Network Optimization and Control

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Boston – Delft

Foundations and Trends $^{\ensuremath{\mathbb{R}}}$ in Networking

Published, sold and distributed by: now Publishers Inc. PO Box 1024 Hanover, MA 02339 USA Tel. +1-781-985-4510 www.nowpublishers.com sales@nowpublishers.com

Outside North America: now Publishers Inc. PO Box 179 2600 AD Delft The Netherlands Tel. +31-6-51115274

The preferred citation for this publication is S. Shakkottai and R. Srikant, Network Optimization and Control, Foundation and Trends[®] in Networking, vol 2, no 3, pp 271–379, 2007

ISBN: 978-1-60198-102-8 © 2008 S. Shakkottai and R. Srikant

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Foundations and Trends[®] in Networking Vol. 2, No. 3 (2007) 271–379 © 2008 S. Shakkottai and R. Srikant DOI: 10.1561/130000007



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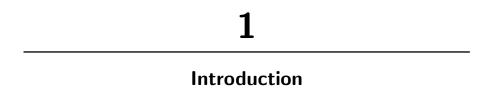
Abstract

We study how protocol design for various functionalities within a communication network architecture can be viewed as a distributed resource allocation problem. This involves understanding what resources are, how to allocate them fairly, and perhaps most importantly, how to achieve this goal in a distributed and stable fashion. We start with ideas of a centralized optimization framework and show how congestion control, routing and scheduling in wired and wireless networks can be thought of as fair resource allocation. We then move to the study of controllers that allow a decentralized solution of this problem. These controllers are the analytical equivalent of protocols in use on the Internet today, and we describe existing protocols as realizations of such controllers. The Internet is a dynamic system with feedback delays and flows that arrive and depart, which means that stability of the system cannot be taken for granted. We show how to incorporate stability into protocols, and thus, prevent undesirable network behavior. Finally, we consider a futuristic scenario where users are aware of the effects of their actions and try to game the system. We will see that the optimization framework is remarkably robust even to such gaming.

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The Internet has been one of the most conspicuous successes of the communications industry, and has permeated every aspect of our lives. Indeed, it is a testimony to its relevance in modern lifestyle that Internet connectivity is now considered an essential service like electricity and water supply. The idea that a best-effort data service could attain such significance was perhaps difficult to imagine a couple of decades ago. In fact, the Internet was initially envisioned as a decentralized data transmission network for military use. The argument was that if there were no centralized control, such as in a telephone network, and if much of the intelligence was at the edges of the system, it would make the network that much harder to destroy. Concurrent with the indestructibility requirements of the military was the need of scientific laboratories which required a network to exchange large data files of experimental results with each other. They envisioned high-speed links for transferring data between geographically distant data sources. The two requirements, coupled with statistical multiplexing ideas that illustrated the efficiency of using packetized data transmission gave rise to the Internet.

2 Introduction

As the network grew, it was clear that unrestricted data transfer by many users over a shared resource, i.e., the Internet, could be bad for the end users: excess load on the links leads to packet loss and decreases the effective throughput. This kind of loss was experienced at a significant level in the 1980s and was termed *congestion collapse*. Thus, there was a need for a protocol to control the congestion in the network, i.e., control the overloading of the network resources. It led to the development of a congestion control algorithm for the Internet by Van Jacobson [34]. This congestion control algorithm was implemented within the protocol used by the end hosts for data transfer called the Transmission Control Protocol (TCP). Even though TCP is a lot more than just a congestion control algorithm, for the purposes of this review, we will use the terms "TCP" and "TCP congestion control algorithm" interchangeably.

Congestion control can also be viewed as a means of allocating the available network resources in some fair manner among the competing users. This idea was first noted by Chiu and Jain [13] who studied the relationship between control mechanisms at the end-hosts which use one-bit feedback from a link and the allocation of the available bandwidth at the link among the end-hosts. In fact, some of the details of Jacobson's congestion control algorithm for the Internet were partly influenced by the analytical work in [13]. The resource allocation viewpoint was significantly generalized by Kelly et al. [41] who presented an optimization approach to understanding congestion control in networks with arbitrary topology, not just a single link. The purpose of this review is to present a state-of-the-art view of this optimization approach to network control. The material presented here is complementary to the book [89]. While the starting point is the same, i.e., the work in [41], this review focuses primarily on the developments since the writing of [89]. The purpose of this review is to provide a starting point for a mature reader with little background on the subject of congestion control to understand the basic concepts underlying network resource allocation. While it would be useful to the reader to have an understanding of optimization and control theory, we have tried to make the review as self contained as possible to make it accessible to a large audience. We have made it a point to provide extensive references, and the interested reader could consult these to obtain a deeper understanding of the topics covered. We hope that by providing a foundation for understanding the analytical approach to congestion control, the review will encourage both analysts and systems designers to work in synergy while developing protocols for the future Internet.

The review is organized as follows. We state the resource allocation objective in Section 2 and present the optimization formulation of the resource allocation problem. In Section 3, we will study decentralized, dynamic algorithms that solve the optimization problem. The section explains the framework for the design of such algorithms and proves the convergence of these algorithms. We then study current and recently proposed congestion control protocols, and their relationship to the optimization framework in Section 4. We then proceed to study the question of network stability in Section 5. We study two concepts of stability — that of convergence of algorithms to the fair allocation in the presence of feedback delays, and the question of whether the number of flows in the system would remain finite when flows arrive and depart. Finally, in Section 6, we study resource allocation from a game-theoretic viewpoint. In all the previous sections, it was assumed that the users cooperate to maximize network utility. In Section 6, we study selfish users whose goal is to maximize their own utility and their impact on the total network utility.

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