparing networks with FQ gateways and those with FCFS gateways.

The three different components of congestion control algorithms introduced above, source flow control, gateway routing and gateway queueing algorithms, interact in interesting and complicated ways. It is impossible to assess the effectiveness of any algorithm without reference to the other components of congestion control in operation. We will evaluate our proposed queueing algorithm in the context of static routing and several widely used flow control algorithms. The aim is to find a queueing algorithm that functions well in current computing environments. The algorithm might, indeed it should, *enable* new and improved routing and flow control algorithms, but it must not require them.

We had three goals in writing this paper. The first was to describe a new fair queueing algorithm. In the next section, we discuss the design requirements for an effective queueing algorithm, outline how Nagle's original proposal fails to meet them, and then propose a new fair queueing algorithm which does meet these requirements. Our second goal was to provide some rigorous understanding of the performance of this new fair queueing algorithm; we present a delay-throughput curve given by this algorithm for a specific configuration of sources, and then compare this performance to that given by the FCFS algorithm. Our third goal was to evaluate our new queueing proposal in the context of real networks. To this end, we discuss some currently implemented flow control algorithms and present simulation data comparing several combinations of flow control and queueing algorithms on six benchmark networks.

In circuit-switched networks where there is explicit buffer reservation and uniform packet sizes, it has been established that round-robin service disciplines allocate bandwidth fairly (Hahne, 1986; Katevenis, 1987). Recently Morgan (1989) has examined the role such queueing algorithms play in controlling congestion in circuit switched networks; although his application context is quite different from ours, his conclusions are qualitatively similar. In other related work, the DATAKIT¹ queueing algorithm combines round-robin service and FIFO priority service, and has been analyzed extensively (Lo, 1987; Fraser and Morgan, 1984). Also, Luan and Lucantoni (1988) present a different form of bandwidth management policy for circuit switched networks.

Since the completion of this work, we have learned of similar work by Zhang (1989); her *Virtual Clock* gateway queueing algorithm is essentially identical to the fair queueing algorithm presented here. Zhang analyzes this algorithm in the context of a proposed resource reservation scheme, the *Flow Network*, whereas we do not consider resource reservation. Heybey and Davin (1989) have simulated a simplified version of our fair queueing algorithm, investigating issues of buffer allocation and policy-based bandwidth allocation. McKenney (1990) and Keshav (1990) have investigated the implementation aspects of fair queueing. In addition, Greenberg and Madras (1990) have established some performance bounds on the fairness of our fair queueing scheme and other similar queueing algorithms.

¹ DATAKIT is a Trademark of AT&T.

FAIR QUEUEING

Motivation

What are the requirements for a queueing algorithm that will allow source flow control algorithms to provide adequate congestion control even in the presence of ill-behaved sources? We start with Nagle's observation that such queueing algorithms must provide protection, so that ill-behaved sources can only have a limited negative impact on well-behaved sources. Allocating bandwidth and buffer space in a *fair* manner, to be defined later, automatically ensures that ill-behaved sources can get no more than their fair share. This led us to adopt, as our central design consideration, the requirement that the queueing algorithm allocate bandwidth and buffer space fairly. Ability to control the promptness, or delay, allocation somewhat independently of the bandwidth and buffer allocation is also desirable. Finally, we require that the gateway should provide service that, in some sense, does not depend discontinuously on a packet's time of arrival (this continuity condition will be made precise in the context of defining our algorithm). This continuity requirement attempts to prevent the efficiency of source flow control implementations from being overly sensitive to timing details (timers are the Bermuda Triangle of flow control algorithms). Nagle's proposal does not satisfy these requirements. The most obvious flaw is its lack of consideration of packet lengths. A source using long packets gets more bandwidth than one using short packets, so bandwidth is not allocated fairly. Also, the proposal has no explicit promptness allocation other than that provided by the round-robin service discipline. In addition, the static round-robin ordering violates the continuity requirement. These defects are corrected in our version of fair queueing, which we define after first discussing our definition of fairness.

In stating our requirements for queueing algorithms, we have left the term *fair* undefined. The term *fair* has a clear colloquial meaning, but it also has a technical definition (actually several, but only one is considered here). Consider, for example, the allocation of a single resource among N users. Assume there is an amount μ_{total} of this resource and that each of the users requests an amount ρ_i and, under a particular allocation, receives an amount μ_i . What is a fair allocation? The max-min fairness criterion (Ramakrishnan, Chiu and Jain, 1987; Hahne, 1986; Gafni and Bertsekas, 1984) states that an allocation is fair if (1) no user receives more than its request, (2) no other allocation scheme satisfying condition 1 has a higher minimum allocation, and (3) condition 2 remains recursively true as we remove the minimal user and reduce the total resource accordingly, $\mu_{\text{total}} \leftarrow \mu_{\text{total}} - \mu_{\text{min}}$. This condition reduces to $\mu_i = \text{MIN}(\mu_{\text{fair}}, \rho_i)$ in the simple example, with μ_{fair} , the *fair share*, being set so that $\mu_{\text{total}} = \sum_{i=1}^N \mu_i$. This concept of fairness easily generalizes to the multiple resource case (Ramakrishnan, Chiu and Jain, 1987). Note that implicit in the max-min definition of fairness is the assumption that the users have equal *rights* to the resource.

In our communication application, the bandwidth and buffer demands are clearly represented by the packets that arrive at the gateway. (Demands for promptness are not explicitly communicated, and we return to this issue later.) However, it is not clear what constitutes a *user*. The user associated with a packet could refer to the source of the packet, the destination, the source-destination pair, or even refer to an individual process running on a source host. Each of these definitions has limitations. Allocation per source

unnaturally restricts sources such as file servers which typically consume considerable bandwidth. Ideally the gateways could know that some sources deserve more bandwidth than others, but there is no adequate mechanism for establishing that knowledge in today's networks. Allocation per receiver allows a receiver's useful incoming bandwidth to be reduced by a broken or malicious source sending unwanted packets to it. Allocation per process on a host encourages human users to start several processes communicating simultaneously, thereby avoiding the original intent of fair allocation. Allocation per source-destination pair allows a malicious source to consume an unlimited amount of bandwidth by sending many packets all to different destinations. While this does not allow the malicious source to do useful work, it can prevent other sources from obtaining sufficient bandwidth.

