

# Inferring Queue Sizes in Access Networks by Active Measurement

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**Abstract.** Router queues can impact both round-trip times and throughput. Yet little is publicly known about queue provisioning employed by Internet services providers for the routers that control the access links to home computers. This paper proposes QFind, a black-box measurement technique, as a simple method to approximate the size of the access queue at last mile router. We evaluate QFind through simulation, emulation, and measurement. Although precise access queue results are limited by receiver window sizes and other system events, we find there are distinct difference between DSL and cable access queue sizes.

## 1 Introduction

The current conventional wisdom is that over-provisioning in core network routers has moved Internet performance bottlenecks to network access points [1]. Since typical broadband access link capacities (hundreds of kilobytes per second) are considerably lower than Internet Service Provider (ISP) core router capacities (millions of kilobytes per second), last-mile access links need queues to accommodate traffic bursts. Given the bursty nature of Internet traffic [7] that is partially due to flows with high round-trip times or large congestion windows, it is clear that the provider's choice for access link queue size may have a direct impact on a flow's achievable bitrate. A small queue can keep achieved bitrates significantly below the available capacity, while a large queue can negatively impact a flow's end-to-end delay. Interactive applications, such as IP telephony and some network games, with strict delay bounds in the range of hundreds of milliseconds experience degraded Quality of Service when large access queues become saturated with other, concurrent flows.

Despite the importance of queue size to achievable throughput and added delay, there is little documentation on queue size settings in practice. Guidelines for determining the "best" queue sizes have often been debated on the e2e mailing list,<sup>1</sup> an active forum for network related discussion by researchers and

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<sup>1</sup> In particular, see the e2e list archives at: <ftp://ftp.isi.edu/end2end/end2end-interest-1998.mail> and <http://www.postel.org/pipermail/end2end-interest/2003-January-002702.html>.

practitioners alike. While general consensus has the access queue size ranging from one to four times the capacity-delay product of the link, measured round-trip times vary by at least two orders of magnitude (10 ms to 1 second) [6]. Thus, this research consensus provides little help for network practitioners to select the best size for the access queue link. Moreover, a lack of proper queue size information has ramifications for network simulations, the most common form of evaluation in the network research community, where access queue sizes are often chosen with no confidence that these queue choices accurately reflect current practices.

A primary goal of this investigation is to experimentally estimate the queue size of numerous access links, for both cable modem and DSL connections managed by a variety of ISPs. Network researchers should find these results useful in designing simulations that more accurately depict current practices.

## 2 QFind

Based on related work and pilot studies, the following assumptions are made in this study: each access link has a relatively small queue size - between 10 and 100 packets; the maximum queue length is independent of the access link capacity or other specific link characteristics; and the queue size is constant and independent of the incoming traffic load with no attempt made by the router to increase the queue sizes under heavier loads or when flows with large round-trip times are detected. Below is our proposed *QFind* methodology for inferring the access network queue size from an end-host:

1. Locate an Internet host that is slightly upstream of the access link while still being “close” to the end-host. For the test results discussed in this paper, the DNS name server provided by the ISP is used since DNS servers are typically close in terms of round-trip time and easy to find by inexperienced end-users.
2. Start a `ping` from the end-host to the close Internet host and let it run for up to a minute. The minimum value returned during this time is the baseline latency typically without any queuing delays since there is no competing traffic causing congestion. This `ping` process continues to run until the end of the experiment.
3. Download a large file from a remote server to the end-host. For the test results in this paper, a 5 MByte file was used since it typically provided adequate time for TCP to reach congestion avoidance and saturate the access queue downlink capacity.
4. Stop the `ping` process. Record the minimum and maximum round-trip times as reported by `ping` and the total time to download the large file. The maximum `ping` value recorded during the download typically represents the baseline latency plus the access link queuing delay.

