# **On TCP Reaction to Explicit Congestion Notification**

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## Abstract

We investigate the behavior of a new response strategy to TCP Explicit Congestion Notification (ECN). The new strategy is more aggressive in the short term, but preserves TCP long term behavior– without modifying the router ECN marking rate. A more aggressive short term behavior gives incentives for hosts to become ECN-compliant. ECN serves as an early warning sign in this case. Our analysis demonstrates the effectiveness of the new TCP ECN behavior. Simulation results with short/long lived FTP, UDP and HTTP connections, multiple bottleneck configurations, and various TCP flavors and parameters, demonstrate higher throughput and reduced oscillations with the new response strategy.

**Keywords:** TCP congestion control, explicit congestion notification (ECN), random early detection (RED), active queue management, additive increase multiplicative decrease (AIMD)

# I. INTRODUCTION

Congestion avoidance mechanisms have been a topic of active research since the early 1980s [19], [8], [5], [17], [30]. In the TCP congestion avoidance algorithm, the congestion window is linearly increased by one segment (additive increase) every round-trip time (RTT), and is halved (multiplicative decrease) in response to a single packet drop. Hence, the increase increment is 1 and the decrease fraction is  $\frac{1}{2}$ , or what we refer to as AIMD ( $\alpha,\beta$ )=AIMD (1, 0.5). Recently, the relationship between the two parameters  $\alpha$  and  $\beta$  has been studied in [13], [37].

Active Queue Management (AQM) at network routers has also been extensively studied in the last few years. Floyd and Jacobson proposed the Random Early Detection (RED) scheme for Internet routers in 1993 [15]. RED drops packets probabilistically when the average buffer occupancy lies between two thresholds. RED drops all packets when the maximum threshold is exceeded. Significant research has focused on refining such intelligent packet dropping or marking mechanisms [28], [32], [3], [25]. The Explicit Congestion Notification (ECN) option entails that RED routers mark (instead of drop) packets when buffer occupancy lies between the two thresholds [10]. Although the source response to ECN should match its response to packet drop, Internet standards indicate that this matching requirement is a long term one. This allows the possibility of less aggressive reduction in the short term. We have explored this idea in [26], and we further analyze it in this paper.

We react to the receipt of ECN with a relatively small window decrease, but increase less aggressively for a subsequent period of time. We reset the increase and decrease parameters back to (1, 0.5) in the event of retransmission timeouts or duplicate acknowledgments (ACKs) following the ECN decrease. The smooth response to ECN is consistent with the motivation behind ECN: to serve as an early warning for congestion. The improved performance we will demonstrate in this paper gives incentives for hosts to become ECN-compliant. The AIMD parameters for ECN are selected to preserve the long term TCP behavior, without requiring modifications to the router marking rate. The window size and sending rate do not oscillate as much as they do with ECN with (1, 0.5), thus increasing overall throughput and reducing delay variance. Note that we investigate different increase and decrease parameters only as a response to ECN, since (1, 0.5) are standardized for TCP [2]. The precise response to ECN, however, is not dictated by [34].

The remainder of this paper is organized as follows. Section II gives basic background on TCP congestion control, active queue management, and explicit congestion indication in the Internet. Section III discusses related work. Section IV explains and models our approach. Section V simulates our approach in a number of network configurations with various parameters. Finally, Section VI summarizes our conclusions and discusses future work.

### II. BACKGROUND

We first summarize the TCP congestion control mechanisms, and then discuss active queue management and explicit congestion notification.

# A. TCP Congestion Control

A TCP connection begins in the "slow start" phase [19]. The sender initially sets its congestion window, *cwnd*, to 1 or 2 segments [2]. For each ACK received, *cwnd* is increased by one segment. This results in an exponential increase of *cwnd* over round trips. TCP uses the slow start threshold, *ssthresh*, to indicate the window size appropriate for the current network load. The slow start phase continues as long as *cwnd* is less than *ssthresh*. As soon as it exceeds *ssthresh*, TCP goes into "congestion avoidance." In congestion avoidance, for each ACK received, *cwnd* is increased by 1/*cwnd* segments, which is approximately equivalent to increasing *cwnd* by one segment every round trip (an additive increase). The TCP sender assumes network congestion when it times out waiting for an ACK, or when it receives 3 duplicate ACKs. *ssthresh* is halved (a multiplicative decrease). The Additive Increase Multiplicative Decrease (AIMD) system has been shown to be stable under certain assumptions [6], [20], [21].

#### B. Random Early Detection

RED maintains a long term average of the queue length (buffer occupancy) of a router using a low-pass filter. If this average queue length falls below a certain minimum threshold, all packets are admitted into the queue. If the average queue length exceeds a certain maximum threshold, all incoming packets are dropped. When the queue length lies between the minimum and maximum thresholds, incoming packets are dropped/marked with a linearly increasing

probability up to a maximum probability value,  $p_{max}$ . RED includes an option known as the "gentle" variant. With gentle RED, the packet drop/mark probability varies linearly from  $p_{max}$  to 1 as the average queue size varies from  $th_{max}$  to twice  $th_{max}$ .