Overall, allocation on the basis of source-destination pairs, or *conversations*, seems the best trade-off between security and efficiency and will be used here. However, our treatment will apply to any of these interpretations of user. Given the requirements for an adequate queueing algorithm, coupled with the definitions of *fairness* and *user*, we now turn to the description of our fair queueing algorithm.

Definition

It is simple to allocate buffer space fairly by dropping packets, when necessary, from the conversation with the largest queue. Allocating bandwidth fairly is less straightforward. Pure round-robin service provides a fair allocation of packets-sent but fails to guarantee a fair allocation of bandwidth because of variations in packet sizes. To see how this unfairness can be avoided, we first consider a hypothetical service discipline where transmission occurs in a bit-by-bit round-robin (BR) fashion (as in a head-of-queue processor sharing discipline). This service discipline allocates bandwidth fairly since at every instant in time each conversation is receiving its fair share. Let $R(t)$ denote the number of rounds made in the round-robin service discipline up to time t ($R(t)$ is a continuous function, with the fractional part indicating partially completed rounds). Let $N_{ac}(t)$ denote the number of active conversations, i.e. those that have bits in their queue at time t . Then, $\partial R/\partial t = \mu/N_{ac}(t)$, where μ is the linespeed of the gateway's outgoing line (we will, for convenience, work in units such that $\mu=1$). A packet of size P whose first bit gets serviced at time t_0 will have its last bit serviced P rounds later, at time t such that $R(t)=R(t_0)+P$. Let t_i^α be the time that packet i belonging to conversation α arrives at the gateway, and define the numbers S_i^α and F_i^α as the values of $R(t)$ when the packet started and finished service. With P_i^α denoting the size of the packet, the following relations hold: $F_i^\alpha = S_i^\alpha + P_i^\alpha$ and $S_i^\alpha = \text{MAX}(F_{i-1}^\alpha, R(t_i^\alpha))$. Since $R(t)$ is a strictly monotonically increasing function whenever there are bits at the gateway, the ordering of the F_i^α values is the same as the ordering of the finishing times of the various packets in the BR discipline.

Sending packets in a bit-by-bit round-robin fashion, while satisfying our requirements for an adequate queueing algorithm, is obviously unrealistic. We hope to emulate this impractical algorithm by a practical packet-by-packet transmission scheme. Note that the functions $R(t)$ and $N_{ac}(t)$ and the quantities S_i^α and F_i^α depend only on the packet arrival times t_i^α and not on the actual packet transmission times, as long as we define a conversation to be active whenever $R(t) \leq F_i^\alpha$ for $i = \text{MAX}(j | t_j^\alpha \leq t)$. We are thus free to use these quantities in defining our packet-by-packet transmission algorithm. A natural

way to emulate the bit-by-bit round-robin algorithm is to let the quantities F_i^α define the sending order of the packets. Our packet-by-packet transmission algorithm is simply defined by the rule that, whenever a packet finishes transmission, the next packet sent is the one with the smallest value of F_i^α . The continuity requirement mentioned earlier can be restated precisely as demanding that the relative transmission priorities depend continuously on the packet arrival times. The fact that the F_i^α s depend continuously on the t_i^α s means that our algorithm satisfies this continuity requirement.

In a preemptive version of this algorithm, newly arriving packets whose finishing number F_i^α is smaller than that of the packet currently in transmission preempt the transmitting packet. For practical reasons, we have implemented the nonpreemptive version, but the preemptive algorithm (with resumptive service) is more tractable analytically. Clearly the preemptive and nonpreemptive packetized algorithms do not give the same instantaneous bandwidth allocation as the BR version. However, for each conversation the total bits sent at a given time by these three algorithms are always within P_{\max} of each other, where P_{\max} is the maximum packet size (this emulation discrepancy bound is proved in Greenberg and Madras (1990)). Thus, over sufficiently long conversations, the packetized algorithms asymptotically approach the fair bandwidth allocation of the BR scheme.

Recall that a user's request for promptness is not made explicit. The IP protocol (USC Information Sciences Institute, 1981a) does have a field for type-of-service, but not enough applications make intelligent use of this option to render it a useful hint. Consequently, promptness allocation must be based solely on data already available at the gateway. One such allocation strategy is to give more promptness (less delay) to users who use less than their fair share of bandwidth. Separating the promptness allocation from the bandwidth allocation can be accomplished by introducing a nonnegative parameter δ , and defining a new quantity, the *bid* B_i^α , via $B_i^\alpha = P_i^\alpha + \text{MAX}(F_{i-1}^\alpha, R(t_i^\alpha) - \delta)$. The quantities $R(t)$, $N_{ac}(t)$, F_i^α and S_i^α remain as before, but now the sending order is determined by the B s, not the F s. The asymptotic bandwidth allocation is independent of δ , since the F s control the bandwidth allocation, but the algorithm gives slightly faster service to packets that arrive at an inactive conversation. The parameter δ controls the extent of this additional promptness. Note that the bid B_i^α is continuous in t_i^α , so that the aforementioned continuity requirement is met.

The role of this term δ can be seen more clearly by considering the two extreme cases $\delta=0$ and $\delta=\infty$. If an arriving packet has $R(t_i^\alpha) \leq F_{i-1}^\alpha$, then the conversation α is active (i.e. the corresponding conversation in the BR algorithm would have bits in the queue). In this case, the value of δ is irrelevant and the bid number depends only on the finishing number of the previous packet. However, if $R(t_i^\alpha) > F_{i-1}^\alpha$, so that the α conversation is inactive, the two cases are quite different. With $\delta=0$, the bid number is given by $B_i^\alpha = P_i^\alpha + R(t_i^\alpha)$ and is completely independent of the previous history of user α . With $\delta=\infty$, the bid number is $B_i^\alpha = P_i^\alpha + F_{i-1}^\alpha$ and depends only the previous packet's finishing number, no matter how many rounds ago. For intermediate values of δ , scheduling decisions for packets arriving at inactive conversations depend on the previous packet's finishing round as long as it was not too long ago, and δ controls how far back this dependence goes.

Recall that when the queue is full and a new packet arrives, the last packet from the conversation currently using the most buffer space is dropped. We have chosen to leave

the quantities F_i^α and S_i^α unchanged when we drop a packet. This provides a small penalty for ill-behaved hosts, in that they will be charged for throughput that, because of their own poor flow control, they could not use. Subsequent work (Heybey and Davin, 1989) raises questions about the desirability of this aspect of our algorithm.