The queue size of the access link can be inferred using the data obtained above. Let  $D_t$  be the total delay (the maximum delay seen by `ping`):

$$D_t = D_l + D_q \quad (1)$$

where  $D_l$  is the latency (the minimum delay seen by `ping`) and  $D_q$  is the queuing delay. Therefore:

$$D_q = D_t - D_l \quad (2)$$

Given throughput  $T$  (measured during the download), the access link queue size in bytes,  $q_b$ , can be computed by:

$$q_b = D_q \times T \quad (3)$$

For a packet size  $s$  (say 1500 bytes, a typical MTU), the queue size in packets,  $q_p$ , becomes:

$$q_p = \frac{(D_t - D_l) \times T}{s} \quad (4)$$

The strength of the QFind methodology lies in its simplicity. Unlike other approaches [1, 8, 10], QFind does not require custom end-host software, making it easier to convince volunteers to participate in an Internet study. Moreover, the simple methodology makes the results reproducible from user to user and in both simulation and emulation environments.

## 2.1 Possible Sources of Error

The maximum `ping` time recorded may be due to congestion on a queue other than the access queue. However, this is unlikely since the typical path from the end-host to the DNS name server is short. Pilot tests [3] suggest any congestion from the home node to the DNS name server typically causes less than 40 ms of added latency. Moreover, by having users repeat steps 2-4 of the QFind methodology multiple times (steps 2-4 take only a couple of minutes), apparent outliers can be discarded. This reduces the possibility of over-reporting queue sizes.

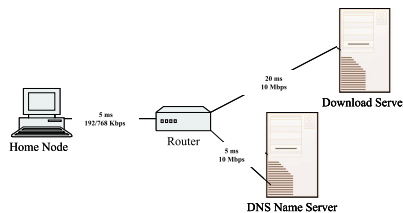
The queue size computed in Equation 4 may underestimate the actual queue size since it may happen that the `ping` packets always arrive to a nearly empty queue. However, if the file download is long enough, it is unlikely that every `ping` packet will be so lucky. Results in Section 3 suggest that the 5 MB file is of sufficient length to fill queues over a range of queue sizes.

If there is underutilization on the access link then the access queue will not build up and QFind may under-report the queue size. This can happen if there are sources of congestion at the home node network before `ping` packets even reach the ISP. Most notably, home users with wireless networks may have contention on the wireless medium between the `ping` and download packets. Pilot tests [3] suggest that congestion on a wireless network during QFind tests adds at most 30 ms to any recorded `ping` times. As 30 ms may be significant in computing an access queue size, we ask QFind volunteers to indicate wireless/wired settings when reporting QFind results.

If the TCP download is limited by the receiver advertised window instead of by the network congestion window, then the queue sizes reported may be the limit imposed by TCP and not be the access link queue. However, recent versions of Microsoft Windows as well as Linux support TCP window scaling (RFC 1323), allowing the receiver advertised window to grow up to 1 Gbyte. Even if window scaling is not used, it is still possible to detect when the receiver advertised window might limit the reported queue. The lack of `ping` packet losses during the download would suggest that the access queue was not saturated and the queue size could actually be greater than reported.

For actual TCP receiver window settings, Windows 98 has a default of 8192 bytes, Windows 2000 has a default of 17520 bytes, Linux has a default of 65535 bytes, and Windows XP may have a window size of 17520, but it also has a mostly undocumented ability to scale the receiver window size dynamically.

Additionally, some router interfaces may process `ping` packets differently than other data packets. However, in practice, hundreds of empirical measurements in [2] suggest `ping` packets usually provide round-trip time measurements that are effectively the same as those obtained by TCP.



**Fig. 1.** Topology

### 3 Experiments

To determine whether the QFind methodology could effectively predict access link queue sizes in real last-mile Internet connections, we evaluated the QFind approach first with simulations using NS<sup>2</sup> (see Section 3.1) and then emulations using NIST Net<sup>3</sup> (see Section 3.2). After reviewing these proof-of-concept results, we enlisted many volunteers from the WPI community to run QFind experiments over a variety of DSL and cable modem configurations from home (see Section 3.3).