#### C. The ECN Mechanism

The Explicit Congestion Notification (ECN) option [10], [34] allows active queue management mechanisms such as RED to probabilistically mark (rather than drop) packets, when the average queue length lies between the two thresholds. This is only possible if both the sender and receiver are ECN-capable (determined at connection setup time). In this case, the receiver echoes back to the sender the fact that some of its packets were marked. The sender thus determines that the network is approaching a congested state. The sender should reduce its congestion window as if the packet was dropped, but need not reduce it drastically (e.g., set it to one or two segments) [34]. The sender should only react once per RTT to congestion indications. With ECN, both gentle RED and vanilla RED mark (not drop) packets when the average queue size lies between the two thresholds. Gentle RED still drops less aggressively than vanilla RED between the maximum threshold and twice the maximum threshold. The primary advantage of ECN is that TCP does not have to wait for a timeout and some packet drops can be avoided.

# III. RELATED WORK

A number of studies have investigated RED and ECN performance. Variations of RED include flow RED [28], stabilizing RED [32], and BLUE [1]. The effect of RED parameter values on web traffic is studied in [7], and the effect of marking from the front of the queue is investigated in [29]. A performance study of ECN with real traffic is presented in [35]. Ott [31] investigates ECN with various response algorithms. The study considers environments where non-ECN compatibility is not required, and the marking rate can be increased. Such integrated solutions that modify router marking also include REM [3], AVQ [25] and the PI controller [18].

Design of AIMD algorithms has also been an active research area. The additive increase parameter  $\alpha$  and multiplicative decrease parameter  $\beta$  have been studied since the 1980s [6], [20]. Recently, Yang and Lam [37] derived the relationship between the two parameters necessary for "TCP-friendliness" (compatibility with TCP). They recommend 0.875 ( $cwnd = 0.875 \times cwnd$ ) for multiplicative decrease, and 0.3125 for additive increase, as a response to loss (*not* as a response to ECN). In [14], [13], the authors propose equation-based congestion control (based on TCP models in [33]), and compare it to TCP using a number of AIMD parameters. The authors use a slightly different relationship between the additive increase and multiplicative decrease parameters from that in [37]: they use  $\alpha = \frac{3(1-\beta)}{1+\beta}$  which gives smaller  $\alpha$  values than those in [37], for the range of  $\beta$  values we are interested in. As in [37], the authors of [13] consider AIMD parameters in general, and not in the context of ECN as we do in this paper. Another class of AIMD algorithms, binomial algorithms, is studied in [4] for streaming applications. XCP generalizes ECN to achieve efficient and stable congestion control for high bandwidth-delay product networks [22].

One study that investigates the response to ECN without changing the marking rate is [16]. The authors propose an algorithm to react to ECN, and, at the same time, remove TCP's bias to short RTT connections. They modify the window increase slope to be proportional to  $RTT^2$  (hence the *rate* increase slope is proportional to RTT). The main problem with their approach is that RTT bias elimination should be independent of ECN marking. Further, their algorithm is not TCP-friendly, and is highly sensitive to the RED maximum drop probability. We have addressed these issues in [26], and we analyze our proposed ECN response strategy in this paper.

#### **IV. PARAMETERIZED ECN RESPONSE**

In this section, we discuss our ECN response strategy, and model it in conjunction with AQM routers such as RED.

## A. New ECN Response

The primary objective of our strategy is to modify ECN response, in order to increase throughput, reduce rate fluctuations, and reduce delay variance. The pseudo-code is outlined in Figure 1. We use two parameters  $\alpha_{ECN}$  and  $\beta_{ECN}$  to denote the required increase and decrease parameters, respectively. Our performance study (Section V) indicates that (0.2,0.875) are good choices for ( $\alpha_{ECN}$ , $\beta_{ECN}$ ). We reduce the congestion window and slow start



Fig. 1. Pseudo-code for parameterized response to ECN marks

threshold by  $\beta_{ECN}$  in response to an ECN-marked packet. We then use a modified increase slope *IncreaseSlope* in the ensuing congestion avoidance phase. The increase slope is set to  $\alpha_{ECN}$  on the receipt of ECN-marked packets, and reset to 1 on a timeout or receipt of 3 duplicate ACKs. Note that congestion window increases and decreases follow TCP for all congestion indications other than ECN. Thus,  $\beta_{ECN}$  need not be reset with timeouts or 3 duplicate ACKs. The essential idea is to match the use of the increase parameter with the corresponding decrease parameter that was previously applied. This less aggressive window decrease on ECN is more consistent with the use of ECN as an early warning sign. It also gives incentives for hosts to become ECN-capable. We call this approach ECN( $\alpha$ ,  $\beta$ ).