Performance

The desired bandwidth and buffer allocations are completely specified by the definition of fairness, and we have demonstrated that our algorithm achieves those goals. However, we have not been able to characterize the promptness allocation for an arbitrary arrival stream of packets. To obtain some quantitative results on the promptness, or delay, performance of a single FQ gateway, we consider a very restricted class of arrival streams in which there are only two types of sources. There are FTP-like file transfer sources, which always have ready packets and transmit them whenever permitted by the source flow control (which, for simplicity, is taken to be sliding window flow control), and there are Telnet-like interactive sources, which produce packets intermittently according to some unspecified generation process. What are the quantities of interest? An FTP source is typically transferring a large file, so the quantity of interest is the transfer time of the file, which for asymptotically large files depends only on the bandwidth allocation. Given the configuration of sources this bandwidth allocation can be computed *a priori* by using the fairness property of FQ gateways. The interesting quantity for Telnet sources is the average delay of each packet, and it is for this quantity that we now provide a rather limited result.

Consider a single FQ gateway with N FTP sources sending packets of size P_F , and allow a single packet of size P_T from a Telnet source to arrive at the gateway at time t . It will be assigned a bid number $B=R(t) + P_T - \delta$; thus, the dependence of the queueing delay on the quantities P_T and δ is only through the combination $P_T - \delta$. We will denote the queueing delay of this packet by $\phi(t)$, which is a periodic function with period NP_F . We are interested in the average queueing delay Δ

$$\Delta \equiv \frac{1}{NP_F} \int_0^{NP_F} \phi(t) dt$$

The finishing numbers F_i^α for the N FTPs can be expressed, after perhaps renumbering the packets, by $F_i^\alpha = (i+l^\alpha)P_F$, where the l s obey $0 \leq l^\alpha < 1$. The queueing delay of the Telnet packet depends on the configuration of l s whenever $P_T < P_F$. One can show that the delay is bounded by the extremal cases of $l^\alpha = 0$ for all α and $l^\alpha = \alpha/N$ for $\alpha = 0, 1, \dots, N-1$. The delay values for these extremal cases are straightforward to calculate; for the sake of brevity we omit the derivation and merely display the result below. The average queueing delay is given by $\Delta = A(P_T - \delta)$, where the function $A(P)$, the delay with $\delta = 0$, is defined below (with integer k and small constant ϵ , $0 \leq \epsilon < 1$, defined via $P_T = P_F(k + \epsilon)/N$).

Preemptive

$$\begin{aligned}
A(P) &= N\left(P - \frac{P_F}{2}\right) \text{ for } P \geq P_F \\
N\left(P - \frac{P_F}{2}\right) &\leq A(P) \leq \frac{NP^2}{2P_F} \text{ for } P_F \geq P \geq \frac{P_F}{2}\left(1 + \frac{1}{N}\right) \\
\frac{1}{2P_F}\left(\frac{P_F}{2} + N\left(P - \frac{P_F}{2}\right)\right)^2 &\leq A(P) \leq \frac{NP^2}{2P_F} \text{ for } \frac{P_F}{2}\left(1 + \frac{1}{N}\right) \geq P \geq \frac{P_F}{2}\left(1 - \frac{1}{N}\right) \\
0 &\leq A(P) \leq \frac{NP^2}{2P_F} \text{ for } \frac{P_F}{2}\left(1 - \frac{1}{N}\right) \geq P
\end{aligned}$$

Nonpreemptive

$$\begin{aligned}
A(P) &= N\left(P - \frac{P_F}{2}\right) \text{ for } P \geq P_F \\
N\left(P - \frac{P_F}{2}\right) &\leq A(P) \leq \frac{P_F}{2}\left\{1 + \frac{1}{N}[k^2 + k(2\epsilon - 1)]\right\} \text{ for } P_F \geq P \geq \frac{P_F}{2}\left(1 + \frac{1}{N}\right) \\
\frac{P_F}{2} &\leq A(P) \leq \frac{P_F}{2}\left\{1 + \frac{1}{N}[k^2 + k(2\epsilon - 1)]\right\} \text{ for } \frac{P_F}{2}\left(1 + \frac{1}{N}\right) \geq P
\end{aligned}$$

Now consider a general Telnet packet generation process (ignoring the effects of flow control) and characterize this generation process by the function $D_0(P_T)$ which denotes the queuing delay of the Telnet source when it is the sole source at the gateway. In the BR algorithm, the queuing delay of the Telnet source in the presence of N FTP sources is merely $D_0[(N+1)P_T]$. For the packetized preemptive algorithm with $\delta=0$, we can express the queuing delay in the presence of N FTP sources, call it $D_N(P_T)$, in terms of D_0 via the relation (averaging over all relative synchronizations between the FTPs and the Telnet)

$$D_N(P_T) = D_0[(N+1)P_T] + A(P_T)$$

where the term $A(P_T)$ reflects the extra delay incurred when emulating the BR algorithm by the preemptive packetized algorithm.

For nonzero values of δ , the generation process must be further characterized by the quantity $I_0(P_T, t)$ which, in a system where the Telnet is the sole source, is the probability that a packet arrives at a queue which has been idle for time t . The delay is given by

$$D_N(P_T) = D_0[(N+1)P_T] + A(P_T) - \int_0^\infty I_0[(N+1)P_T, t] \left\{ A(P_T) - A\left[P_T - \text{MIN}\left(\frac{t}{N}, \delta\right)\right] \right\} dt$$

where the last term represents the reduction in delay due the nonzero δ . These expressions for D_N , which were derived for the preemptive case, are also valid for the nonpreemptive algorithm when $P_T \geq P_F$.

