A Study of Fair Bandwidth Sharing with AIMD-Based Multipath Congestion Control

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Abstract—The multi-homed capability offers a good opportunity to explore multipath transmission. To ensure fair bandwidth sharing between multipath flows and legacy single-path flows, congestion control is an essential mechanism at the transport layer to regulate traffic flows for bandwidth consumption. However, in a multipath scenario, the congestion control algorithm of the dominant transport control protocol (TCP) may result in too aggressive behavior. In this paper, we consider the generic congestion control principle of *additive increase* and *multiplicative decrease* (AIMD) and investigate two AIMD-based multipath congestion control solutions. We derive the conditions for AIMD parameters to ensure TCP-friendliness and satisfy two constraints for fair bandwidth sharing between multipath and single-path flows. Simulation results demonstrate that the AIMD-based multipath solutions well achieve the fairness goals.

Index Terms—Congestion control, multipath transmission, MPTCP, AIMD, additive increase multiple decrease.

I. INTRODUCTION AND RELATED WORK

N increasing number of network devices nowadays are equipped with multiple interfaces, such as multi-radio mobile devices and multi-homed Internet servers. The multihomed capability of these devices offers a good opportunity to explore multipath transmission so as to optimize the quality of service (QoS) of bandwidth-intensive applications such as video streaming and conferencing [1]. Although the transport control protocol (TCP) is the *de facto* standard for Internet applications, TCP is subject to some inherent limitations that restrict its direct deployment to multipath transmission. For example, the TCP congestion control algorithm follows the *increase-by-one* and *decrease-by-half* principle, which often introduces a highly fluctuating throughput that is not well suited for QoS assurance to real-time applications [2].

Although many non-TCP transport protocols are proposed, in view of the dominant role of TCP, it is important to ensure *TCP-friendliness* and avoid unfair bandwidth sharing between TCP flows and non-TCP flows. In [2], Cai *et. al.* analyze a single-path TCP-friendly protocol (known as DAIMD) based on the *additive-increase* and *multiplicative-decrease* (AIMD) principle for multimedia applications. In AIMD, the source additively increases the congestion window by α for each round trip time (RTT) and multiplicatively decreases the window size to β of its previous value whenever there is a congestion indication (e.g., duplicate acknowledgements). Actually, TCP is a special case of AIMD with $\alpha = 1$ and

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$$\alpha = \frac{3(1-\beta)}{1+\beta} \tag{1}$$

where $0 < \alpha < 3$ and $0 < \beta < 1$. Two AIMD flows with different (α , β) pairs share the bandwidth fairly if

$$\frac{\alpha_1}{\alpha_2} = \frac{(1+\beta_2)(1-\beta_1)}{(1-\beta_2)(1+\beta_1)} \tag{2}$$

where $\alpha_1, \alpha_2 > 0$ and $0 < \beta_1, \beta_2 < 1$.

In a multipath scenario, if the AIMD or TCP congestion control algorithm were applied independently over each individual path, a multipth flow would acquire a throughput much larger that of a single-path AIMD or TCP flow. Obviously, this aggressive behavior jeopardizes fair resource sharing. A multipath transport control protocol (MPTCP) [3] is recently standardized to extend TCP with the multipath capability by binding TCP subflows over multiple paths. Particularly, a coupled congestion control algorithm [4] is designed to ensure that a multipath flow should a) perform at least as well as a single-path flow would on the best of the paths available to it; and b) take no more capacity than a single-path flow would obtain when experiencing the same loss rate [5]. The fairness requirement in b) basically guarantees that an MPTCP flow does no harm to regular single-path TCP flows. The MPTCP congestion control algorithm works as follows:

- Once the source receives an acknowledgement (ACK) from path r, it increases the congestion window of path r by min($a/w_{total}, 1/w_r$); and
- Once the source receives a congestion signal from path r, it decreases the congestion window w_r of path r by $w_r/2$.

Here, w_r is the current congestion window size of TCP subflow on path r, and w_{total} is the total congestion window size of all TCP subflows. The *aggressiveness* factor a is defined to respect the above throughput constraints, given by

$$a = w_{total} \frac{\max_r w_r / RTT_r^2}{(\sum_r w_r / RTT_r)^2}$$
(3)

where RTT_r is the RTT of path r, while $\min(a/w_{total}, 1/w_r)$ guarantees that each MPTCP subflow does not increase its congestion window faster than a single-path TCP flow with the same window size and does no harm to single-path TCP flows on the same path.