# B. $ECN(\alpha, \beta)$ Sending Rate

We extend the TCP sending rate models developed in [27], [33] to include the new ECN response ECN( $\alpha_{ECN}, \beta_{ECN}$ ). We employ the same assumptions as Padhye *et al.* [33]. We have selected Padhye's model because of its simplicity, and the fact that it is one of the best available approximations for TCP-Reno performance. Observe, however, that the model has several weaknesses. First, the model does not include the TCP fast recovery algorithm. Second, the model assumes a simple loss model, where congestion indications in one round are independent of congestion indications in other rounds. A round starts with packet transmissions corresponding to the current TCP congestion window size, and ends with the first ACK for one of the packets sent. Third, RTT is independent of congestion window size. Thus, the duration of a round is equal to one RTT in this model.



Fig. 2. Evolution of the window size with ( $\alpha_{ECN}, \beta_{ECN}$ ) as ECN response parameters

With the new ECN behavior, there are three congestion indication types: ECN, TD (Triple-Duplicate ACKs) and TO (Time-Outs). Figure 2 depicts a sample evolution of the congestion window size using (1, 0.5) for triple duplicate acknowledgments, and  $(\alpha_{ECN}, \beta_{ECN})$  for ECN. We define a TDP as a period starting from receipt of a Triple-Duplicate ACK (TD) and lasting until the next congestion indication. Similarly, we define an ECNP as a period starting from a timeout and lasting until the next congestion indication. A timeout sequence is defined as a period starting from a timeout and lasting until the sender receives an acknowledgment. Let  $E[Y_{(1,0.5)}]$  and  $E[Y_{ECN}]$  be the expected number of packets sent during a TDP and an ECNP, respectively. Similarly,  $E[A_{(1,0.5)}]$  and  $E[A_{ECN}]$  are the mean durations of the TDP and ECNP, respectively. We also define  $E[W_{(1,0.5)}]$  and  $E[W_{ECN}]$  as the expected window size at the end of TDP and ECNP, respectively.

We introduce the term  $\rho$  to denote the fraction of ECN indications among the sum of ECNs and TDs. More precisely,  $\rho = \frac{num(ECN)}{num(TD)+num(ECN)}$ , where num(x) denotes the number of congestion indications using method x. Note that ECNs are only counted once per round-trip time. Let p be the total congestion indication probability, defined as  $p = \frac{num(ECN)+num(TD)+num(TD)}{M}$ , where M is the total number of packets sent. We also define  $p_t = \frac{num(TD)}{M_t}$  and  $p_e = \frac{num(ECN)}{M_e}$  to denote the congestion indication probabilities using TD and ECN, respectively. Here,  $M_t$  is the total number of packets sent during all TDPs, and  $M_e$  is the total number of packets sent during all ECNPs.

As in [33], let *b* be the number of packets acknowledged by a single ACK. Let Q be the probability that a loss indication ending a TDP is a timeout. Let E[R] denote the packets sent during a timeout sequence, and  $E[Z^{TO}]$ denote the duration of the timeout sequence. Both E[R] and  $E[Z^{TO}]$  can be computed according to the probability distribution of the number of timeouts in a timeout sequence. According to [33],  $E[R] = \frac{1}{1-p}$  and  $E[Z^{TO}] = T_0 \frac{f(p)}{1-p}$ where  $T_0$  is the TCP timeout period, and  $f(p) = 1 + p + 2p^2 + 4p^3 + 8p^4 + 16p^5 + 32p^6$ . Also,  $Q \approx min(1, \frac{3}{E[W]})$ , where E[W] in our case becomes  $(1 - \rho)E[W_{(1,0.5)}] + \rho E[W_{ECN}]$ . The sending rate *B* for the ECN( $\alpha,\beta$ ) strategy can thus be modeled as:

$$B = \frac{(1-\rho)E[Y_{(1,0.5)}] + \rho E[Y_{ECN}] + \mathcal{Q} \times E[R]}{(1-\rho)E[A_{(1,0.5)}] + \rho E[A_{ECN}] + \mathcal{Q} \times E[Z^{TO}]}$$
(1)



Fig. 3. Packets sent during an ECNP

We first compute  $E[Y_{ECN}]$  and  $E[A_{ECN}]$ . As illustrated in Figure 3,  $Y_i = \delta_i + W_i - 1$  packets are sent during the  $i^{th}$  ECNP. Here,  $Y_i$  is the number of packets sent in the  $i^{th}$  ECNP,  $\delta_i$  is the first ECN-marked packet, and  $W_i$  is the window size at the end of the  $i^{th}$  ECNP. It follows that:

$$E[Y_{ECN}] = E[\delta] + E[W_{ECN}] - 1 \tag{2}$$

 $E[\delta]$  can be computed as:

$$E[\delta] = \sum_{k=1}^{\infty} (1 - p_e)^{k-1} p_e k = \frac{1}{p_e}$$
(3)

since the probability that  $\delta_i = k$  denotes the probability that the first k - 1 packets are successfully acknowledged and the *k*th packet is ECN marked. This is equivalent to  $(1 - p_e)^{k-1}p_e$ . Therefore,  $E[Y_{ECN}]$  can be rewritten as:

$$E[Y_{ECN}] = \frac{1 - p_e}{p_e} + E[W_{ECN}]$$
(4)

