# Wavelength Selection in OBS Networks Using Traffic Engineering and Priority-Based Concepts

Jing Teng, Student Member, IEEE, and George N. Rouskas, Senior Member, IEEE

Abstract—A fundamental assumption underlying most studies of optical burst switched (OBS) networks is that full wavelength conversion is available throughout the network. In practice, however, economic and technical considerations are likely to dictate a more limited and sparse deployment of wavelength converters in the optical network. Therefore, we expect wavelength assignment policies to be an important component of OBS networks. In this paper, we explain why wavelength selection schemes developed for wavelength routed (circuit-switched) networks are not appropriate for OBS. We then develop a suite of adaptive and nonadaptive policies for OBS switches. We also apply traffic engineering techniques to reduce wavelength contention through traffic isolation. Our performance study indicates that, in the absence of full conversion capabilities, intelligent choices in assigning wavelengths to bursts at the source can have a profound effect on the burst drop probability in an OBS network.

*Index Terms*—Optical burst switching (OBS), traffic engineering, wavelength assignment.

# I. INTRODUCTION

PTICAL burst switching (OBS) is a technology positioned between wavelength routing (i.e., circuit switching) and optical packet switching. All-optical circuits tend to be inefficient for traffic that has not been groomed or statistically multiplexed, and optical packet switching requires practical, cost-effective, and scalable implementations of optical buffering and optical header processing, which are several years away. OBS is a technical compromise that does not require optical buffering or packet-level parsing, and it is more efficient than circuit switching when the sustained traffic volume does not consume a full wavelength. The transmission of each burst is preceded by the transmission of a control packet, whose purpose is to inform each intermediate node of the upcoming data burst so that it can configure its switch fabric in order to switch the burst to the appropriate output port. An OBS source node does not wait for confirmation that an end-to-end connection has been setup; instead it starts transmitting a data burst after a delay (referred to as "offset"), following the transmission of the control packet. For a detailed description, evaluation, and comparison of the various OBS reservation protocols, including just-enough-time (JET) [6], just-in-time (JIT) [12], and Horizon [10] (the reader is referred to [8]).

Over the last five years, research in OBS networks has rapidly progressed from purely theoretical investigations [6], [10] to prototypes and proof-of-concept demonstrations [1], [2]. For a recent overview of the breadth and depth of current OBS research, see [3]. Yet despite the multitude of directions that OBS research has taken, and the broad set of challenges it addresses, there is one fundamental assumption underlying most studies of OBS networks: namely, that full wavelength conversion is available throughout the network. The existence of wavelength conversion capability at optical switches has a profound effect on the performance of an OBS network, since it removes the wavelength continuity constraint. Without wavelength conversion, a switch can forward an incoming burst to an output port if and only if the wavelength carrying the burst is available (free) on the output port. Otherwise, wavelength contention arises and the incoming burst is dropped. By allowing a switch to forward an incoming burst to an output port as long as the port has at least one free wavelength, full wavelength conversion eliminates the wavelength continuity constraint altogether, and improves significantly the performance of the OBS network. As a result, the burst drop probability in networks with limited or no wavelength conversion will be higher, sometimes substantially so, than in networks with full conversion.

Currently, wavelength converters are expensive and complex devices, and this state of affairs is expected to continue in the foreseeable future. Therefore, it is widely expected that any wavelength conversion capabilities in the optical network will be limited and only sparsely deployed [7]. This observation has two important consequences. First, any performance studies relying on the assumption of full wavelength conversion will underestimate the burst drop probability in the network, possibly by a substantial factor, and may also fail to correctly identify the real behavior and dynamics of the network. Second, the absence of (full) conversion necessitates the development of good and efficient wavelength assignment policies. Such policies are even more important in OBS networks than in wavelength routed (circuit-switched) optical networks, due to the fact that in the former, a burst is transmitted without first reserving resources along the path. Therefore, a burst may be dropped at any intermediate switch along its path, even as it enters its last hop before the destination, resulting in substantial waste of network resources.

Although there is a substantial amount of research addressing the wavelength assignment problem in circuit-switched optical networks (for instance, refer to [15] and references thereof), the same problem has received little attention in the context of OBS networks. Recently, a priority-based wavelength assignment (PWA) algorithm was presented in [11]; we discuss the

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The authors are with the Department of Computer Science, North Carolina State University, Raleigh, NC 27695-7534 USA (e-mail: jteng@eos.ncsu.edu; rouskas@eos.ncsu.edu).

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PWA algorithm in detail in Section IV. Another recent work presented an algorithm to reduce wavelength contention in the OBS network by using some information regarding the routing paths [5]. Although these studies represent a step in the right direction, we feel that the issue of wavelength assignment in OBS network has not been adequately addressed, and that much remains to be done in order to develop a good understanding of the problem in all its aspects.

In this paper, we attempt to fill this gap by presenting a comprehensive study of wavelength assignment in OBS networks. Specifically, we develop a suite of wavelength selection policies, and we evaluate their relative performance in terms of both burst drop probability and fairness with respect to burst path lengths. Our policies attempt to alleviate the effects of wavelength contention by using the wavelength dimension to isolate traffic from different sources that uses overlapping paths through the network. We present two methods to achieve traffic isolation: the first is based on traffic engineering approaches that take into account the network topology and the routing paths to reduce wavelength contention through traffic isolation, while the second uses adaptive selection strategies that respond to feedback from the network. We also show that by appropriately combining the two methods we can achieve substantial improvement in performance.

The next section discusses our main assumptions regarding the OBS network we study. In Section III, we explain why conventional wavelength assignment schemes are not appropriate for OBS networks, and we develop a traffic engineering approach to achieve traffic isolation. In Section IV, we present a number of adaptive, priority-based wavelength assignment schemes, and we show how to combine them with the traffic engineering approach. We present the results of an experimental study of the performance of the various wavelength assignment policies in Section V, and we conclude this paper in Section VI.

## **II. OBS NETWORK UNDER STUDY**

We consider an OBS network with N switches, interconnected in a general topology. Each link in the network can carry burst traffic on any wavelength from a fixed set of W wavelengths,  $\{\lambda_1, \lambda_2, \ldots, \lambda_W\}$ . The network switches employ the JIT reservation scheme [12] and the associated Jumpstart signaling protocol [1], [2] for JIT OBS networks. We emphasize, however, that the wavelength assignment policies we develop and evaluate in this work are independent of the specifics of the reservation protocol, and can be deployed alongside either the JET [6] or the Horizon [10] reservation schemes.

We assume that there are no wavelength converters in the OBS network; however, our work can be extended to OBS networks with sparse conversion capabilities. A switch wishing to transmit a burst selects a free wavelength on the outgoing link for the transmission. The optical signal carrying the burst must then remain in the same wavelength on all the links along the path to the destination, unless an intermediate switch is capable of wavelength conversion. A wavelength contention arises when two bursts, which overlap in time, arrive at a switch on the same wavelength and need to use the same output port (outgoing link). We assume that switches have no buffers (electronic or optical)

to store bursts; therefore, if the switch does not have any wavelength converters, one of the overlapping bursts is dropped. Consequently, wavelength selection at the source of the burst will critically affect the performance of the network in terms of burst drop probability.