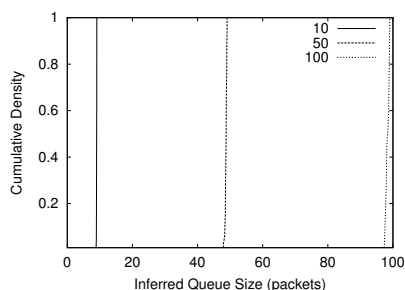
<sup>2</sup> <http://www.isi.edu/nsnam/ns/>

<sup>3</sup> <http://snad.ncsl.nist.gov/itg/nistnet/>

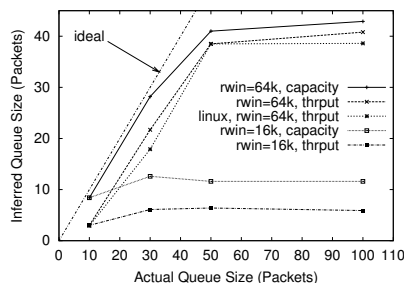
### 3.1 Simulation

QFind was simulated with the configuration depicted in Figure 1 consisting of a home node, an ISP last-mile access router, a TCP download server and a DNS name server. The simulated link latencies used in the emulations were based on prototype QFind measurements.

The delays built into the testbed emulations were 5 ms from home to router, 5 ms from router to DNS, and 20 ms from router to download server. Link capacities were set to reflect typical asymmetric broadband data rates [8], with the router-to-home downstream link capacity set at 768 Kbps, the home-to-router upstream link capacity set at 192 Kbps, and the link capacities in both directions between router and both upstream servers set at 10 Mbps. 1500 byte packets were used to model the typical Ethernet frame size found in home LANs and TCP receiver windows were set to 150 packets.



**Fig. 2.** Cumulative Density Functions of Inferred Queue Sizes for Actual Queue Sizes of 10, 50 and 100 Packets using NS Simulator



**Fig. 3.** Median of Inferred Queue Sizes versus Actual Queue Sizes using NIST Net Emulator

Figure 2 displays the cumulative density functions for 100 simulations of the QFind methodology (steps 2 to 4 in Section 2) with downstream access link queues of 10, 50 and 100 packets respectively. QFind predicts the access queue size remarkably well in this simulated environment. Of the 100 runs at each queue size, the *most* the predicted queue size was smaller than the actual queue size was 1 packet for the 10 packet queue, 1.5 packets for the 50 packet queue and 2.5 packets for the 100 packet queue. The median predicted queue size was less than the actual queue size by about 1 packet in all cases.

### 3.2 Emulation

To further investigate QFind feasibility, we setup a testbed to emulate a last-mile access router in a controlled LAN environment. Two computers were used as home nodes with one computer running Windows 2000 and the other running

Linux in order to test the impact of the operating system type on QFind. The download server ran on Windows Server 2003 while the DNS name server ran on Linux. A NIST Net PC router emulated the ISP's Internet connection with link capacities set to reflect typical broadband asymmetry with the downstream router-to-home link capacity set to 768 Kbps, the upstream home-to-router link set to 192 Kbps, and the router link capacities to and from both servers using 10 Mbps LAN connections. The home-to-server round-trip delay was 20 ms for both the download server and the DNS server since the NIST Net implementation does not allow two host pairs to have different induced delays while sharing a router queue.

Using this testbed, the QFind methodology was emulated (steps 2 to 4 in Section 2) with home nodes running Windows 2000 with a TCP receiver window size of 16 Kbytes, Windows 2000 with a TCP receiver window sizes set to 64 Kbytes, and Linux with a TCP receiver window sizes set to 64 Kbytes. Three QFind emulations were run for each of the queue sizes of 10, 30, 50 and 100 packets, with a packet size of 1500 bytes.

Figure 3 presents the median of the inferred queue sizes. The inferred queue sizes labeled "thrput" are computed using the measured download capacity. The inferred queue sizes labeled "capacity" are computed using the capacity of the link. In those cases where the NIST Net queue size is smaller than the TCP receiver window size, QFind is able to infer the queue size closely, even for different operating systems. The queue sizes computed using link capacity are more accurate than those computed using download throughput. However, while the link capacity was, of course, known by us for our testbed, it is not, in general, known by an end-host operating systems nor by most of the home users who participated in our study.

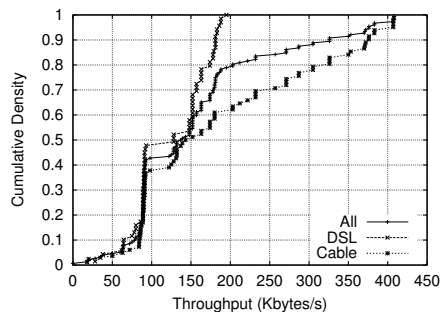
Intermediate results that can be drawn from these emulations even before evaluating actual QFind measurements include: the QFind emulation estimates of queue size are not as accurate as the simulation estimates; using the maximum link capacity provides a better estimate of the access queue size than using the measured download data rate; ping outliers in the testbed did not cause over prediction of the queue length; small TCP receiver windows result in significant underestimation of the access queue size since the ability of the download to fill the access queue is restricted by a small maximum TCP receiver window size setting.