The window size increases linearly between  $\beta W_{i-1}$  and  $W_i$ , with slope  $\frac{\alpha}{b}$  (we remove the *ECN* subscript of  $\alpha$  and  $\beta$  for readability), for the *i*<sup>th</sup> ECNP and the  $(i-1)^{st}$  TDP or ECNP (Figures 2 and 3). Let  $X_i$  denote the round when congestion indication is received. Thus, we have:

$$W_i = \beta W_{i-1} + \frac{\alpha X_i}{b}, i = 1, 2, \cdots$$
(5)

Since  $Y_i$  packets are transmitted during ECNP<sub>i</sub>,

$$Y_{i} = \sum_{k=0}^{\frac{\alpha X_{i}}{b} - 1} \left(\beta W_{i-1} + k\right) b + \mu_{i}$$
(6)

where  $\mu_i$  is the number of packets sent in the last round (see Figure 3). From equations (5) and (6), we have:

$$E[W_{ECN}] = \frac{\alpha}{b(1-\beta)} E[X_{ECN}] \tag{7}$$

$$E[Y_{ECN}] = \frac{\alpha E[X_{ECN}]}{2} ((1+\beta)E[W_{ECN}] - 1) + \frac{E[W_{ECN}]}{2}$$
(8)

where  $E[\mu] = \frac{E[W_{ECN}]}{2}$ , assuming that  $\mu_i$  is uniformly distributed between 1 and  $W_i$ . From equations (4), (7) and (8),  $E[W_{ECN}]$ ,  $E[Y_{ECN}]$  and  $E[X_{ECN}]$  can be computed as:

$$E[W_{ECN}] = \frac{b(1-\beta) + 1 + \sqrt{(b(1-\beta)+1)^2 + \frac{8b(1-\beta^2)(1-p_e)}{p_e}}}{2b(1-\beta^2)}$$
(9)

$$E[Y_{ECN}] = \frac{1 - p_e}{p_e} + E[W_{ECN}]$$
(10)

$$E[X_{ECN}] = \frac{b(1-\beta)}{\alpha} E[W_{ECN}]$$
(11)

The duration of the *i*<sup>th</sup> ECNP is  $A_i = \sum_{j=1}^{X_i+1} r_{ij}$ , where  $r_{ij}$  is the RTT of the *j*th round of the *i*th ECNP. It follows that:

$$E[A_{ECN}] = E[r](E[X_{ECN}] + 1) = RTT(E[X_{ECN}] + 1)$$
  
$$= RTT\left(\frac{b(1-\beta)}{\alpha}E[W_{ECN}] + 1\right)$$
(12)

 $E[W_{(1,0.5)}]$ ,  $E[Y_{(1,0.5)}]$  and  $E[A_{(1,0.5)}]$  can be derived using  $(\alpha, \beta) = (1, 0.5)$  for  $E[W_{ECN}]$ ,  $E[Y_{ECN}]$  and  $E[A_{ECN}]$ , respectively, and  $p_t$  for  $p_e$ . Hence, we have:

$$E[W_{(1,0.5)}] = \frac{2+b}{3b} + \sqrt{\frac{8(1-p_t)}{3bp_t} + \left(\frac{2+b}{3b}\right)^2}$$
(13)

$$E[Y_{(1,0.5)}] = \frac{1 - p_t}{p_t} + E[W_{(1,0.5)}]$$
(14)

$$E[A_{(1,0.5)}] = RTT(E[W_{(1,0.5)}] + 1)$$
(15)



Fig. 4. TCP sending rate using our new ECN response ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ), according to the model in equation (1)

In Figures 4 and 5, we use equation (1) to plot the TCP sending rate with the new ECN response ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) for different  $\rho$  values ( $\rho$  is the fraction of ECN among the sum of ECNs and TDs). We use RTT = 0.2 seconds, b = 2, and  $T_0 = 3.0$  seconds. Figure 4 shows the TCP sending rates for different p,  $p_t$ ,  $p_e$ , and  $\rho$  values, with two fixed ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) values. In the figure, (5%,6%,4%) means p = 5%,  $p_t = 6\%$ , and  $p_e = 4\%$ . The figure demonstrates that the TCP sending rate increases for  $p_e \leq p \leq p_t$ . As the probabilities p and  $p_e$  become smaller, the increase is more pronounced (e.g., (1%,2%,0.1%) and (0.5%,1%,0.1%)). Our simulations in Section V-B show that  $p_t \leq p \leq p_e$  rarely occurs. Figure 5 depicts the TCP sending rates for different ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) and  $\rho$  values, for (p = 1%,  $p_t = 1\%$ ,  $p_e = 0.1\%$ ) and (p = 0.5%,  $p_t = 1\%$ ,  $p_e = 0.1\%$ ). In both cases, the TCP sending rate



Fig. 5. TCP sending rate using our new ECN response ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ), according to the model in equation (1)

increases as  $\rho$  increases. We observe that the TCP sending rates with (1, 0.5) and (0.8, 0.5789) are larger than the TCP sending rates with (0.2, 0.875) and (0.1, 0.9355). This indicates that TCP-ECN with (1, 0.5) and with (0.8, 0.5789) are more aggressive than TCP-ECN with (0.2, 0.875) and (0.1, 0.9355). These results show that early congestion indication with our new ECN response ( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) increases performance. In addition, this model may be used for equation-based ECN( $\alpha, \beta$ ) congestion control since the values of RTT,  $\rho$ , p,  $p_e$ , and  $p_t$  can be easily computed.