Although there were many studies on multipath routing with TCP [6], this paper focuses on the friendliness and fairness of multipath flows with single-path TCP and AIMD flows, which is not well explored in the literature [7]. Specifically, we investigate multipath congestion control based on the more generic AIMD principle to support a wide range of applications with diverse QoS requirements. To achieve fair bandwidth sharing among single-path AIMD flows and multipath AIMD flows,

we derive some guidelines to select the congestion control parameters. Then, the resource sharing between single-path TCP flows and multipath MPTCP flows is viewed as a special case of the above general problem. Specifically, we aim to determine the AIMD parameters (α, β) so that

- Constraint 1 (C1): each of multipath and single-path flows obtains an even share of the overall bandwidths of all available paths; or
- Constraint 2 (C2): the aggregate throughput of a multipath flow should be the same if it were a single-path flow over the best path experiencing the same packet loss rate.

From a network operator's perspective, it is important to find a solution subject to the constraint C1 if non-differentiated service is provided and a single-path or multipath flow is charged the same. On the other hand, from an end user's perspective, multipath transmission can be promoted if a higher throughput is offered with no harm to single-path flows. It is worth mentioning that C2 does not imply that a multipath flow cannot achieve a throughput higher than that of a single-path flow on the best path. The constraint C2 is defined under the precondition of the same loss rate. A multipath flow is of course allowed to take the total bandwidth of all available paths if there is no competing traffic since a hypothetical single-path flow subject to no loss can get a very high throughput [5].

In the reminder of this paper, we analyze two AIMD-based multipath approaches in Section II and present experiment results in Section III and conclusions in Section IV.

II. AIMD-Based Congestion Control Solutions for Multipath Transmission

In this section, we analyze two multipath congestion control solutions that are extended from DAIMD in a singlepath scenario [2] and the coupled algorithm in MPTCP [4], respectively. The analysis is focused on the AIMD parameters (α, β) that satisfy the above fairness constraints C1 and C2.

A. Multipath Dynamic AIMD (MP-DAIMD)

Consider a scenario in Fig. 1 with M available paths. Assume that there are N_r single-path AIMD flows on a path r. For any two single-path AIMD flows on the same path, their (α, β) pairs are selected to satisfy Eq. (2) so as to ensure fair bandwidth sharing. In addition, there is one multipath AIMD flow consisting of one subflow on each of the M paths and the subflow on path r takes the AIMD parameters (α_r, β_r) . Here, (α_r, β_r) should be properly determined to ensure that the multipath flow obtains an even share of the total capacity as single-path AIMD flows. Denoting the bandwidth of path r by B_r , we have the even share for each flow

$$\lambda_r = \frac{\sum_r B_r}{\sum_r N_r + 1}.$$
(4)

When $N_r \lambda_r < B_r$, we have the ratio of the throughput occupied by each single-path flow over that of the multipath subflow on path r, given by

$$\rho_r = \frac{\lambda_r}{B_r - N_r \lambda_r}.$$
(5)

Single-path flow(s) Multipath subflow

Fig. 1. Network topology.

If $N_r \lambda_r \ge B_r$, it implies that all flows cannot obtain an even share of the total bandwidth. To meet the constraint C1, we can select the paths occupied by the multipath flow by excluding the path of the smallest bandwidth and recalculating λ_r as in (4) until all remaining paths satisfy $N_r \lambda_r < B_r$.

As analyzed in [2], the mean throughput of a flow in a steady state is proportional to its average congestion window size. Let $\overline{W}_{a,r}$ and $\overline{W}_{m,r}$ denote the average congestion window size of the single-path AIMD flows and that of the multipath subflow on path r, respectively. To satisfy C1, the sufficient and necessary condition is that

$$\overline{W}_{a,r} = \rho_r \overline{W}_{m,r}.$$
(6)

Following the analytical approach in [2] for single-path TCP and AIMD flows, we obtain

$$\overline{W}_{a,r} = \frac{1+\beta}{2} \cdot \frac{C_r \alpha(\beta_r - 1)}{\tau} \tag{7}$$

$$\overline{W}_{m,r} = \frac{1+\beta_r}{2} \cdot \frac{C_r \alpha_r (\beta - 1)}{\tau}$$
(8)

where C_r is the maximum capacity (in packets per RTT) of path r and $\tau = \beta \alpha_r + \alpha \beta_r - \alpha - \alpha_r$. Then we have the following relation among the AIMD parameters of the singlepath flows and multipath subflows to meet the constraint C1:

$$\alpha_r = \frac{\alpha(\beta+1)(\beta_r-1)}{\rho_r(\beta-1)(\beta_r+1)}.$$
(9)