The set of rules used by a switch in selecting the wavelength on which to transmit a burst define a wavelength assignment policy. Wavelength assignment is a hard problem that has been studied extensively in the context of wavelength routed networks [15]. Since wavelength assignment decisions must be made in real time, an efficient implementation approach is to have each switch order the W wavelengths in a wavelength list. When a switch has a new burst to send, it starts at the top of the list and transmits the burst on the first wavelength that is free on the desired outgoing link. Typically, all switches in the network will use the same policy (rules) to order the wavelengths. However, if the policy rules use information on the state of the network to rank wavelengths, the wavelength list at any given time may be different at various switches; furthermore, the wavelength list at a given node may change over time. This operation may result in different choices in wavelength assignment at various switches, and over time at the same switch. We also note that, a wavelength assignment policy is fully defined by describing the set of rules the network switches use to rank wavelengths.

We can classify wavelength assignment policies as adaptive or nonadaptive. In adaptive policies, the rules for ordering wavelengths take into account the network and traffic dynamics, hence, the order in which a given switch considers the wavelengths in search of a free one may change over time. In nonadaptive schemes, on the other hand, the order in which wavelengths are considered by each switch is neither dependent on, nor determined by, the prevailing network conditions. We emphasize that the rules of a nonadaptive policy may dictate a different wavelength list at different switches, or even a different ordering of wavelengths at a given switch over time; however, the rules must be independent of the network dynamics, although they may depend on certain properties of the network, such as topology or routing, that change at longer time scales.

Adaptive wavelength assignment policies depend on feedback from the network in order to adapt their rules to reflect the state of the network. This feedback can take many forms, depending on the specifics of the signaling protocol and the implementation details. The Jumpstart signaling protocol for JIT OBS networks [1], [2] provides such feedback in the form of two messages. The CONNECT message is returned to the source of a burst by the destination switch, and indicates that the burst transmission was successful. The FAILURE message is sent to the source of a burst by an intermediate switch when the latter is forced to drop the burst; certain fields of the FAILURE message indicate the reason for dropping the burst, e.g., "destination unreachable" or "output port unavailable." As a result, the source of a burst can determine whether the burst is successfully received or dropped, and in the latter case, where the drop occurred and whether the cause was wavelength contention. Some of the wavelength assignment policies we develop in this work rely on similar feedback from the network to adapt their rules.

In this paper, we only consider the wavelength assignment problem. For simplicity, we assume fixed-path routing, in that all bursts between a source-destination pair follow the same path. Our work does not preclude changes in the routing paths, however, we make the reasonable assumption that any such changes take place at time scales significantly longer than the diameter of the network. Although we do not assume alternate routing, it is possible to modify the policies we develop to work when multiple paths are available between each source-destination pair. We also emphasize that route assignment can have a significant impact on the performance of an OBS network. In another recent study, the authors have addressed the issue of optimally selecting paths to minimize the burst drop probability [9]. While that work assumes full wavelength conversion inside the OBS network, we expect that combining an optimal set of paths with the wavelength assignment strategies we present in this work will further improve the performance when wavelength conversion is not available.

## **III. NONADAPTIVE WAVELENGTH ASSIGNMENT SCHEMES**

### A. First-Fit and Random

The first-fit and random wavelength assignment schemes are well-known and have been extensively studied in the context of wavelength routed networks [15]. We consider them here as baseline policies for comparing against the new schemes we develop.

In first-fit, the W wavelengths are labeled arbitrarily and are listed in increasing order of label value, say,  $\lambda_1, \lambda_2, \ldots, \lambda_W$ . This order is identical at all network switches, and remains unchanged throughout the operation of the network. When a switch wishes to select a free wavelength for transmitting its burst, it searches the wavelength list in this order, until either a free wavelength is found and assigned to the burst, or the list is exhausted (in which case, we assume that the burst is dropped).

The random wavelength assignment policy works as follows. We assume that each switch maintains a list of the wavelengths that are busy on each of its outgoing links. Suppose that at a given time, a switch needs to select a wavelength for a burst whose outgoing link has W' free wavelengths  $W' \leq W$ . If W' = 0, the switch drops the burst; otherwise, it randomly allocates one of the W' free wavelengths to the burst. Note that this policy is within the class of policies we described in the previous section: each time a switch needs to make a selection, it lists the W wavelengths in some arbitrary order, and picks the first free wavelength in the list. However, this is a nonadaptive policy since the order is independent of the network state.

It is known that, in wavelength routed (i.e., circuit-switched) networks, where wavelength assignment decisions are based on complete knowledge of wavelength availability along the links of the path, first-fit minimizes wavelength fragmentation and, hence, performs significantly better than random in terms of blocking probability [15]. First-fit is also simple to implement and does not require the exchange of any information among network switches regarding wavelength usage statistics.

However, in OBS networks, a switch must select a wavelength *without* any knowledge of the instantaneous wavelength occupancy of the links along the path. In this context, the first-fit



Fig. 1. First-fit results in high burst drop probability at switch  $S_3$ .

policy may in fact result in poor performance in terms of burst drop probability. In order to illustrate the problems associated with the first-fit policy in OBS networks, consider the simple network shown in Fig. 1. In this network, switches  $S_1$  and  $S_2$ transmit bursts which must travel over the common link  $e_3$ . The switches make wavelength assignment decisions using only local information, without any knowledge of the state of the link  $e_3$ .<sup>1</sup> Since both switches search for a free wavelength in the same order, it is highly likely to pick the same wavelength, causing one of the bursts to be dropped at switch  $S_3$ . With the random policy, on the other hand, the probability that both switches will select the same wavelength for the transmission is lower, leading to better performance. The performance results we present in Section V confirm this intuition; in fact, our study indicates that first-fit is the worst policy by far, while random performs significantly better in relative terms.

## B. First-Fit-TE: Combining First-Fit and Traffic Engineering

We now present a modified version of the first-fit wavelength assignment policy which is designed to overcome the shortcomings of the conventional first-fit policy in OBS networks. In order to motivate our approach, let us return to the scenario depicted in Fig. 1, and assume again that the W wavelengths on each link are labeled  $\lambda_1, \ldots, \lambda_W$ . It is not difficult to see that, among all wavelength assignment policies that use only local information at switches  $S_1$  and  $S_2$ , the following policy would minimize the burst drop probability at switch  $S_3$ .

- One of the two switches (say, S<sub>1</sub>) uses the first-fit policy, and searches for a free wavelength in the order λ<sub>1</sub>, λ<sub>2</sub>,..., λ<sub>W</sub>.
- The other switch (say, S<sub>2</sub>) also uses the first-fit policy, but searches for a free wavelength in the reverse order λ<sub>W</sub>, λ<sub>W-1</sub>,..., λ<sub>1</sub>.