# C. RED-ECN as a Feedback Control System

We model  $n \text{ ECN}(\alpha_{ECN}, \beta_{ECN})$  flows sharing a single RED-ECN router, following a similar methodology to that in [9]. Our goal is to determine the equilibrium point  $(p_s, \overline{q}_s)$ , where  $p_s$  is the packet drop/mark probability, and  $\overline{q}_s$  is the average queue length in steady state. Note that the model in [9] makes several simplifying assumptions. The model considers n TCP-Reno flows sharing only *one* bottleneck link where packets may be discarded. The TCP flows are established from senders to receivers, while the opposite direction only carries ACKs. The number of flows n remains constant for a long period of time, and all flows have long durations. All flows are also assumed to have the same average round-trip time.



Fig. 6. Equilibrium point of TCP( $\alpha_{ECN}, \beta_{ECN}$ ) and RED-ECN

We extend the model in [9] to model ECN( $\alpha$ ,  $\beta$ ) at the sender and RED-ECN at the router. RED serves as a feedback control system in this context. Unlike previous work, we consider a RED-ECN router that can both mark and drop in different ranges of average queue length (as the ECN proposal specifies).

Assume the ECN( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) flows have the same average round-trip time RTT, such that  $RTT = RTT_0 + \overline{q}/c$ , where  $RTT_0$  is the propagation time that excludes queuing delay, and  $\overline{q}/c$  represents the queuing delay. c is the bottleneck link capacity and  $\overline{q}$  is the average queue size.

The ECN( $\alpha_{ECN}$ ,  $\beta_{ECN}$ ) TCP sending rate from Section IV-B is used as the bandwidth,  $\hat{B}$ , in two different modes, marking and dropping, as a function of p:

$$\hat{B}(RTT, p, \rho) = \begin{cases} B(RTT, p, 1) & 0 p_{max} \end{cases}$$
(16)

Assume that the link bandwidth is fully utilized:

$$B(RTT_0 + \overline{q}/c, p, \rho) = c/n \tag{17}$$

At the router, we use RED-ECN,  $H(\overline{q})$ , as a feedback control function in the "gentle" RED mode, defined in Section II-C.  $Q_{size}$  denotes the maximum queue size. Note that RED-ECN marks packets when  $q_{min} \leq \overline{q} < q_{max}$ , but drops packets when  $\overline{q} \geq q_{max}$ :

$$H(\overline{q}) = \begin{cases} 0 & 0 \leq \overline{q} < q_{min} \\ \frac{\overline{q} - q_{min}}{q_{max} - q_{min}} p_{max} & q_{min} \leq \overline{q} < q_{max} \\ \frac{1 - p_{max}}{q_{max}} (\overline{q} - q_{max}) + p_{max} & q_{max} \leq \overline{q} < 2q_{max} \\ 1 & 2q_{max} \leq \overline{q} \leq Q_{size} \end{cases}$$
(18)

Finally, we obtain two relations between p and  $\overline{q}$ . One is from the inverse function of  $\hat{B}$  in equation (17), and the other one is from equation (18):

$$\begin{cases} \overline{q} = c(\hat{B}^{-1}(p, c/n) - RTT_0) \\ p = H(\overline{q}) \end{cases}$$
(19)

The equilibrium point  $(p_s, \overline{q}_s)$  obtained from the above equations is illustrated in Figure 6. Note that the x-axis of the graph is divided into two parts, corresponding to marking and dropping.

# V. PERFORMANCE ANALYSIS

In this section, we validate our analysis, and we evaluate the performance of the new ECN response strategy. We first discuss the simulation setup and the performance metrics, and then analyze the results.

### A. Simulation Setup

We use the network simulator ns-2.1b6 [36] in this study. The configuration for the first set of simulations is the WAN configuration depicted in Figure 7(a). We run three different simulations with different bottleneck capacities: 1, 5 and 10 Mbps. We simulate 20 unlimited FTP TCP connections with 5 sessions at each sending node. The total simulation time is 100 seconds.