Since the AIMD parameters of all single-path flows and multipath subflows should satisfy Eq. (1) to ensure fair bandwidth sharing, Eq. (9) can then be simplified to

$$\alpha_r = \frac{3(1-\beta_r)}{\rho_r(1+\beta_r)}.$$
(10)

Therefore, a multipath flow can select the AIMD parameters for two subflows on path r and path s, respectively, so that

$$\frac{\alpha_r}{\alpha_s} = \frac{\rho_s}{\rho_r} \frac{(1+\beta_s)(1-\beta_r)}{(1-\beta_s)(1+\beta_r)}.$$
(11)

B. Coupled Multipath AIMD (CMP-AIMD)

MPTCP extends TCP with multipath capability and designs a coupled congestion control algorithm to meet the fairness constraint C2. To allow for a wide range of QoS provisioning, we can further apply the more generic AIMD principle and extends the coupled algorithm as follows:

 Once the source receives an ACK message from path r, it increases its congestion window w_r for path r by min(a'_r/w_{m,total}, α_r/w_{m,r}); and



 Once the source receives a congestion signal from path r, it decreases its congestion window for path r by β_rw_{m,r}.

Here, a'_r is an aggressiveness factor for path r, (α_r, β_r) are the AIMD parameters for the subflow on path r, $w_{m,r}$ is the congestion window of the subflow on path r, and $w_{m,total}$ is the total congestion window size of the multipath subflows.

According to the constraint C2, a multipath flow takes no more capacity than any single-path TCP-friendly AIMD flow. The throughput of the multipath flow when subject to the same loss rate is upper bounded by that of the single-path flows, i.e.,

$$\sum_{r} \frac{w_{m,r}}{RTT_r} = \max_{r} \frac{w_{a,r}}{RTT_r}$$
(12)

where $w_{a,r}$ is the congestion window size of single-path flows on path r. The left side of (12) gives the aggregate throughput of the multipath flow, while the right side is the maximum throughput of single-path flows. For stability consideration, the increasing amount of the congestion window should be balanced with the decreasing amount in equilibrium. Hence,

$$(1-p_r)\min\left(\frac{a_r'}{w_{m,total}},\frac{\alpha_r}{w_{m,r}}\right) = p_r w_{m,r}\beta_r \qquad (13)$$

where p_r is the packet loss rate of path r. Likewise, the singlepath AIMD flows are subject to the same path loss and satisfy

$$(1-p_r)\frac{\alpha_r}{w_{a,r}} = p_r w_{a,r}\beta_r.$$
(14)

Rearranging (14), we have

$$\frac{p_r}{1 - p_r} = \frac{1}{(w_{a,r})^2} \cdot \frac{\alpha_r}{\beta_r}.$$
 (15)

The aggressiveness factor a'_r can then be determined to guarantee $\frac{a'_r}{w_{m,total}} \leq \frac{\alpha_r}{w_{m,r}}$, by applying (15) to (13):

$$a'_r = \alpha_r w_{m,total} \frac{w_{m,r}}{(w_{a,r})^2}.$$
(16)

Considering the maximum throughput of single-path flows in (12), a'_r can be expressed in a form similar to (3) as follows:

$$a'_r = \alpha_r w_{m,total} \frac{\max_s w_{m,s} / RTT_s^2}{(\sum_s w_{m,s} / RTT_s)^2}.$$
 (17)

In a wireless environment, packet loss can be induced by congestion as well as link errors. On one hand, it is expected that the lower physical and link layers can address well packet erasure due to link errors. On the other hand, the above AIMD-based algorithm can be properly integrated with a wireless TCP solution as a sublayer below the multipath congestion control module. For example, in [8], a source node differentiates loss due to congestion or link errors based on explicit congestion notification (ECN). In the latter case, the source retransmits packets without decreasing the congestion window. Only if explicit congestion signal is received over a path should the source decrease its congestion window according to the AIMD parameters calculated above to ensure fairness. Therefore, in this case, the packet loss rate p_r in (13) refers in particular to loss due to congestion.

TABLE I System parameters for experiments.