This policy minimizes the burst drop probability at switch  $S_3$  because switches  $S_1$  and  $S_2$  will select the same wavelength (and thus, a burst will be dropped at switch  $S_3$ ) if and only if all other wavelengths are busy transmitting bursts. In contrast, other policies using only local information at switches  $S_1$  and  $S_2$  (e.g., random, conventional first-fit, etc.) might select the same wavelength at both switches even while other wavelengths are free.

While it is straightforward to identify the optimal wavelength assignment policy for the simple network of Fig. 1, determining the optimal policy for a large network with a general topology is a difficult and complicated task. Therefore, we now present a new wavelength assignment policy that is similar to first-fit, but

<sup>&</sup>lt;sup>1</sup>Note that, due to the relatively short duration of bursts, any information that switches  $S_1$  and  $S_2$  may have regarding the state of link  $e_3$  may already be out-of-date by the time they receive it; therefore, such information will not be useful in making wavelength assignment decisions.

uses information regarding the network topology and routing paths to improve upon conventional first-fit in terms of the burstdrop probability; we will refer to this new policy as first-fit-TE, where "TE" stands for "traffic engineering."

Consider an OBS network with general topology. The network consists of N switches, and each link can carry W wavelengths. The W wavelengths are labeled arbitrarily as  $\lambda_1, \ldots, \lambda_W$ , and this order is fixed and known at all N switches. Each switch  $S_i$ ,  $i = 1, \ldots, N$ , is assigned a *start wavelength*,  $start(i) \in {\lambda_1, \ldots, \lambda_W}$ . The value of start(i) is determined using a traffic engineering approach we describe shortly, and remains fixed throughout the operation of the network.<sup>2</sup> Furthermore, it is possible that two different switches,  $S_i$  and  $S_j$ ,  $j \neq i$ , be assigned the same start wavelength start(i) = start(j).

The first-fit-TE wavelength assignment policy at switch  $S_i$ , i = 1, ..., N, operates as follows.

• When the switch has a new burst to transmit, it searches for a free wavelength in the order

 $\lambda_{\operatorname{start}(i)}, \lambda_{\operatorname{start}(i)+1}, \ldots, \lambda_W, \lambda_1, \ldots, \lambda_{\operatorname{start}(i)-1}.$ 

• The switch transmits the burst on the first free wavelength found, and drops it if all W are found busy.

In other words, each switch follows a first-fit policy, but, unlike the conventional first-fit scheme that requires all nodes to use the same search sequence, under first-fit-TE, the start wavelength of the search sequence can be different for different switches.

Let d(i, j) denote the distance between the start wavelengths of the two switches  $S_i$  and  $S_j$  in the sequence  $\lambda_1, \ldots, \lambda_W$ 

$$d(i,j) = \operatorname{start}(j) \ominus \operatorname{start}(i)$$

where  $\ominus$  denotes subtraction modulo-W. We note that, when the network is not heavily loaded, the wavelengths on which a switch  $S_i$  transmits its bursts will be close to its start wavelength start(i). Therefore, the main idea behind the first-fit-TE policy is to assign a start wavelength to each switch in the network in such a manner that, the higher the "interference" among bursts originating at two switches  $S_i$  and  $S_j$ , the higher the distance d(i, j) between the start wavelengths of the two switches. In this context, we use the notion of "interference" as a measure of the likelihood that bursts generated by different switches will use the same link on the way to their respective destinations.

The level of "interference" among two switches depends on the network topology, the relative location of the switches in the network, the traffic characteristics and the routing algorithm. For instance, bursts from two switches located at diametrically opposite points in a large network are likely to use nonoverlapping paths, while bursts originating at two neighboring switches may use paths with substantial overlap; we say that the former pair of switches has low "interference," while the latter pair has high "interference." We now formalize the concept of interference in a quantitative manner. In the following discussion, we assume that the network employs fixed routing so that bursts between a given source-destination pair always follow the same path; however, our main idea can be adapted to apply to other routing schemes.

Let  $\Pi_i$  denote the set of paths taken by bursts originating at switch  $S_i, \Pi_i = \{\pi_{i1}, \pi_{i2}, \ldots, \pi_{iN}\}$ , where  $\pi_{ij}$  is the path from switch  $S_i$  to switch  $S_j$ . Let also  $\gamma_{ij}$  denote the traffic load of bursts from switch  $S_i$  to switch  $S_j$ . We define the *degree of interference* of a path  $\pi_{ij}$  and a switch  $S_k$ , denoted by  $ID(\pi_{ij}, k)$ , as the amount of traffic from switch  $S_i$  to  $S_j$  on the path  $\pi_{ij}$  that interferes with traffic originating from switch  $S_k$ 

$$ID(\pi_{ij}, k) = \begin{cases} \gamma_{ij}, & \pi_{ij} \text{ shares a link with a path in } \Pi_k \\ 0, & \text{otherwise} \end{cases}$$
(1)

We also define the *interference level* between two switches  $S_i$  and  $S_j$ , which we will denote by IL(i, j), as

$$IL(i,j) = \begin{cases} \sum_{\pi_{ik} \in \Pi_i} ID(\pi_{ik},j), & i \neq j \\ 0, & i = j \end{cases}$$
(2)

That is, IL(i, j) is the total amount of traffic originating at switch  $S_i$  which may interfere (through the use of common network links) with any traffic originating at switch  $S_j$ . Please note that expressions (1) and (2) depend on the routing scheme. Since the routing paths from some node *i* can be very different than those from some node *j*, there is no symmetry in the computation of IL(i, j) and IL(j, i), which, as a result, can be different, even if  $\gamma_{ij} = \gamma_{ji}$ . Finally, we define the *combined interference level* CIL(i, j) between two switches  $S_i$  and  $S_j$  as the total interference between the two switches

$$\operatorname{CIL}(i,j) = \operatorname{IL}(i,j) + \operatorname{IL}(j,i), \quad i \neq j.$$
(3)

With the above definitions, the higher the combined interference level between two switches, the higher the likelihood that bursts from the two switches will share some network link. Therefore, to minimize the probability that bursts from the two switches will collide on a common link, we must ensure that they do not use the same wavelength. In other words, we must assign start wavelengths to the two switches that are far apart from each other. Conversely, if the interference level between two switches is low, their bursts are less likely to share links and collide; consequently, the start wavelengths of the two switches can be close to each other.

Given the interference levels IL(i, j) for all pairs of switches  $(S_i, S_j)$  in the network, our objective is to determine the start wavelength start(i) for each switch  $S_i$  so as to minimize the burst dropping probability in the network under the first-fit-TE wavelength assignment policy defined earlier. It might be tempting to formulate this problem as an integer optimization problem and attempt to solve it using standard problem solvers. Unfortunately, it is not possible to express the objective function (i.e., the network-wide burst drop probability) analytically in terms of the problem variables. Even if we chose to formulate the problem in terms of a different objective function for which such an analytical expression is available, two issues would arise. First, there is the question of what would be an appropriate and relevant objective function; and second, even if we were to find an appropriate objective function, the complexity of the resulting problem would preclude the use of optimal solution methods for anything other than small, toy networks.