### 3.3 Measurement

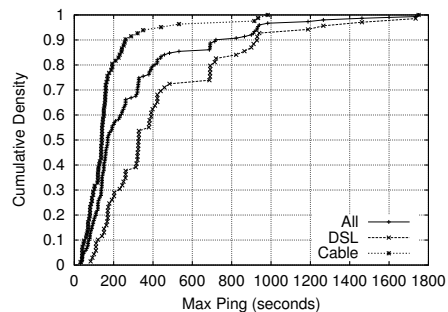
The final stage of this investigation involved putting together an easy-to-follow set of directions to be used by volunteers to execute three QFind experiments and record results such they could be easily emailed to a centralized repository. One of the key elements of the whole QFind concept was to develop a measurement procedure that could be run by a variety of volunteers using different cable and DSL providers on home computers with different speeds and operating systems. To maximize participation, the intent was to avoid having users download and run custom programs and avoid any changes to system configuration

settings (such as packet size or receiver window). The final set of instructions arrived upon can be found at: <http://www.cs.wpi.edu/~claypool/qfind/-instructions.html>.

During January 2004, we received QFind experimental results<sup>4</sup> from 47 Qfind volunteers, primarily from within the WPI CS community of undergraduate students, graduate students and faculty. These users had 16 different ISPs: Charter (16 users), Verizon (11), Comcast (4), Speakeasy (4), Earthlink (2), AOL (1), Winternat (1), RR (1), RCN (1), NetAccess (1), MTS (1), Cyberonic (1), Cox (1), Covad (1) and Adelphia (1). The QFind home nodes had 5 different operating systems: WinXP (18 users), Win2k (11), Linux (6), Mac OS-X (3), and Win98 (1) and 12 unreported. Approximately one-third of the volunteers had a wireless LAN connecting their home node to their broadband ISP.



**Fig. 4.** Cumulative Density Functions of Throughput



**Fig. 5.** Cumulative Density Functions of Max Ping Times

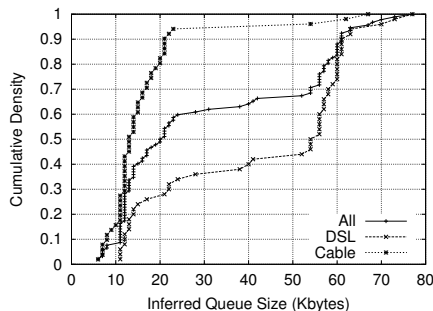
About 45% of the volunteers used DSL and 55% used cable modems. Figure 4 presents CDFs the throughput for all QFind tests, with separate CDFs for cable and DSL. The CDF for cable modems show a sharp increase corresponding to a standard 768 Kbps downlink capacity, which is also the median capacity. Above this median, however, the distributions separate with cable getting substantially higher throughput than DSL.

Figure 5 depicts CDFs of the maximum ping times reported for all QFind tests, with separate CDFs for cable and DSL. The median max ping time is about 200 ms, but is significantly higher for DSL (350 ms) than for cable (175 ms). Ping times of 350 ms are significant since this is enough delay to affect interactive applications [4, 5]. In fact, the entire body of the DSL CDF is to the right of the cable CDF, indicating a significant difference in the max ping times for DSL versus cable. Also, the maximum ping times for cable can be up to a second and can be well over a second for DSL, a detriment to any kind of real-time interaction.

<sup>4</sup> The QFind data we collected can be downloaded from <http://perform.wpi.edu/-downloads/#qfind>

In analyzing the full data set to infer queue sizes (see the analysis in [3]), it appeared QFind may not clearly distinguish delays from the access queue from other system delays. We noted considerable variance in inferred access queue sizes even for volunteers within the same provider, an unlikely occurrence given that ISP providers tend to standardize their equipment at the edge by home users. This suggests that for some experiment runs, the ping delays that QFind uses to infer the queue size are a result of something other than delay at the access queue.