What do these forbidding formulae mean? Consider, for concreteness, a Poisson arrival process with arrival rate λ , packet sizes $P_T = P_F = P$, a linespeed $\mu = 1$ and an FTP synchronization described by $l^\alpha = \alpha/N$ for $\alpha = 0, 1, \dots, N-1$. Define ρ to be the average bandwidth of the stream, measured relative to the fair share of the Telnet: $\rho = \lambda P(N+1)$. Then, for the nonpreemptive algorithm,

$$\frac{D_N(P)}{P} = \frac{\rho}{2(1-\rho)} + \frac{N\rho}{2} + N(1-\rho) \left(\frac{1}{2} - \frac{(N+1)}{N\rho} \left[1 - \exp \left\{ - \frac{\rho N}{(N+1)} \text{MIN} \left[\frac{\delta}{P}, \frac{1}{2} \left(1 - \frac{1}{N} \right) \right] \right\} \right] \right)$$

This equation represents the throughput/delay curve the FQ gateway offers the Poisson Telnet source (the formulae for different FTP synchronizations are substantially more complicated, but have the same qualitative behavior). This throughput/delay curve can be contrasted with that offered by an FCFS gateway; however, the FCFS results depend in detail on the flow control used by the FTP sources and on the surrounding network environment. We consider a network where all other communications speeds are infinitely fast in relation to the outgoing linespeed of the gateway, and where the FTPs all use sliding window flow control with window size W , so there are always NW FTP packets in the queue or in transmission. Figure 1 shows the throughput/delay curves of such a system with parameters $N=3$ and $W=5$ for both an FCFS gateway and an FQ gateway with $\delta=0$ and $\delta=P$. For $\rho \rightarrow 0$, FCFS gives a large queueing delay of $(NW - \frac{1}{2})P$, whereas FQ gives a queueing delay of $NP/2$ for $\delta=0$ and $P/2$ for $\delta=P$. This ability to provide a lower delay to lower throughput sources, completely independent of the window sizes of the FTPs, is one of the most important features of fair queueing. Note also that the FQ queueing delay diverges as $\rho \rightarrow 1$, reflecting FQ's insistence that no conversation gets more than its fair share. In contrast, the FCFS curve remains finite for all $\rho < (N+1)$, showing that an ill-behaved source can consume an arbitrarily large fraction of the bandwidth.

What happens in a network of FQ gateways? There are few results here, but Hahne (1986) has shown that for strict round-robin service gateways and only FTP sources there is fair allocation of bandwidth (in the multiple resource sense) when the window sizes are sufficiently large. She also provides examples where insufficient window sizes, but much larger than the communication path, result in unfair allocations. We believe, but have been unable to prove, that both of these properties hold for our fair queueing scheme.

FLOW CONTROL ALGORITHMS

Flow control algorithms are both the benchmarks against which the congestion control properties of fair queueing are measured, and also the environment in which FQ gateways will operate. We already know that, when combined with FCFS gateways, these flow control algorithms all suffer from the fundamental problem of vulnerability to ill-behaving sources. Also, there is no mechanism for separating the promptness allocation from the bandwidth and buffer allocation. The remaining question is then how fairly do these flow control algorithms allocate bandwidth. Before proceeding, note that there are really two distinct problems in controlling congestion. Congestion *recovery* allows a system to recover from a badly congested state, whereas congestion *avoidance* attempts to prevent the congestion from occurring (Jain and Ramakrishnan, 1988). In this paper, we are focusing on congestion *avoidance* and will not discuss congestion *recovery* mechanisms at length.

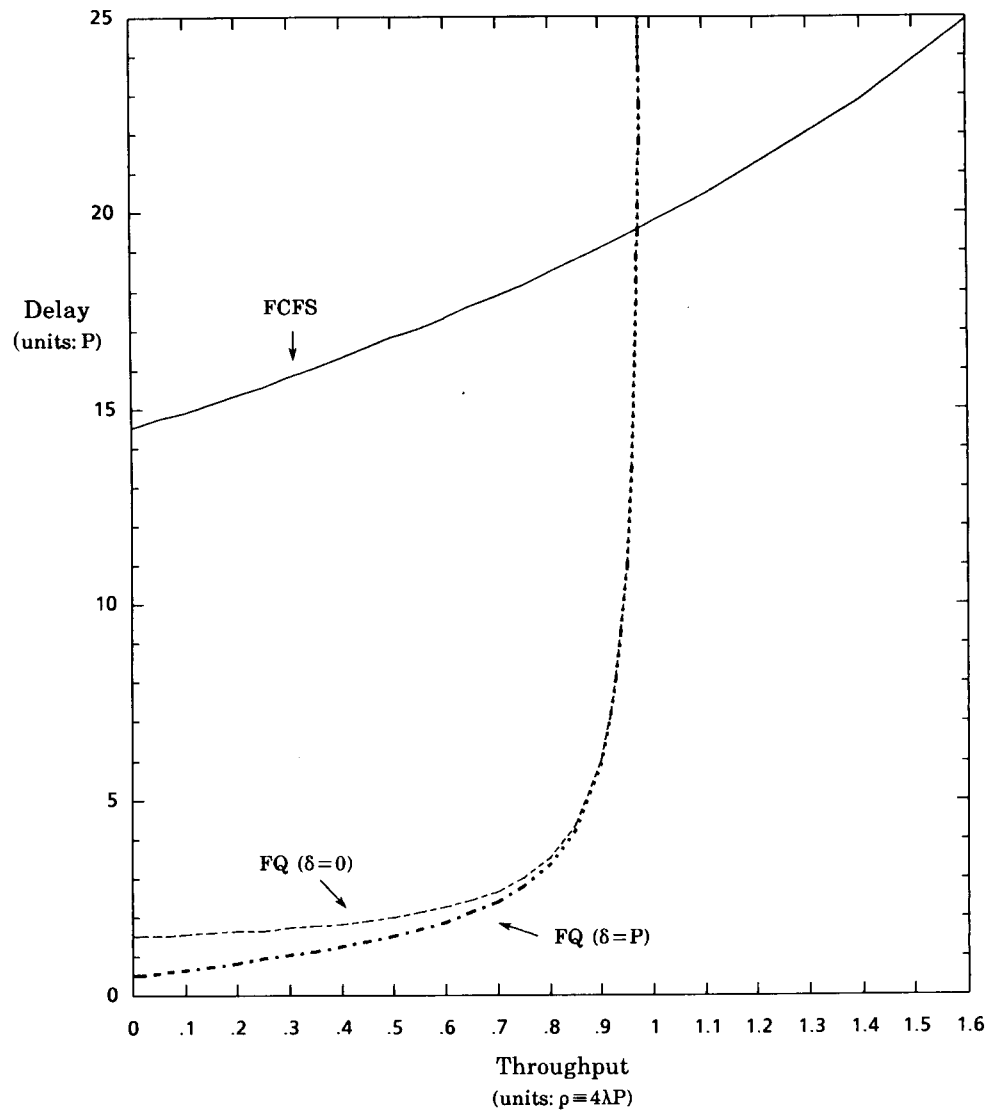


Figure 1. Queueing delay vs. throughput for a single Poisson Telnet source sharing a gateway with three FTP sources; the linespeed $\mu=1$ and all packets are of size P

A generic version of source flow control, as implemented in XNS's SPP (Xerox Corporation, 1981) or in TCP (USC Information Sciences Institute, 1981b) has two parts. There is a timeout mechanism, which provides for congestion recovery, whereby packets that have not been acknowledged before the timeout period are retransmitted (and a new timeout period set). The timeout periods are given by βrtt where typically $\beta \sim 2$ and rtt is the exponentially averaged estimate of the round trip time (the rtt estimate for retransmitted packets is the time from their first transmission to their acknowledgement). The congestion avoidance part of the algorithm is sliding window flow control, with some

set window size. The algorithm has a very narrow range of validity, in that it avoids congestion if the window sizes are small enough, and provides efficient service if the windows are large enough, but cannot respond adequately if either of these conditions is violated.