<sup>&</sup>lt;sup>2</sup>Note that it is possible to update periodically the values of start(*i*), i = 1, ..., N, to reflect changes in the network topology and/or routing paths. However, we expect that any such updates will take place over long time scales and will have only a transient effect on the network operation.

Instead, we use a simple heuristic to assign start wavelengths to the various switches, which we have found to work well in practice. The heuristic consists of three steps.

- Step 1) Partition the set of N switches in K groups (subsets),  $g_1, g_2, \ldots, g_K$ , such that there is little interference among switches in each group. All the switches in a given group  $g_k, k = 1, \ldots, K$ , will be assigned the same start wavelength.
- Step 2) Arbitrarily label the W wavelengths as  $\lambda_1, \ldots, \lambda_W$ , and let x = W/K (note that x may not be integer). We evenly space the K start wavelengths across the W wavelengths, such that the kth start wavelength is the wavelength labeled  $\lambda_{1+|(k-1)x|}$ .
- Step 3) We assign the K start wavelengths to each of the K groups so as to minimize the interference level among groups with adjacent start wavelengths.

Let us now explain the first and third steps of the heuristic in more detail.

Partitioning: Typically, partitioning problems with objective functions similar to the one we consider here (i.e., to minimize the interference among switches in each group) are hard optimization problems [4]. Therefore, we use the following greedy heuristic to assign each switch to one of K groups. Let N =LK + M, M < K; in our heuristic, the first M groups will consist of L + 1 switches, and the last K - M groups of L switches. Consider group  $g_k, k = 1, \dots, K$ . Initially,  $g_k = \emptyset$ . Select the switch  $S_i$  that has not been assigned to a group yet, such that  $S_i$  has the minimum total combined interference level,  $\sum_{j=1}^{N} \operatorname{CIL}(i,j)$ , among unassigned switches. Let  $g_k \leftarrow g_k \cup$  $\{\vec{S}_i\}$ . Then, select the unassigned switch  $S_i$  that has the minimum combined interference level CIL(i, j) with switch  $S_i$ , and let  $g_k \leftarrow g_k \cup \{S_i\}$ . Continue in this manner, selecting the next switch to add to  $g_k$  so as to minimize the overall combined interference level in the group, until the total number of switches in group  $g_k$  has been reached. If k = K, the algorithm stops; otherwise, it continues with group  $g_{k+1}$ .

Assignment of Start Wavelengths: Again, we use a greedy algorithm to assign start wavelengths to groups of switches in sequential order. First, note that the first start wavelength is always  $\lambda_1$ . We assign this wavelength as the start wavelength of the group g for which the total combined interference level among all switches in g and switches in any other group is minimum (over all K groups). Suppose now that the first k, k < K, start wavelengths have been assigned, and let g be the group that was the last to be assigned a start wavelength. Let g' denote the unassigned group such that the total interference among switches in g and switches in g',  $\sum_{S_i \in g, S_g \in g'} IL(i, j)$ , is minimum. Then, we assign the (k + 1)th start wavelength to group g'. The algorithm proceeds in this manner until all groups have been assigned start wavelengths.

To illustrate our approach, let us consider the two network topologies shown in Figs. 3 and 4. To simplify the presentation, we assume that the traffic load  $\gamma_{ij} = \gamma = 1$  for all switch pairs  $(S_i, S_j)$ . The 4 × 4 torus network of Fig. 3 has a regular topology, and is a dense network with each node having a rather high degree. The 16-node network of Fig. 4, on the other hand, has an irregular topology which is obtained by augmenting the



Fig. 2. Start wavelength for each group of switches NSFNet W = 16 wavelengths, K = 8 groups.



Fig. 3.  $4 \times 4$  torus network.

14-node NSFNet topology through the addition of two fictitious switches, switch  $S_1$  and switch  $S_{16}$ , to capture the effect of NSFNet's connections to Canada's communication network CA\*net.

For each network topology, we first run Dijkstra's algorithm to compute the shortest path for each pair of switches. We then computed the interference level IL(i, j) for each pair of switches  $(S_i, S_j)$  using expressions (2) and (1), after letting  $\gamma_{ij} = 1$  for all i, j. Tables I and II list the interference levels for each pair of switches in the torus and NSFNet topologies respectively. Assuming that K = 8, i.e., that we partition the 16 switches into 8 groups of size 2, the groups for the torus network are:  $\{1, 11\}, \{2, 12\}, \{3, 9\}, \{4, 10\}, \{5, 15\}, \{6, 16\}, \{7, 13\}, and \{8, 14\}$ . For the NSFNet, on the other hand, the eight groups are:  $\{1, 14\}, \{2, 16\}, \{3, 13\}, \{4, 8\}, \{5, 12\}, \{6, 9\}, \{7, 11\}, and \{10, 15\}$ . Also, the start wavelength assigned to each group of switches in the NSFNet is shown in Fig. 2.

Finally, we note that the approach we presented in this section assumes that the paths  $\pi_{ij}$  between all pairs of switches in the OBS network are given, and computes the interference levels as in expressions (1)–(3). An interesting problem, which is outside the scope of this paper, is to compute the paths so as to minimize the interference levels among the various switches. We are currently working on routing algorithms for OBS networks that take interference into account when computing paths.



Fig. 4. 16-node topology based on the 14-node NSFNet.

TABLE IInterference Levels IL(i, j) for the 4 × 4 Torus Network

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
_		2	5		-	•	,	0		10	11	12	15		15	10
1	0	12	6	11	11	9	4	6	4	2	0	3	14	5	4	4
2	12	0	10	8	9	11	8	6	4	10	5	0	6	14	12	1
3	5	8	0	14	3	6	10	9	0	7	10	6	3	8	10	11
4	14	11	12	0	8	7	9	12	3	0	5	10	7	6	9	12
5	9	8	4	6	0	12	6	9	11	3	1	9	8	2	0	1
6	5	14	6	6	14	0	8	8	7	10	3	4	3	7	6	0
7	2	7	14	12	7	14	0	14	2	4	10	10	0	3	5	8
8	8	6	12	14	14	12	14	0	11	2	10	14	6	0	4	12
9	8	2	0	2	9	4	1	5	0	8	3	14	10	4	3	4
10	7	12	5	0	9	7	5	3	14	0	9	7	11	14	10	1
11	0	2	10	5	3	7	14	12	3	14	0	11	0	12	12	9
12	3	0	7	8	5	3	10	11	11	7	12	0	4	2	7	14
13	12	6	4	6	3	1	0	1	8	3	0	7	0	5	5	12
14	11	13	10	7	6	3	3	0	9	13	6	2	11	0	13	1
15	4	6	12	8	0	2	6	3	2	12	10	6	4	13	0	5
16	7	2	8	11	1	0	8	8	3	1	9	14	6	2	7	0