Fig. 7. Topologies used in the simulations

We also use the Generic Fairness Configuration-2 (GFC-2), illustrated in Figure 7(b). GFC-2 contains multiple bottlenecks, and connections with different round-trip times. We use D = 5 ms. There are 22 unlimited bulk-data FTP TCP connections in each direction, 6 UDP connections (modeled as 0.5 Mbps CBR (Constant Bit Rate) flows), and 22 HTTP traffic flows. The HTTP traffic is generated using a Poisson Process where the inter-object, inter-page and inter-session times follow an exponential distribution. The simulation time is 60 seconds.

We use a timer granularity of 100 ms and a segment size of 1000 bytes. All routers in our simulations use gentle RED with packet marking for ECN [12]. As previously explained, with gentle RED, the packet drop probability varies linearly from  $p_{max}$  to 1 as the average queue size varies from  $th_{max}$  to twice  $th_{max}$ . The buffer size is 168 KB. The  $th_{min}$  value is  $\frac{1}{12} \times$  the buffer size, and the  $th_{max}$  value is  $\frac{1}{4} \times$  the buffer size (3 ×  $th_{min}$ ), as recommended by RED

designers [12]. We run 5 simulations and average them. (To ensure comparability, we fix the random number generator seed for each run when we compare different approaches.)

We use the following performance metrics: (1) **Goodput (Mbps):** Total data received *at the application level* by all receivers during the simulation time, divided by the simulation time; (2) **Packet Drop Percentage:** The ratio of dropped packets to the total number of packets sent during the simulation time (multiplied by 100); and (3) **Response Time (seconds):** The (mean and maximum) time between the instant when the request of an HTTP client is triggered, and the instant when the last requested page from a server arrives at that client.

## B. Results and Discussion

We first validate the throughput and feedback models discussed in previous sections. In Figure 8, we validate the throughput model for various numbers of flows on the WAN configuration. The x-axis denotes values from the simulations, while the y-axis denotes predicted values from our throughput model. The closer the points are to the y = x line, the more accurate the model is. The figure shows that our model predicts throughput values close to the simulated ones, especially when the bottleneck bandwidth is 1 Mbps and 5 Mbps.



Fig. 8. Predicted versus simulated throughput values

Figure 9 depicts the fraction of packets sent during ECNPs among the packets sent during the entire simulation, for all 20 flows. In the figure, all the flows in the configurations with 5 and 10 Mbps bottleneck links send more than 90% of their packets during ECNPs. All the flows in the configuration with 1 Mbps bottleneck link send more than 80% packets during ECNPs. This result indicates that the majority of packets are sent during ECNPs. The congestion indication probabilities p,  $p_t$ , and  $p_e$  for each flow in the simulation with a 10 Mbps bottleneck are plotted in Figure 10. The figure validates that our choices of p,  $p_t$  and  $p_e$  (used in Figures 4 and 5) are indeed reasonable ( $p_e ).$ 



Fig. 9. Fraction of packets sent during ECNPs among all packets sent during the simulation period for all 20 flows

We also compare the steady-state equilibrium points  $(p_s, \overline{q}_s)$  acquired from our model with simulation measurements. Figure 11(a) depicts the steady-state equilibrium point  $(p_s, \overline{q}_s)$  predicted by the model. The predicted  $\overline{q}$  and p = H(q) from equation (19) intersect at approximately (0.08, 40). The model p = H(q) uses 14 packets as  $th_{min}$ on the y-axis, 42 for  $th_{max}$ , and 84 for  $2 \times th_{max}$  ( $2 \times th_{max}$  is used in "gentle" RED). RED-ECN marks packets if  $p < p_{max} = 0.1$ , and drops them if  $p \ge p_{max} = 0.1$ . Figure 11(b) illustrates that the actual average RED queue size (from the simulations) lies between 40 and 42 KB. The measured packet mark/drop probability over the entire simulation is approximately 8% (not shown). This verifies that our model is accurate with an active queue management scheme such as RED-ECN.



Fig. 10. Congestion indication probabilities p,  $p_t$ , and  $p_e$  in the simulation for all 20 flows



(a) Predicted steady-state average queue



Fig. 11. RED Equilibrium point for  $(\alpha_{ECN}, \beta_{ECN})$ 

Table I compares the performance of TCP-Reno without ECN, TCP-Reno with ECN, and ECN( $\alpha$ ,  $\beta$ ) for three different bottleneck link bandwidths (1, 5 and 10 Mbps) on the WAN configuration. We use  $\alpha_{ECN}$  of 0.2 and  $\beta_{ECN}$  of 0.875 in this set of simulations. From the table, it is clear that ECN( $\alpha$ ,  $\beta$ ) has higher performance than TCP-Reno without ECN, and similar performance to TCP-Reno with ECN in terms of goodput and packet drop percentage.