The second generation of flow control algorithms, exemplified by Jacobson and Karels' (JK) modified TCP (Jacobson, 1988) and the original DECbit proposal (Jain and Ramakrishnan, 1988; Ramakrishnan and Jain, 1988; Chiu and Jain, 1989) are descendants of the above generic algorithm with the added feature that the window size is allowed to respond dynamically in response to network congestion. JK also has, among other changes, fast retransmits in response to duplicate acknowledgements and substantial modifications to the timeout calculation (Jacobson, 1988; Karn and Partridge, 1987). The algorithms use different signals for congestion; JK uses timeouts and duplicate acknowledgements whereas DECbit uses a header bit which is set by the gateway on all packets whenever the average queue length is greater than one. These mechanisms attempt to allocate window sizes fairly, but the relation $Throughput = Window / RoundTrip$ implies that conversations with different paths receive different bandwidths.

The third generation of flow control algorithms are similar to the second, except that now the congestion signals are sent selectively. For instance, the selective DECbit proposal (Ramakrishnan, Chiu and Jain, 1987) has the gateway measure the flows of the various conversations and only send congestion signals to those users who are using more than their fair share of bandwidth. This algorithm is designed to correct the previous unfairness for sources using different paths (see Ramakrishnan, Chiu and Jain (1987) and our simulation results below), and appears to offer reasonably fair and efficient congestion control in many networks. The DEC algorithm controls the delay by attempting to keep the average queue size close to one. However, it does not allow individual users to make different delay/throughput tradeoffs; the collective tradeoff is set by the gateway.

SIMULATIONS

In this section we compare the various congestion control mechanisms, and try to illustrate the interplay between the queueing and flow control algorithms. We simulated these algorithms at the packet level using the REAL network simulator (Keshav, 1988) which is built on the Nest network simulation tool (Bacon *et al.*, 1988). In order to compare the FQ and FCFS gateway algorithms in a variety of settings, we selected several different flow control algorithms: the generic one described above, JK flow control, and the selective DECbit algorithm (with the capacity factor parameter set to 0.9). To enable DECbit flow control to operate with FQ gateways, we developed a bit-setting FQ algorithm in which the congestion bits are set whenever the source's queue length is greater than $\frac{1}{3}$ of its fair share of buffer space (note that this is a much simpler bit-setting algorithm than the DEC scheme, which involves complicated averages; however, the choice of $\frac{1}{3}$ is completely *ad hoc*). The Jacobson/Karels flow control algorithm is defined by the 4.3BSD TCP implementation. This code deals with many issues unrelated to congestion control. Rather than using that code directly in our simulations, we have chosen to model the JK algorithm by adding many of the congestion control ideas found in that code, such as adjustable windows, better timeout calculations, and fast retransmit to our generic flow control algorithm. Our implementation of Selective DECbit is based

Table I. Algorithm combinations

Label	Flow control	Queueing algorithm
G/FCFS	Generic	FCFS
G/FQ	Generic	FQ
JK/FCFS	JK	FCFS
JK/FQ	JK	FQ
DEC/DEC	DECbit	Selective DECbit
DEC/FQbit	DECbit	FQ with bit setting

on the description of the algorithm in Ramakrishnan, Chiu and Jain (1987) and Jain, Ramakrishnan and Chiu (1987). The various cases of test algorithms are labeled in Table I.

Rather than test this set of algorithms on a single *representative* network and load, we chose to define a set of *benchmark* scenarios, each of which, while somewhat unrealistic in itself, serves to illuminate a different facet of congestion control. The load on the network consists of a set of Telnet and FTP conversations. Each conversation consists of a source-sink pair. The Telnet sources generate 40 byte packets by a Poisson process with a mean interpacket interval of 5 seconds. The FTPs have an infinite supply of 1000 byte packets that are sent as fast as flow control allows. Both FTPs and Telnets have their maximum window size set to 5, and the acknowledgement (ACK) packets sent back from the receiving sink are 40 bytes. The small size of Telnet packets relative to the FTP packets makes the effect of δ insignificant, so the FQ algorithm was implemented with $\delta=0$. The gateways have finite buffers which, for convenience, are measured in packets rather than bytes. The system was allowed to stabilize for the first 1500 seconds, and then data was collected over the next 500 second interval. For each scenario, there is a Figure depicting the corresponding network layout, and a Table containing the data. There are four performance measures for each conversation: total throughput (number of packets reaching destination), average round trip time of the packets (as measured by the flow control's roundtrip estimator), number of packet retransmissions, and number of dropped packets. We do not include confidence intervals for the data, but repetitions of the simulations have consistently produced results that lead to the same qualitative conclusions.

We first considered several single-gateway networks. The first scenario (Figure 2 and Table II) has two FTP sources and two Telnet sources sending to a sink through a single bottleneck gateway. Note that, in this underloaded case, all of the algorithms provide fair bandwidth allocation, but the cases with FQ provide much lower Telnet delay than those with FCFS. Selective DECbit gives an intermediate value for the Telnet delay, since the flow control is designed to keep the average queue length small.

Scenario 2 (Figure 3 and Table III) involves 6 FTP sources and 2 Telnet sources again sending through a single gateway. The gateway, with a buffer size of only 15, is substantially over-loaded. This scenario probes the behavior of the algorithms in the presence of severe congestion.

When FCFS gateways are paired with generic flow control, the sources segregate into *winners*, who consume a large amount of bandwidth, and *losers*, who consume very little.