TABLE II Interference Levels IL(i, j) for the 16-Node NSF Network

	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16
1	0	13	13	9	3	3	11	14	13	5	3	4	3	1	12	3
2	13	0	13	14	7	7	6	3	2	2	9	3	2	3	11	2
3	13	13	0	6	11	14	5	3	3	13	1	2	1	13	11	1
4	11	12	8	0	14	10	10	4	2	3	14	11	10	6	14	11
5	5	9	8	14	0	14	14	13	1	11	5	5	4	13	13	4
6	5	9	14	7	14	0	8	4	1	14	4	5	4	14	7	4
7	9	7	3	5	14	13	0	14	13	7	3	6	5	4	9	5
8	14	8	6	3	3	2	14	0	14	9	3	11	10	3	9	11
9	13	2	4	2	1	1	13	14	0	14	12	12	11	10	4	12
10	6	2	13	2	13	14	7	7	14	0	4	8	6	10	2	7
11	4	11	1	14	6	4	4	4	12	4	0	12	11	8	13	12
12	5	3	3	10	5	4	5	10	11	11	13	0	10	14	5	14
13	3	1	1	6	3	2	3	6	11	5	12	10	0	8	3	14
14	1	3	13	5	13	14	3	4	3	10	12	13	10	0	2	12
15	14	11	8	14	8	6	9	6	4	2	13	6	5	2	0	5
16	3	1	1	8	3	2	3	9	11	8	12	14	14	11	3	0

#### IV. ADAPTIVE WAVELENGTH ASSIGNMENT SCHEMES

In adaptive wavelength assignment schemes, the order in which each switch uses to search for an available wavelength changes over time in response to the state of the network and prevailing traffic conditions. A common mechanism to implement adaptive wavelength assignment, which we adopt in this work, is by assigning a *priority* to each wavelength. At any given instant, the priority of a wavelength reflects the likelihood that a burst transmission on this wavelength will be successful, i.e., the burst will not be dropped due to wavelength contention at an intermediate switch. The wavelength priorities are updated periodically based on feedback from the network, so as to reflect the current network conditions. Specifically, when a switch determines that a burst transmitted on a particular wavelength has been successfully received, it increases the priority of the wavelength; conversely, if the burst is dropped inside the network, the priority of the wavelength carrying the burst is decreased. Typically, every switch in the OBS network uses the same algorithm to set the priority of wavelengths, and maintains locally a list of the W wavelengths in decreasing order of priority. Therefore, the order in which a given switch considers wavelengths for burst transmission changes over time, according to the relative changes in wavelength priorities. Furthermore, at any given time instant, the wavelength order at one switch may be different, possibly substantially so, than the wavelength order at another switch, due to the differences in transmission success that bursts from the two switches experience over the various wavelengths.

A wavelength assignment scheme based on priorities was presented in [11], and was referred to as "priority wavelength assignment" (PWA). This work assumes a single, fixed path for each source-destination pair  $(S_i, S_i)$  which all bursts from switch  $S_i$  to  $S_j$  follow. Under PWA, each switch  $S_i$  in the OBS network maintains locally a priority value for each wavelengthdestination pair; in other words, switch  $S_i$  assigns a priority to each tuple  $(\lambda_w, S_i), w = 1, \dots, W$ , and  $i \neq j = 1, \dots, N$ . The priority of tuple  $(\lambda_w, S_i)$  is set to the ratio of the number of bursts which have been successfully transmitted from  $S_i$  to  $S_j$ on wavelength  $\lambda_w$  (along the fixed path associated with this pair of switches) over the total number of bursts transmitted from  $S_i$ to  $S_i$  on the same wavelength. When switch  $S_i$  needs to transmit a burst to  $S_i$ , it considers the wavelengths in decreasing order of priority of the corresponding tuples  $(\lambda_w, S_j)$  and uses the first free one. Depending on the outcome of the transmission, the switch then updates the priority of the tuple. It is shown in [11] that, under low load, PWA performs better than the random wavelength assignment policy in terms of burst drop probability; under high load, on the other hand, it performs only marginally better than random.

We now introduce two additional PWA schemes which differ from the one presented in [11] in two ways. First, a priority is associated with each wavelength in a different way than in [11], resulting in a tradeoff between complexity (in both space and time) and performance. Second, our notion of priority, and the manner in which it is incremented and decremented, are different than the one in [11]. Next, we describe the operation of the new PWA schemes, and then we define the priority values and the way they are updated. In our discussion, we will use the notation  $p(\bullet)$  to denote the priority function.

The first scheme, which we call "PWA-link," works as follows. Each switch  $S_i$  maintains a priority value for each wavelength-link pair, i.e., for each tuple  $(\lambda_w, e), w = 1, \ldots, W$ , and  $e \in E$ , where E is the set of links in the network. Whenever the switch wishes to transmit a burst to some switch  $S_j$  over path  $\pi = \{e_1, e_2, \ldots, e_k\}$ , it computes the wavelength-path priorities  $p(\lambda_w, \pi)$  by adding up the corresponding wavelength-link priorities along the path links

$$p(\lambda_w, \pi) = \sum_{e \in \pi} p(\lambda_w, e)$$
  $w = 1, \dots, W.$ 



Fig. 5. Linear network to illustrate the difference between PWA and PWA-link.

The switch considers the wavelengths in decreasing order of  $p(\lambda_w, \pi)$ , and transmits the burst on the first free wavelength.<sup>3</sup> Upon learning the outcome of the transmission, the switch:

- *increments* the priority of the links, if any, on which the burst was successfully transmitted;
- decrements the priority of the link, if any, at which it was dropped due to contention;
- *maintains* the priority of any other links (e.g., links following the one where the burst was dropped).

We will explain shortly how the priorities are incremented or decremented.

PWA-link operates at finer granularity and uses more information than PWA in making wavelength assignments, therefore one might expect that it would lead to better performance; indeed, numerical results to be presented in the next section confirm that a network employing PWA-link has lower overall burst drop probability than when pure PWA is employed. To explain the difference in performance, let us consider the simple linear network shown in Fig. 5, and suppose that switch  $S_1$ transmits a burst to switch  $S_5$  on some wavelength  $\lambda_w$ . Suppose further that the burst is dropped at switch  $S_4$ . Under PWA, the priority of the tuple  $(\lambda_w, S_5)$  is decremented, without taking into account the fact that the burst transmission was successful on the first three links of the path from  $S_1$  to  $S_5$ ; indeed,  $p(\lambda_w, S_5)$  is decremented by the same amount regardless of which switch in the path dropped the burst. In PWA-link, on the other hand, this additional information is used in updating the priorities of the wavelength-link tuples. Since the burst was successful on links  $e_1$ ,  $e_2$ , and  $e_3$ , the priorities  $p(\lambda_w, e_1)$ ,  $p(\lambda_w, e_2)$ , and  $p(\lambda_w, e_3)$  are incremented, while  $p(\lambda_w, e_4)$  is decremented. Note that by increasing the priorities of  $\lambda_w$  on the first three links, this wavelength will move up the list with respect to burst transmissions to switches  $S_2$ ,  $S_3$ , and  $S_4$ , as it should, since the burst reached all three switches successfully.