To remove data that does not accurately report access queue sizes, we winnow the full data set by taking advantage of the fact that the QFind volunteers produced three measurements. For each user's three measurements, if any pair have throughputs that differ by more than 10% or maximum ping times that differ by more than 10%, then all three measurements are removed. This winnowing removed the data from 17 users and all subsequent analysis is based on this winnowed data set.



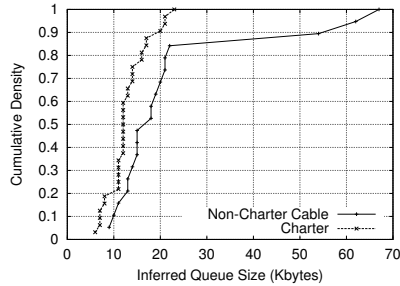
**Fig. 6.** Cumulative Density Functions of Access Queue Size Inferred by QFind

Figure 6 depicts a CDF of the access queue sizes measured by QFind, with separate CDFs for DSL and cable. There is a marked difference between the DSL and cable inferred queues, with cable having queue sizes under 20 Kbytes while DSL queues are generally larger. The steep increase in the DSL queue sizes around 60 Kbytes is near the limit of the receiver window size of most OSes (64 Kbytes), so the actual queue limits may be higher.

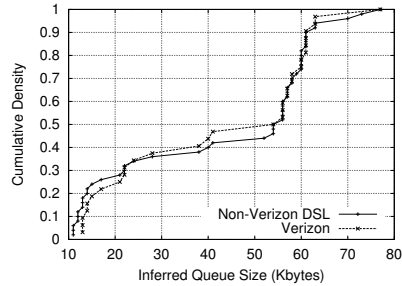
Figure 7 depicts CDFs for the access queue sizes for Charter,<sup>5</sup> the primary cable provider in our data set, and non-Charter cable customers. There are some marked differences in the distributions, with Charter cable queues appearing to be slightly smaller than non-Charter cable queues. The extremely large non-Charter cable queue reported above 0.8 is from one cable provider.

<sup>5</sup> <http://www.charter.com/>

Figure 8 depicts similar CDFs for the access queue sizes for Verizon,<sup>6</sup> the primary DSL provider in our data set, and non-Verizon DSL customers. Here, there are very few differences between the different DSL provider distributions, suggesting there may be common queue size settings across providers.



**Fig. 7.** Charter-Non-Charter: Inferred Access Queues



**Fig. 8.** Verizon-Non-Verizon: Inferred Access Queues

## 4 Summary

The QFind methodology for inferring queue sizes is attractive in several ways: 1) by using a standard `ping` and a download through a Web browser, QFind does not require any custom software or special end-host configuration; 2) by using a single TCP flow, QFind so does not cause excessive congestion. This provides the potential for QFind to be used to measure access queues from a wide-range of volunteers.

Simulation and emulation results show that QFind can be effective at inferring queue sizes, even across multiple operating systems, as long as receiver window sizes are large enough and access queues are not so small as to limit throughput.

Unfortunately, measurement results suggest QFind is substantially less accurate than in simulation for determining access queue sizes. By doing multiple QFind experiments, it is possible to ensure analysis on only consistent results, but this results in the discarding of many data samples, thus somewhat defeating the purpose of having a readily available, non-intrusive methodology.

Based on the winnowed data set from our 47 QFind volunteers, DSL appears to have significantly smaller access queues than does cable, and the corresponding `ping` delays when such a queue is full can significantly degrade interactive applications with real-time constraints. A secondary goal of this investigation was to determine, using both emulation and simulation, to what extent access link queue sizes can impact the throughput of flows with high round-trip times

<sup>6</sup> <http://www.verizon.com/>

and the delays of flows for delay-sensitive applications, such as IP telephony and network games. Due to space constraints, these results can only be found in [3].

Future work could include exploring technologies that have been used for bandwidth estimation (a survey of such technologies is in [9]). In particular, techniques such as [10] that detect congestion by a filling router queue may be used to determine maximum queue sizes. The drawback of such techniques is they require custom software and may be intrusive, so these drawbacks would need to be weighed against the benefit of possibly more accurate results.

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