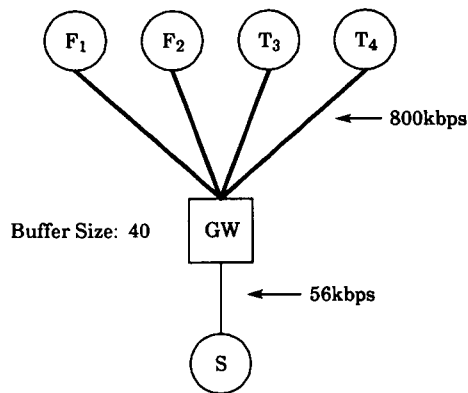


Figure 2. Scenario 1

Table II. Scenario 1

Quantity	Policy	FTP		Telnet	
		1	2	3	4
Throughput (packets)	G/FCFS	1746	1746	99	96
	G/FQ	1746	1746	102	94
	JK/FCFS	1747	1745	102	104
	JK/FQ	1746	1746	105	103
	DEC/DEC	1746	1746	97	98
	DEC/FQbit	1745	1746	83	88
Average round-trip time	G/FCFS	1.43	1.43	1.36	1.35
	G/FQ	1.43	1.43	0.079	0.091
	JK/FCFS	1.43	1.43	1.35	1.36
	JK/FQ	1.43	1.43	0.084	0.089
	DEC/DEC	0.286	0.286	0.206	0.218
	DEC/FQbit	1.38	1.39	0.088	0.074
Retransmitted packets	G/FCFS	0	0	0	0
	G/FQ	0	0	2	1
	JK/FCFS	0	0	0	0
	JK/FQ	0	0	0	0
	DEC/DEC	0	0	0	0
	DEC/FQbit	0	0	0	0
Dropped packets	G/FCFS	0	0	0	0
	G/FQ	0	0	0	0
	JK/FCFS	0	0	0	0
	JK/FQ	0	0	0	0
	DEC/DEC	0	0	0	0
	DEC/FQbit	0	0	0	0

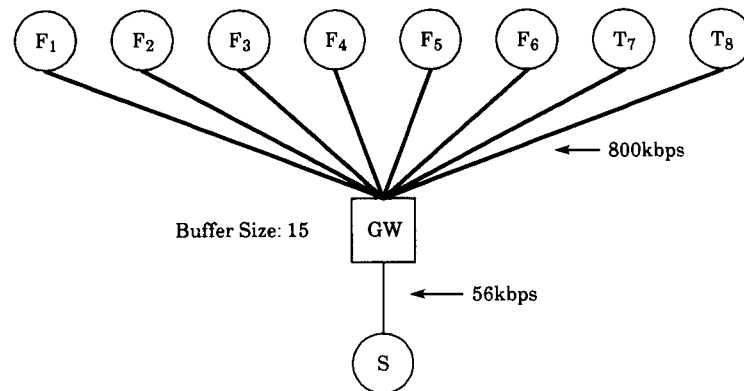


Figure 3. Scenario 2

This phenomenon develops because the queue is almost always full. The ACK packets received by the *winners* serve as a signal that a buffer space has just been freed, so their packets are rarely dropped. The *losers* are usually retransmitting, at essentially random times, and thus have most of their packets dropped. The combination of JK flow control with FCFS gateways produces fair bandwidth allocation among the FTP sources, but the Telnet sources are almost completely shut out. This is because the JK algorithm ensures that the gateway's buffer is usually full, causing most of the Telnet packets to be dropped.

When generic flow control is combined with FQ, the strict segregation disappears. However, the bandwidth allocation is still rather uneven, and the useful bandwidth (rate of nonduplicate packets) is 13 per cent below optimal. Both of these facts are due to the inflexibility of the generic flow control, which is unable to reduce its load enough to prevent dropped packets. This not only necessitates retransmissions but also, because of the crudeness of the timeout congestion recovery mechanism, prevents FTPs from using their fair share of bandwidth. In contrast, JK flow control combined with FQ produced reasonably fair and efficient allocation of the bandwidth. The lesson here is that fair queuing gateways by themselves do not provide adequate congestion control; they must be combined with intelligent flow control algorithms at the sources. Also, note that when FQ gateways are used with either generic or JK flow control, the Telnet sources receive full throughput and relatively low delay.

The selective DECbit algorithm manages to keep the bandwidth allocation perfectly fair, and there are no dropped packets or retransmissions. The addition of FQ to the DECbit algorithm retains the fair bandwidth allocation and, in addition, lowers the Telnet delay by a factor of 9. Thus, for each of the three flow control algorithms, replacing FCFS gateways with FQ gateways generally improved the FTP performance and dramatically improved the Telnet performance of this extremely overloaded network.

In scenario 3 (Figure 4 and Table IV) there is a single FTP and a single Telnet competing with an ill-behaved source. This ill-behaved source has no flow control and is sending packets at twice the rate of the gateway's outgoing line. With FCFS, the FTP and Telnet are essentially shut out by the ill-behaved source. With FQ, they obtain their fair share of bandwidth. Moreover, the ill-behaved host gets much less than its fair share, since when it has its packets dropped it is still charged for that throughput. Thus, FQ

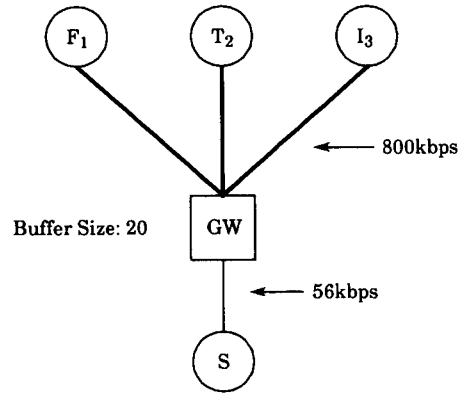


Figure 4. Scenario 3

Table IV. Scenario 3

Quantity	Policy	FTP	Telnet	Ill-
		1	2	behaved 3
Throughput (packets)	G/FCFS	3	11	3497
	G/FQ	3491	95	5
	JK/FCFS	0	0	3500
	JK/FQ	3489	110	6
	DEC/DEC	0	0	3500
	DEC/FQbit	3489	108	5
Average round-trip time	G/FCFS	1362	2.87	2.97
	G/FQ	0.716	0.080	903
	JK/FCFS	—	—	2.83
	JK/FQ	0.716	0.085	860
	DEC/DEC	—	—	2.85
	DEC/FQbit	0.626	0.077	918
Retransmitted packets	G/FCFS	7	139	0
	G/FQ	0	2	0
	JK/FCFS	2	0	0
	JK/FQ	0	0	0
	DEC/DEC	1	1	0
	DEC/FQbit	0	0	0
Dropped packets	G/FCFS	7	127	3504
	G/FQ	0	0	6995
	JK/FCFS	2	0	3500
	JK/FQ	0	0	6994
	DEC/DEC	1	1	3500
	DEC/FQbit	0	0	6994

gateways are effective *firewalls* that can protect users, and the rest of the network, from being damaged by ill-behaved sources. Whereas scenario 2 showed that FQ gateways cannot control congestion by themselves, this scenario suggests that FQ gateways can control the *effect* of congestion.