The second scheme we propose is simpler than both PWA and PWA-link, and we will refer to it as "PWA- $\lambda$ ." With this scheme, each switch  $S_i$  assigns a priority value  $p(\lambda_w)$  to every wavelength  $\lambda_w$ ,  $w = 1, \ldots, W$ . When switch  $S_i$  successfully transmits a burst on wavelength  $\lambda_w$ , the priority  $p(\lambda_w)$  is incremented regardless of the destination of the burst or the path traveled. Otherwise, the priority of the wavelength is decremented. Intuitively, PWA- $\lambda$  will perform worse than either PWA or PWA-link in terms of burst drop probability, but it is simpler and easier to implement.

Let us now consider the space and time complexity of implementing the three PWA schemes at each switch. PWA- $\lambda$  requires O(W) memory to record the priority information, where W is the number of wavelengths. It also needs O(1) time to update the priority value of a wavelength once the

relevant feedback from the network has been received, and  $O(\log W)$  time to maintain a sorted priority list. PWA requires O(WN) memory for recording priority values, where N is the number of switches in the network; and it takes constant time to update the priority of a wavelength-destination pair. It also takes  $O(\log W)$  time to maintain a sorted priority list, since it only needs to have one such list of W elements (wavelengths) for each of the N destinations. Finally, PWA-link needs  $O(W \mid E \mid)$  memory for the priority values, where E is the set of links in the network. When the feedback regarding a burst transmission is received, the switch must update the priority of all wavelength-link pairs along the path, and this operation takes time  $O(\Delta)$ , where  $\Delta$  denotes the diameter of the network. The computational overhead for maintaining a sorted list per destination is  $O(k \log W)$ , where k is the number of paths overlapping with the path to this destination. As we can see, the three PWA schemes represent a tradeoff between implementation complexity and performance, with PWA-link being the best performing but most complex, PWA- $\lambda$  the worst performing but easiest to implement, and pure PWA occupying the middle ground in both metrics.

We now turn our attention to the priority function and the increment and decrement operations used to update the wavelength priorities. Recall that in [11], which introduced PWA, the priority of a wavelength-destination  $(\lambda_w, S_j)$  pair was defined as the fraction of transmissions to destination  $S_i$  on wavelength  $\lambda_w$  that have been successful. However, our experimental investigations indicate that this measure may not be appropriate because of disparities in the rates of change in priority over time and across wavelengths. Specifically, while initially the rate of change is relatively large, the rate of change diminishes over time: once the number of bursts transmitted on a wavelength becomes relatively large, each additional transmission has a negligible effect on the priority, regardless of the outcome. As a result, once the network has been in operation for a while and the priorities have settled, it will take a long time for priorities to adapt to any changes in the traffic or network dynamics, during which bursts will use suboptimal wavelengths and the burst drop probability will be high. Furthermore, the rate of change in priority can be different for different wavelengths, possibly substantially so. For instance, consider two wavelengths that have the same priority but one has been used substantially more often that the other for transmitting bursts. In this case, at each step (i.e., burst transmission), the priority of the wavelength that has been used more frequently will change by a small amount in either direction, while the priority of the less frequently used wavelength will change by a larger amount. Given that both these properties are undesirable, it would be preferable to use a priority scheme in which the rate of change at each update is not affected by length of time or frequency of use of a wavelength.

In our work, the priorities  $p(\bullet)$  are taken to be real numbers in the range [1, W], and are initialized to W/2. We use an "additive increase–additive decrease" (AIAD) scheme to update the priorities, with increment Inc and decrement Dec. Specifically, after the result of a burst transmission has become known, a switch takes the following steps.

Step 1) If the burst transmission was successful, the appropriate priority (or priorities, in the case

<sup>&</sup>lt;sup>3</sup>Throughout this paper, we assume that ties are broken arbitrarily, so that a switch may select any one of a set of wavelengths having the same priority with uniform probability.

of PWA-link) are incremented as follows:  $p(\bullet) \leftarrow \max\{p(\bullet) + \operatorname{Inc}, W\}.$ 

Step 2) Otherwise, the appropriate priorities are decremented as  $p(\bullet) \leftarrow \min\{p(\bullet) - \text{Dec}, 1\}$ .

We have conducted a large number of experiments to determine the best values of the increment Inc and decrement Dec to use with the AIAD scheme. Our results indicate that the performance of the PWA policies is best when Inc < Dec, and Inc takes values from  $0.2 \sim 0.4$ , while the value of Dec is in the range  $0.8 \sim 1.2$ .

### A. Combining PWA and Traffic Engineering

The PWA schemes achieve low burst drop probability by using the wavelength dimension to *isolate* interfering bursts. To see this, consider the scenario when burst traffic originating at two different switches uses overlapping paths through the network. The two switches will initially experience high burst loss and will try several different wavelengths for their traffic. Note that, the dropping of a burst from one switch due to the presence of a burst from the other leads to a decrease of the wavelength's priority in the former switch and an increase of the same wavelength's priority in the latter switch. Eventually, the priority of wavelengths on which one switch has been successful in transmitting bursts will rise high enough that they become the preferred wavelengths for this traffic, while the same set of wavelengths will fall out of favor at the other switch (due to low priority); and vice versa. In effect, the traffic from one switch is isolated from the traffic of the other through the use of different sets of wavelengths.

Recall now that the first-fit-TE scheme we presented in Section III-B also attempts to achieve traffic isolation. The difference is that it takes a traffic engineering approach, using information about the network topology, traffic demands, and routing paths to assign different start wavelengths to each switch. Therefore, it is natural to investigate whether combining the traffic engineering approach with the adaptive PWA schemes might produce further improvements in performance.

We now present a small modification to the PWA schemes to take advantage of the traffic engineering approach of Section III-B. The modification is applied at initialization time only, while the operation of the PWA schemes remains identical to the one described above. Recall that, in the original PWA schemes, all priorities are initialized to W/2. Therefore, initially all wavelengths are indistinguishable from each other with respect to transmission preference. The modification we propose is to use different initial priorities at each switch, so that different switches will be forced to use different wavelengths for interfering traffic from the very beginning. If the initial values are determined appropriately, this approach has the following benefits over pure PWA: 1) the initial burst losses will be avoided; 2) the switches will settle to preferred wavelengths faster; and 3) the network will achieve better overall traffic isolation.