Table II compares the performance of TCP-Reno without ECN, with ECN, and ECN( $\alpha$ ,  $\beta$ ) for the GFC-2 configuration. Again, we use  $\alpha_{ECN}$  of 0.2 and  $\beta_{ECN}$  of 0.875 [13] in this set of simulations. From the table, it is clear that ECN( $\alpha$ ,  $\beta$ ) exhibits higher performance than TCP-Reno without ECN or with ECN. ECN( $\alpha$ ,  $\beta$ ) total goodput (HTTP, FTP and UDP) is approximately 4 Mbps higher than TCP-Reno without ECN, and approximately 3 Mbps higher than TCP-Reno with ECN. In addition, ECN( $\alpha$ ,  $\beta$ ) exhibits the shortest mean response time for HTTP traffic. With respect to packet drop percentage, ECN( $\alpha$ ,  $\beta$ ) achieves significant improvement over TCP-Reno without ECN and with ECN for various traffic types.

1) Responsiveness of  $ECN(\alpha, \beta)$ : Although  $ECN(\alpha, \beta)$  achieves higher performance than TCP Reno without ECN or with ECN as shown above, our less dramatic reduction of congestion window as a response to ECN may cause slow responsiveness to a sudden surge of traffic. Recently, equation-based congestion control, e.g., TFRC [14], was shown to adequately respond to congestion due to its self-clocking mechanism [4]. In order to investigate the responsiveness

Algorithm	Total Goodput			Packet Drop Percentage			
	1 Mbps	5 Mbps	10 Mbps	1 Mbps	5 Mbps	10 Mbps	
Reno without ECN	0.980	4.988	9.527	8.93	3.63	2.06	
Reno with ECN	0.981	4.999	9.920	5.53	0.59	0.39	
$\text{ECN}(\alpha, \beta)$	0.979	4.984	9.942	3.02	0.95	0.53	

TABLE I Performance of ECN( $\alpha, \beta$ )– WAN

Algorithm	HTTP Response Time		Goodput			Packet Drop Percentage			
	Mean	Max	HTTP	UDP	FTP	HTTP	UDP	FTP	Total
Reno without ECN	14.260	50.449	1.509	2.855	38.772	7.187	4.966	0.883	1.637
Reno with ECN	12.194	50.517	0.845	2.830	40.805	7.837	5.797	0.147	1.110
$\text{ECN}(\alpha,\beta)$	11.481	52.237	2.339	2.881	41.890	4.278	4.146	0.119	0.854

TABLE II Performance of ECN( $\alpha, \beta$ )– GFC-2



Fig. 12. Drop or mark probability in GFC-2 simulation)

of ECN( $\alpha$ ,  $\beta$ ), we add 10 unlimited bulk-data sessions to the GFC-2 configuration. These additional sessions all start transmission after 20 seconds of the simulation time, and stop at time 40 seconds (20 seconds before the 60-second simulation ends). The RED drop probability without ECN, and the mark or drop probability with ECN, at the queues at the links from R2 and from R3 are shown in Figure 12 for the 3 algorithms (in separate simulation runs). We do not observe significantly higher values with ECN( $\alpha$ ,  $\beta$ ) than with ECN during the period of sudden congestion. Table III indicates that ECN( $\alpha$ ,  $\beta$ ) outperforms TCP Reno without ECN and with ECN in this scenario as well for ( $\alpha$ ,  $\beta$ ) = (0.2,0.875).

Algorithm **HTTP Response Time** Goodput Packet Drop Percentage Mean Max HTTP UDP FTP HTTP UDP FTP Total Reno without ECN 13.607 49.732 5.783 35.789 9.635 5.480 1.804 0.615 1.003 Reno with ECN 12.082 54.730 0.657 5.958 37.648 8.456 5.918 0.190 1.157 12.841 48.550 1.010 5.805 38.494 6.661 4.627 0.128 0.903  $ECN(\alpha, \beta)$ 

TABLE III Responsiveness of ECN( $\alpha, \beta$ )– GFC-2

2) Effect of  $\alpha_{ECN}$  and  $\beta_{ECN}$  Values: This section explores various pairs of  $(\alpha_{ECN}, \beta_{ECN})$  values to investigate their effects on performance. All parameter values other than  $\alpha_{ECN}$  and  $\beta_{ECN}$  are set as in the previous experiment. The  $(\alpha_{ECN}, \beta_{ECN})$  pairs we use here follow the rule proposed in [13] except for (1, 0.9). We selected (1, 0.9) to compare values that follow the rule in [13] with a more aggressive  $(\alpha_{ECN}, \beta_{ECN})$  pair. From table IV, we see that (0.2, 0.875), (0.4, 0.7647) and (0.8, 0.5789) demonstrate marked goodput improvement over (1, 0.5) (with (0.2, 0.875) performing best). ( $\alpha_{ECN}, \beta_{ECN}$ ) values that follow the TCP-friendliness rule achieve good performance in terms of goodput as well as HTTP response time. Although (1, 0.9) exhibits competitive performance, its aggressiveness may be harmful to other TCP connections.

*3) TCP-friendliness in Heterogeneous Configurations:* To analyze the TCP-friendliness of our approach in heterogeneous configurations, we use the simple configuration in Figure 13. In this simulation, we use a 120 KB RED buffer size. The topology, link delays, and bandwidths are depicted in the figure. The RTTs of the 3 flows TEST1, TEST2, and TEST3 are the same as flows TCP1, TCP2, and TCP3, respectively. The first set of simulations evaluates the compatibility with TCP-Reno with ECN support, and the second compares with TCP-Reno without ECN.