Parameter	Value
Both path bandwidth in Scenario I	10 Mbit/s
Path 1 bandwidth in Scenario II	4.27 Mbit/s
Path 2 bandwidth in Scenario II	7.73 Mbit/s
Packet size	500 bytes
RED maximum queue length	100 packets
RED threshold	60 packets

III. EXPERIMENT RESULTS AND DISCUSSIONS

We implement the MP-DAIMD and CMP-AIMD congestion control algorithms in ns - 2 by extending the existing TCP module. Simulations are conducted with the system parameters in Table I. Two scenarios are considered for the topology in Fig. 1, where two paths have the same bandwidth (Scenario I) or different bandwidths (Scenario II). There is one multipath subflow on each path as well as one or two AIMD singlepath flows (one on path 1 and two on path 2). Random early detection (RED) scheduling is used to ensure that every flow or subflow on the same path has the same opportunity to receive a congestion signal such as triple duplicate acknowledgements. In addition, we use saturated traffic model at the source and a constant packet size. This is because varying traffic may cause side effects that hinder proper interpretation of results.

Fig. 2(a) shows the throughput of three single-path AIMD flows and the total throughput of a multipath MP-DAIMD flow in Scenario I. The AIMD parameters (α_r, β_r) for each subflow can be derived by Eqs. (10) and (11). Two examples are illustrated in Fig. 2(a). In each case, we select two pairs of AIMD parameters (α_r, β_r) for the two subflows of the MP-DAIMD flow and show them as the labels for the x-axis. Here, we use the same β_r for the two subflows over the two paths. As seen in Fig. 2(a), the multipath MP-DAIMD flow evenly shares the bandwidth with the other three single-path AIMD flows, which meets the design constraint C1. Further, Fig. 2(b) shows the corresponding throughput of single-path AIMD flows and the multipath MP-DAIMD flow in Scenario II, where the bandwidth of path 2 is 1.8 times that of path 1. It is clearly observed in Fig. 2(b) that MP-DAIMD also achieves fair sharing with respect to C1 in the heterogeneous case.

From the end user's perspective, the fairness constraint C2 is defined to ensure that a multipath flow does not take more bandwidth than the single-path flows when subject to the same loss rate. The extended congestion control solution CMP-AIMD aims to meet the constraint C2. While the AIMD parameters are selected to satisfy Eq. (1), the aggressiveness factor a'_r is dynamically adapted according to (17). Given $(\alpha_r, \beta_r) = (1.36, 0.375)$, Fig. 3 shows the total throughput of a multipath CMP-AIMD flow and that of three single-path AIMD flows that run separately on two paths. As seen, the multipath CMP-AIMD flow approaches the maximum throughput of the single-path flow over the best path, provided that they experience the same packet loss.

Indeed, a multipath transport solution needs to aggregate available bandwidth of multiple paths and offer an improved throughput. However, it is necessary to regulate multipath



Fig. 2. Throughput of single-path AIMD and multipath MP-DAIMD flows.



Fig. 3. Throughput of single-path AIMD and CMP-AIMD multipath flows with $(\alpha_r, \beta_r) = (1.36, 0.375)$.

flows so that dominant single-path flows are protected from being starved by the aggressive multipath behavior. In Fig. 4, we compare CMP-AIMD to an existing multipath solution MPTCP [4] with respect to the fairness constraint C2 for both the homogeneous and heterogeneous scenarios. Here, three single-path AIMD flows share the bandwidth with a multipath flow, and two pairs of (α_r, β_r) are considered. As seen, in the presence of single-path flows, CMP-AIMD always satisfies C2 and does not exceed the throughput of single-path flows over the best path. In contrast, the MPTCP-based multipath flow is much more aggressive and taking more bandwidth than single-path flows as MPTCP only addresses fairness with TCP flows.

IV. CONCLUSIONS

In this paper, we focus on the congestion control issue for multipath transmission. To ensure fair bandwidth sharing between multipath and single-path flows, two design constraints are considered in developing congestion control solutions for multipath transmission. On one hand, it is expected from a network operator's perspective that each multipath or singlepath flow obtains an even share of the overall bandwidths if each flow is charged the same. On the other hand, an end



Fig. 4. Throughput of single-path AIMD and multipath CMP-AIMD and MPTCP flows.

user can be motivated to start multipath transmission if the aggregate throughput of a multipath flow is no less than that of a single-path flow over the best path. Two AIMD-based congestion control solutions, known as *MP-DAIMD* and *CMP-AIMD*, are analyzed to achieve the two design goals. We derive the conditions to properly select the AIMD parameters in terms of (α, β) pairs and an aggressiveness factor. As shown in the simulation results, the two solutions satisfy the fairness constraints in both homogeneous and heterogeneous scenarios.

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