Similar to the first-fit-TE wavelength assignment policy, we arbitrarily order the W wavelengths as  $\lambda_1, \ldots, \lambda_W$ , and we assign start wavelengths to the switches as we described in Section III-B. Consider some switch  $S_i$ , and let start(i) be its start wavelength. Let also next denote the next wavelength (modulo-W) that is assigned as the start wavelength of another switch; in other words, the wavelengths  $\lambda_{\text{start}(i)\oplus 1}, \ldots, \lambda_{\text{next} \ominus 1}$  are not assigned as start wavelengths for any switch ( $\oplus$  and  $\ominus$  denote addition and subtraction, respectively, modulo-W). Then, at switch  $S_i$  all priorities involving wavelengths  $\lambda_{\text{start}(i)}, \ldots, \lambda_{\text{next} \ominus 1}$  are initialized to W/2 + Inc, while the priorities of all other wavelengths are initialized to W/2, as before.<sup>4</sup> As a result, the switch will initially give preference to wavelengths  $\lambda_{\text{start}(i)}, \ldots, \lambda_{\text{next} \ominus 1}$ when transmitting bursts. The operation of the PWA schemes is not affected in any other way.

We will use the terms "PWA-TE," "PWA-path-TE," and "PWA- $\lambda$ -TE to refer to the versions of PWA, PWA-path, and PWA- $\lambda$  in which wavelength priorities are initialized in the manner described above.

# V. NUMERICAL RESULTS

In this section, we use simulation to compare the various static and adaptive wavelength schemes. We consider two 16-node network topologies, the  $4 \times 4$  torus network shown in Fig. 3, and the NSF network in Fig. 4. In our model, each OBS switch is connected to several users which transmit bursts simultaneously.5 Our goal is to compare the various wavelength assignment schemes in terms of: 1) overall (network-wide) burst drop probability and 2) burst drop probability as a function of path length. Since, in an OBS network without wavelength converters, the drop probability may increase with the number of hops a burst has to traverse, it is important that the wavelength assignment scheme achieve some degree of fairness among bursts that travel over paths of different length. For the results shown in most figures, the burst arrival process of each switch is Poisson and the burst length is exponentially distributed with mean  $1/\mu$ ; we also present results for a non-Poisson arrival process toward the end of this section. For simplicity, we also assume that bursts originating at a given switch are equally likely to be destined to any of the other switches. We used the method of batch means to estimate the burst drop probability; each of the simulation runs lasts until 400 000 bursts have been transmitted by the whole network. We have also obtained 95% confidence intervals for all our results; however, they are so narrow that we omit them from the figures we present in this section in order to improve readability. Finally, we note that the burst drop probability under full wavelength conversion would provide a lower bound on the burst drop probability of the wavelength schemes we consider here, which assume that no conversion capability is available.

 $<sup>^{4}</sup>$ Note that adding Inc to the initial value of the priority of a wavelength is equivalent to assuming that a single burst has been successfully transmitted on that wavelength.

<sup>&</sup>lt;sup>5</sup>The results shown in this section indicate that an OBS network requires a larger number of wavelengths than a statically provisioned wavelength routed network for the same load. In such a static network, traffic from the various users connected to a given switch would have to be buffered at the switch, and then multiplexed (groomed) onto the lightpath connecting it to the destination switch. In the OBS network we consider, these bursts can be transmitted simultaneously using separate wavelengths. Therefore, there is a tradeoff between more wavelengths (bandwidth) in the OBS network and larger buffers/higher delay in the static network.



Fig. 6. Burst drop probability,  $4 \times 4$  torus network, low load.



Fig. 7. Burst drop probability  $4 \times 4$  torus network, moderate and high load.

Figs. 6 and 7 plot the burst drop probability of the wavelength assignment schemes we described in Sections III and IV against the offered load to the network, expressed in Erlangs per wave*length.* These results are for the  $4 \times 4$  torus network and for W = 64 wavelengths. Fig. 6 shows the drop probability for low traffic load, while Fig. 7 shows the performance of the network under moderate and high loads. From these figures, we see that first-fit is always worse than random, confirming our previous analysis. We also make two important observations. First, the adaptive, priority-based schemes (i.e., PWA, PWA-link, and PWA- $\lambda$ ) perform better than random (with the exception of PWA- $\lambda$  at low loads less than 0.1). In particular, PWA-link, which uses more detailed information than the original PWA, is the best of the three adaptive schemes, PWA is the second best, while PWA- $\lambda$ , which uses the least amount of information, is the worst of the three. The second observation is that the traffic engineering approach we described earlier to achieve traffic isolation and reduce traffic interference, when combined with any wavelength assignment scheme, static or adaptive, leads to a significant decrease in burst drop probability. The most dramatic impact is with the first-fit scheme, in which case first-fit-TE has a burst drop probability that is up to two orders of magnitude lower than the plain first-fit policy. Similar



Fig. 8. Burst drop probability, NSFNet, low load.



Fig. 9. Burst drop probability, NSFNet, moderate and high load.

decreases (although of smaller magnitude) can be observed for the PWA-TE, PWA-link-TE, and PWA- $\lambda$ -TE schemes over the respective non-TE versions. Overall, we find that the best approach to wavelength assignment in OBS networks is to combine adaptive, priority-based schemes with our traffic engineering approach. Interestingly, we find that PWA-TE is the best performing scheme, having lower burst drop probability than even the PWA-link-TE scheme over a wide range of load values (note that, in contrast, PWA-link performs much better than PWA). We believe that this result is due to the fact that, in PWA-TE, the wavelength priorities are adjusted by considering the whole path of a burst, not individual links as in PWA-Link-TE, and this operation is more compatible with the traffic engineering approach we take.

Figs. 8 and 9 are similar to the previous two figures, but compare the burst drop probability of the nine wavelength assignment schemes for the NSFNet topology. We note that the burst drop probability is higher than in the torus network for the given load. This result is due to the fact that the NSFNet topology is: 1) more sparsely connected than the torus network and 2) irregular and, thus, without the inherent load balancing properties of the torus topology. As a result, certain links may become heavily congested when using shortest-path



Fig. 10. Burst blocking probability,  $4 \times 4$  torus network, load = 0.2.



Fig. 11. Burst blocking probability, NSFNet, load = 0.2.

routing, leading to higher burst drop probability.<sup>6</sup> The relative performance of the wavelength assignment schemes is very similar to the one we observed for the torus network: adaptive, priority-based schemes are better than static ones, and incorporating traffic isolation through traffic engineering leads to a decrease in drop probability. As before, PWA-TE is the best policy overall, except at very low loads. We also note that, at very high loads, the performance of all policies is similar; this is due to the fact that, at such high loads, burst dropping is mostly due to the lack of wavelengths.

Now, let us consider the gain as we increase the number W of available wavelengths. Figs. 10 and 11 plot the burst drop probability of the nine schemes as the number of wavelengths increases from 8 to 128, for the torus and NSFNet, respectively. The load per wavelength in the network is kept constant at 0.2 for these experiments. As we can see, the burst drop probability of first-fit increases, and it remains mostly unchanged in the case of random. These results are expected: random distributes



Fig. 12. Burst blocking probability,  $4 \times 4$  torus network, load = 0.2, W = 64.