$(\alpha_{ECN}, \beta_{ECN})$	HTTP Response Time		Goodput			Packet Drop Percentage			
	Mean	Max	HTTP	UDP	FTP	HTTP	UDP	FTP	Total
(1, 0.5)	12.194	50.517	0.845	2.830	40.805	7.837	5.797	0.147	1.110
(0.8, 0.5789)	11.328	48.538	1.516	2.844	42.195	6.302	5.389	0.137	1.011
(0.4, 0.7647)	10.282	49.643	1.294	2.862	41.604	5.481	4.787	0.113	0.909
(0.2, 0.875)	11.481	52.237	2.339	2.881	41.890	4.278	4.146	0.119	0.854
(1, 0.9)	12.060	52.623	1.665	2.733	42.400	6.664	9.013	0.386	1.773

TABLE IV EFFECT OF  $\alpha_{ECN}$  and  $\beta_{ECN}$  values– GFC-2



Fig. 13. Simple single bottleneck configuration

Each set of simulations consists of two simulations. The first is a mixed simulation where the first three flows TEST1, TEST2, and TEST3 use ECN( $\alpha$ ,  $\beta$ ), and the remaining flows TCP1, TCP2, and TCP3 use TCP-Reno. The second simulation is a homogeneous simulation in which all six flows TEST1-TEST3 and TCP1-TCP3 are TCP-Reno. We plot the sequence numbers over time for the mixed flows scenario (upper graph (a)) and the all TCP-Reno flows scenario (lower graph (b)). We compare the two graphs to see how much the ECN( $\alpha$ ,  $\beta$ ) flows affect co-existing TCP-Reno flows TCP1-TCP3. This verifies whether TCP-friendliness is preserved.

Figure 14 shows that TEST1, TEST2, and TEST3, which use our new ECN response strategy, do not significantly affect the other three flows TCP1, TCP2, and TCP3, which use TCP-Reno with ECN support. Comparing the upper graph with the lower graph, we observe that TCP1, TCP2, and TCP3 achieve similar rates in both the heterogeneous and homogeneous versions. The figure shows that ECN( $\alpha$ ,  $\beta$ ) sends packets less aggressively than TCP-Reno with ECN, since it considers ECN as an early warning sign. ECN( $\alpha$ ,  $\beta$ ) with  $\alpha_{ECN} = 0.3125$  is more aggressive than with  $\alpha_{ECN} = 0.2$ . However, even with  $\alpha_{ECN} = 0.3125$ , ECN( $\alpha$ ,  $\beta$ ) is still less aggressive than TCP-Reno with ECN. Due to the disparity of RTTs, the sequence number curves with similar RTTs are similar in the homogeneous simulations. The corresponding result for Reno without ECN support is shown in Figure 15. In this case, the rate of Reno without ECN (TCP1-3 in the upper graph) is affected more than the version in Figure 14(a). The TCP-Reno flow without ECN with the shortest RTT (TCP3) suffers some throughput degradation compared to the ECN( $\alpha$ ,  $\beta$ ) flow TEST3. TCP-Reno flows, however, still achieve almost the same throughput values as the homogeneous case (Figure 14(b)), except for that very short RTT connection, which anyway has an excessive bandwidth share.

# VI. CONCLUSIONS AND FUTURE WORK

We have explored a smooth TCP response to ECN marks, which considers ECN as an early warning sign. We use a more aggressive short term behavior, while preserving the long term behavior equivalent to packet drop. We model TCP throughput to consider the new ECN response strategy, and verify that our model is accurate. Our simulation results in a multiple bottleneck scenario with bulk FTP, bursty HTTP connections, and UDP flows demonstrate that our ECN response strategy does indeed reduce fluctuations, increase goodput, and reduce delay. This provides incentives for host ECN-compliance. The increase and decrease parameters (0.2, 0.875) appear to be the best choice for preserving the long-term behavior of TCP and achieving high performance.

We are currently evaluating an adaptive version of  $ECN(\alpha,\beta)$  that dynamically adjusts  $(\alpha,\beta)$  based on the number of ECN-marked packets received during an interval of time. We are also studying fairness among flows that use or do not use ECN (especially with heterogeneous RTTs). We plan to exploit  $ECN(\alpha,\beta)$  to shorten the recovery time



Fig. 14. Sequence numbers from simulations of Reno with ECN support



Fig. 15. Sequence numbers from simulations of Reno with no ECN support

after transient congestion detection. This is especially important in the context of high-speed networks [22], [23]. We will also examine the interaction between our new algorithm and a variety of active queue management schemes. In particular, variants of ECN( $\alpha$ , $\beta$ ) with implicit or explicit feedback mechanisms for high-speed networks such as [11], [24] will be an interesting topic for further study.

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