We have argued for the importance of considering a heterogeneous set of flow control mechanisms. Scenario 4 (Figure 5 and Table V) has a single gateway with two pairs of FTP sources, employing generic and JK flow control, respectively. With an FCFS gateway, the generic flow controlled pair has higher throughput than the JK pair. However, with an FQ gateway, the situation is reversed (and the generic sources have segregated). Note that the FQ gateway has provided incentive for sources to implement JK or some other intelligent flow control, whereas the FCFS gateway makes such a move sacrificial.

Certainly not all of the relevant behavior of these algorithms can be gleaned from single gateway networks. Scenario 5 (Figure 6 and Table VI) has a multinode network with four FTP sources using different network paths. Three of the sources have short nonoverlapping conversations and the fourth source has a long path that intersects each of the short paths. When FCFS gateways are used with generic or JK flow control, the

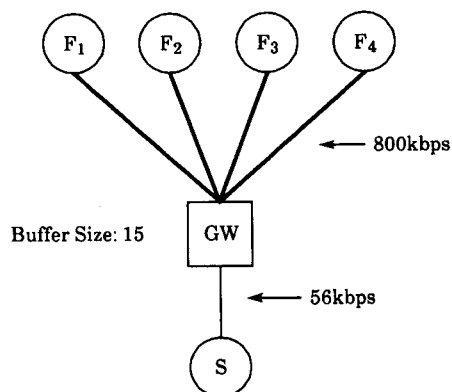


Figure 5. Scenario 4

Table V. Scenario 4

Quantity	Queuing Policy	Generic FTP		JK FTP	
		1	2	3	4
Throughput (packets)	FQ	1162	12	1163	1163
	FCFS	1182	1182	569	567
Average round-trip time	FQ	2.15	281	2.14	2.14
	FCFS	2.11	2.11	2.07	2.16
Retransmitted packets	FQ	1	5	2	2
	FCFS	0	0	47	47
Dropped packets	FQ	1	1	2	2
	FCFS	0	0	48	48

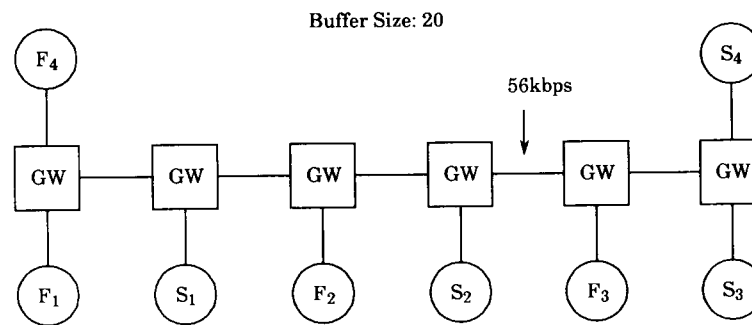


Figure 6. Scenario 5

Table VI. Scenario 5

Quantity	Policy	FTP			
		1	2	3	4
Throughput (packets)	G/FCFS	2500	2500	2500	1000
	G/FQ	1750	1750	1750	1750
	JK/FCFS	2500	2500	2500	1000
	JK/FQ	1750	1750	1750	1750
	DEC/DEC	1683	1684	1682	1202
	DEC/FQbit	1750	1750	1750	1750
Average round-trip time	G/FCFS	1.00	1.00	1.00	2.5
	G/FQ	1.43	1.43	1.43	1.43
	JK/FCFS	1.00	1.00	1.00	2.5
	JK/FQ	1.43	1.43	1.43	1.43
	DEC/DEC	0.520	0.520	0.520	1.05
	DEC/FQbit	1.29	1.29	1.29	1.43
Retransmitted packets	G/FCFS	0	0	0	0
	G/FQ	0	0	0	0
	JK/FCFS	0	0	0	0
	JK/FQ	0	0	0	0
	DEC/DEC	0	0	0	0
	DEC/FQbit	0	0	0	0
Dropped packets	G/FCFS	0	0	0	0
	G/FQ	0	0	0	0
	JK/FCFS	0	0	0	0
	JK/FQ	0	0	0	0
	DEC/DEC	0	0	0	0
	DEC/FQbit	0	0	0	0

conversation with the long path receives less than 60 per cent of its fair share. With FQ gateways, it receives its full fair share. The selective DECbit algorithm, in keeping the average queue size small, wastes roughly 18 per cent of the bandwidth. However, the algorithm gives a significant improvement in fairness over the other FCFS algorithms. Some, but not all, of the residual unfairness is due to the restrictive maximum window

size (5) and the value of the capacity factor (0.9) we used in the Selective DECbit algorithm. Note that the Selective DECbit results reported here differ from those reported in Demers, Keshav and Shenker (1989) which are incorrect.

Scenario 6 (Figure 7 and Table VII) involves a more complicated network, combining lines of several different bandwidths. None of the gateways are overloaded so all combinations of flow control and queueing algorithms function smoothly. With FCFS, sources 4 and 8 are not limited by the available bandwidth, but by the delay their ACK packets incur waiting behind FTP packets. The total throughput increases when the FQ gateways are used because the small ACK packets are given priority.

For the sake of clarity and brevity, we have presented a fairly clean and uncomplicated view of network dynamics. We want to emphasize that there are many other scenarios, not presented here, where the simulation results are confusing and apparently involve complicated dynamic effects. These results do not call into question the efficacy and desirability of fair queueing, but they do challenge our understanding of the collective behavior of flow control algorithms in networks.