Fig. 13. Burst blocking probability, NSF network, load = 0.2, W = 64.

the bursts randomly to the various wavelengths, but since the load per wavelength is constant, there is little change in overall drop probability; while first-fit attempts to use the same few first wavelengths, thus an increase in overall load, as W increases, results in higher drop probability. For the other schemes, in general, the drop probability decreases with the number of wavelengths, up to a point. But the decrease is not as dramatic as other studies, which assume full wavelength conversion, have shown. This result indicates that OBS networks will benefit from some degree of wavelength conversion. Finally, we note that PWA-TE and PWA-link-TE are the two schemes that show a consistent drop in burst drop probability for the range of wavelengths considered here. Since these are the best performing schemes overall, this result indicates that a combination of adaptive policies with traffic engineering is the best approach to take advantage of wavelength resources in the OBS network.

Figs. 12 and 13 plot the burst drop probability as a function of the number of hops in a burst's path, for the torus and NSFNet topologies, respectively. As expected, the burst drop probability increases with the length of the path. However, while for some schemes (e.g., random and first-fit) there can be a difference of

<sup>&</sup>lt;sup>6</sup>As we mentioned earlier, in the case of sparsely connected, irregular topologies, computing paths so as to minimize traffic interference may lead to significant improvements over shortest-path routing. Such routing algorithms are currently under investigation by our group.



Fig. 14. Burst blocking probability,  $4 \times 4$  torus network, non-Poisson traffic, low load, W = 64.

two orders of magnitude between the drop probability of bursts traversing one hop versus bursts that travel four hops, the difference is less acute when schemes employing adaptive policies with traffic engineering are used. Therefore, our approach not only improves the overall burst drop probability, it also increases the fairness among bursts. Again, we find that PWA-TE is the best performing scheme even when path lengths are taken into consideration.

Finally, Fig. 14 presents results obtained by using a non-Poisson arrival process, for the  $4 \times 4$  torus network with W = 64 wavelengths under low load. The arrival process is the three-state Markovian process we developed and analyzed in [13]; its parameters can be selected to introduce any degree of burstiness into the arrival process. For this experiment, we set the coefficient of variation of this arrival process to 3.5, considerable higher than the corresponding value for the Poisson process (whose coefficient of variation is equal to one). As a result, the arrival process is considerably more "bursty" than Poisson. Comparing Fig. 14 to Fig. 6 which corresponds to Poisson traffic, we observe that, in general, the results are quite similar, both in terms of absolute values and in terms of the relative performance of the various wavelength allocation strategies. The only exception is that PWA-link performs better than first-fit-TE in the non-Poisson case, whereas the opposite is true under Poisson arrivals; however, the absolute difference in performance for these two strategies is rather small. We also obtained results under the new arrival process for the NSFNet topology and for higher loads; since the performance graphs are similar to those under Poisson traffic, we omit them.

Overall, the simulation results indicate that adaptive policies perform better than nonadaptive ones; and that applying traffic engineering techniques to achieve traffic isolation can further improve the performance of an OBS network in terms of burst drop probability and fairness. The PWA-TE scheme has been shown to perform the best over all the experiments we have conducted, with PWA-Link-TE a close second. Since PWA-TE is relatively easier to implement and involves fewer computations and memory requirements, it is the best choice for OBS networks with no wavelength conversion capabilities.

#### VI. CONCLUDING REMARKS

Previous studies [14] have established that wavelength conversion is the most effective contention resolution scheme in optical packet- or burst-switched bufferless networks. However, in the absence of wavelength conversion capabilities, the performance of an OBS network may suffer significantly (i.e., by an increase of several orders of magnitude in terms of the burst drop probability), if traditional strategies, such as random or first-fit, are used to assign wavelengths to bursts at the edge of the network. In this paper, we studied the wavelength assignment problem in OBS networks, and we proposed a suite of policies based on the concepts of adaptivity and traffic engineering to achieve low burst blocking probability and to attain fairness among bursts with different path lengths. The best performing policies among the set we propose have the potential to improve the burst drop probability by as much as two orders of magnitude compared with random or first-fit, helping reduce the performance gap with respect to full wavelength conversion. We expect that the improvement possible with our policies over random and first-fit will increase with the size and diameter of the network. This observation is based on the results shown in Figs. 12 and 13, where it is evident that the performance benefit of our schemes increases with the number of hops in a burst's path. We also expect that our proposed wavelength allocation strategies will be especially useful in reducing the burst drop probability when combined with other techniques, including sparse or limited wavelength conversion and routing algorithms optimized for OBS (such as the ones we developed in [9]); the benefits of such an approach is the subject of current research.

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George N. Rouskas (S'92–M'95–SM'01) received the Diploma degree in computer engineering from the National Technical University of Athens (NTUA), Athens, Greece, in 1989, and the M.S. and Ph.D. degrees in computer science from the College of Computing, Georgia Institute of Technology (Georgia Tech.), Atlanta, in 1991 and 1994, respectively.

He is a Professor of Computer Science at North Carolina State University, Raleigh. During the 2000–2001 academic year, he spent a sabbatical term

at Vitesse Semiconductor, Morrisville, NC, and in May 2000 and December 2002, he was an Invited Professor at the University of Evry, Evry, France. His research interests include network architectures and protocols, optical networks, multicast communication, and performance evaluation.

Dr. Rouskas is a member of the Association for Computing Machinery (ACM) and of the Technical Chamber of Greece. He received the 2004 ALCOA Foundation Engineering Research Achievement Award, and the 2003 NCSU Alumni Outstanding Research Award. He is a recipient of a 1997 National Science Foundation (NSF) Faculty Early Career Development (CAREER) Award, a coauthor of a paper that received the Best Paper Award at the 1998 SPIE Conference on All-Optical Networking, and the recipient of the 1994 Graduate Research Assistant Award from the College of Computing, Georgia Tech. He is especially proud of his teaching awards, including his induction into the NCSU Academy of Outstanding Teachers in 2004, and the Outstanding New Teacher Award he received from the Department of Computer Science in 1995. He has been on the Editorial Boards of the IEEE/ACM TRANSACTIONS ON NETWORKING, Computer Networks, and Optical Networks, and he was a Co-Guest Editor for the IEEE JOURNAL ON SELECTED AREAS IN COMMUNICATIONS (Special Issue on Protocols and Architectures for Next-Generation Optical WDM Networks), published in October 2000. He was Technical Program Co-Chair of the Networking 2004 Conference, Program Chair of the IEEE LANMAN 2004 Workshop, and Program Co-Chair of the Traffic Grooming Workshop 2004. He also serves as General Co-Chair of the IEEE LANMAN 2005 workshop.



**Jing Teng** (S'02) received the B.S. degree in computer science from Wuhan University, Wuhan, China, in 1997, the M.S. degree in computer science from the Chinese Academy of Sciences, Beijing, China, in 2000, and the Ph.D. degree in computer science from the Department of Computer Science, North Carolina State University, Raleigh, in 2004.

His research interests include network architectures and protocols design, analysis, and performance evaluation.