DISCUSSION

In an FCFS gateway, the queueing delay of packets is, on average, uniform across all sources and directly proportional to the total queue size. Thus, achieving ambitious performance goals, such as low delay for Telnet-like sources, or even mundane ones, such as avoiding dropped packets, requires coordination among all sources to control the queue size. Having to rely on source flow control algorithms to solve this control problem,

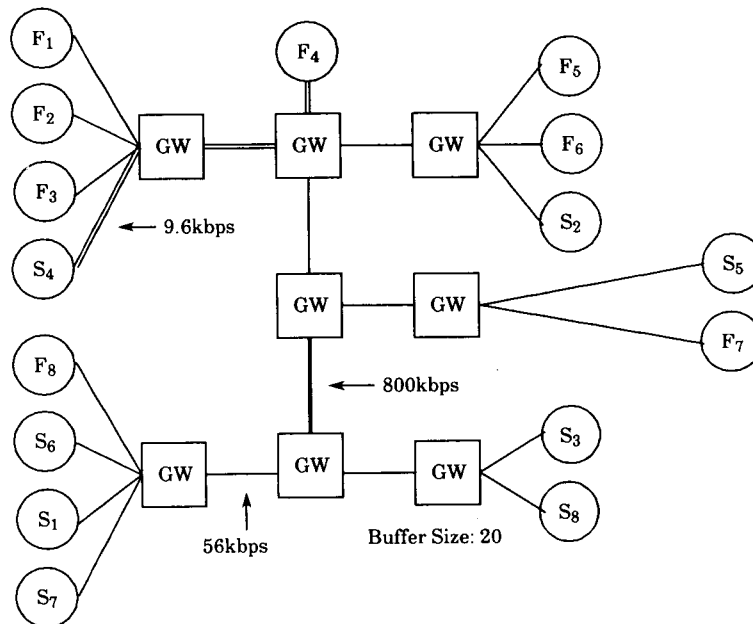


Figure 7. Scenario 6

which is extremely difficult in a maximally cooperative environment and impossible in a noncooperative one, merely reflects the inability of FCFS gateways to distinguish between users and to allocate bandwidth, promptness, and buffer space independently.

In the design of the fair queueing algorithm, we have attempted to address these issues. The algorithm does allocate the three quantities separately. Moreover, the promptness allocation is not uniform across users and is somewhat tunable through the parameter δ . Most importantly, fair queueing creates a firewall that protects well-behaved sources from their uncouth brethren. Not only does this allow the current generation of flow control algorithms to function more effectively, but it creates an environment where users are rewarded for devising more sophisticated and responsive algorithms. The game-theoretic issue first raised by Nagle, that one must change the rules of the gateway's game so that good source behavior is encouraged, is crucial in the design of gateway algorithms (Nagle, 1987). A formal game-theoretic analysis of a simple gateway model (an exponential server with N Poisson sources) suggests that fair queueing algorithms make self-optimizing source behavior result in fair, protective, nonmanipulable, and stable networks; in fact, they may be the only reasonable queueing algorithms to do so (Shenker, 1989a).

Our calculations show that the fair queueing algorithm is able to deliver low delay to sources using less than their fair share of bandwidth, and that this delay is insensitive to the window size being used by the FTP sources. Furthermore, simulations indicate that, when combined with currently available flow control algorithms, FQ delivers satisfactory congestion control in a wide variety of network scenarios. The combination of FQ gateways and DECBIT flow control was particularly effective. However, these limited tests are in no way conclusive. We hope, in the future, to investigate the performance of FQ under more realistic load conditions, on larger networks, and interacting with routing algorithms. Also, we hope to explore new source flow control algorithms that are more attuned to the properties of FQ gateways.

In this paper we have compared our fair queueing algorithm with only the standard first-come-first-served queueing algorithm. We know of three other widely known queueing algorithm proposals. The first two were not intended as a general purpose congestion control algorithms. Prue and Postel (1988) have proposed a type-of-service priority queueing algorithm, but allocation is not made on a user-by-user basis, so fairness issues are not addressed. There is also the Fuzzball selective preemption algorithm (Mills and Braun, 1987; Mills, 1988) whereby the gateways allocate buffers fairly (on a source basis, over all of the gateway's outgoing buffers). This is very similar to our buffer allocation policy, and so can be considered a subset of our FQ algorithm. The Fuzzballs also had a form of type-of-service priority queueing but, as with the Prue and Postel algorithm, allocations were not made on a user-by-user basis. The third policy is the random-dropping (RD) buffer management policy in which, when the buffer is overloaded, the packet to be dropped is chosen at random (Mankin and Ramakrishnan, 1990). This algorithm greatly alleviates the problem of segregation. However, it is now generally agreed that the RD algorithm does not provide fair bandwidth allocation, is vulnerable to ill-behaved sources, and is unable to provide reduced delay to conversations using less than their fair share of bandwidth (Zhang, 1989; Shenker, 1989b; Hashem, 1989).

There are two objections that have been raised in conjunction with fair queueing. The first is that some source-destination pairs, such as file server or mail server pairs, need more than their fair share of bandwidth. There are several responses to this. First, FQ is no worse than the status quo. FCFS gateways already limit well-behaved hosts, using

the same path and having only one stream per source-destination pair, to their fair share of bandwidth. Some current bandwidth hogs achieve their desired level of service by opening up many streams, since FCFS gateways implicitly define streams as the unit of *user*. Note that there are no controls over this mechanism of gaining more bandwidth, leaving the network vulnerable to abuse. If desired, however, this same trick can be introduced into fair queueing by merely changing the notion of user. This would violate layering, which is admittedly a serious drawback. A better approach is to confront the issue of allocation directly by generalizing the fair queueing algorithm to allow for arbitrary bandwidth priorities. Assign each source-destination pair a number n_α which represents how many queue slots that conversation gets in the bit-by-bit round robin. The new relationships are $N_{ac} = \sum n_\alpha$ with the sum over all active conversations, and P_i^q is set to be $1/n_\alpha$ times the true packet length. Of course, the truly vexing problem is the politics of assigning the priorities n_α . Note that while we have described an extension that provides for different relative shares of bandwidth, one could also define these shares as absolute fractions of the bandwidth of the outgoing line. This would guarantee a minimum level of service for these sources, and is very similar to the *Virtual Clock* algorithm of Zhang (1989).

The other objection is that fair queueing requires the gateways to be smart and fast. There is the technological question of whether or not one can build FQ gateways that can match the bandwidth of fibers. If so, are these gateways economically feasible? We have no answers to these questions, and they do indeed seem to hold the key to the future of fair queueing.

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