

# Matching Output Queueing with a Combined Input/Output-Queued Switch

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**Abstract**—The Internet is facing two problems simultaneously: there is a need for a faster switching/routing infrastructure and a need to introduce guaranteed qualities-of-service (QoS). Each problem can be solved independently: switches and routers can be made faster by using input-queued crossbars instead of shared memory systems; QoS can be provided using weighted-fair queueing (WFQ)-based packet scheduling. Until now, however, the two solutions have been mutually exclusive—all of the work on WFQ-based scheduling algorithms has required that switches/routers use output-queueing or centralized shared memory. This paper demonstrates that a combined input/output-queueing (CIOQ) switch running twice as fast as an input-queued switch can provide precise emulation of a broad class of packet-scheduling algorithms, including WFQ and strict priorities. More precisely, we show that for an  $N \times N$  switch, a “speedup” of  $2 - 1/N$  is necessary, and a speedup of two is sufficient for this exact emulation. Perhaps most interestingly, this result holds for all traffic arrival patterns. On its own, the result is primarily a theoretical observation; it shows that it is possible to emulate purely OQ switches with CIOQ switches running at approximately twice the line rate. To make the result more practical, we introduce several scheduling algorithms that with a speedup of two can emulate an OQ switch. We focus our attention on the simplest of these algorithms, critical cells first (CCF), and consider its running time and implementation complexity. We conclude that additional techniques are required to make the scheduling algorithms implementable at a high speed and propose two specific strategies.

**Index Terms**— Communication systems, packet switching, quality-of-service (QoS).

## I. INTRODUCTION

**M**ANY commercial switches and routers today employ output-queueing.<sup>1</sup> When a packet arrives at an output-queued (OQ) switch, it is immediately placed in a queue that

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<sup>1</sup>When we refer to OQ in this paper, we include designs that employ centralized shared memory.

is dedicated to its outgoing line, where it waits until departing from the switch. This approach is known to maximize the throughput of the switch: so long as no input or output is oversubscribed, the switch is able to support the traffic and the occupancies of queues remain bounded. Furthermore, by carefully scheduling the time a packet is placed onto the outgoing line, a switch or router can control the packet’s latency and hence provide quality-of-service (QoS) guarantees. But output queueing is impractical for switches with high line rates and/or with a large number of ports, since the fabric and memory of an  $N \times N$  switch must run  $N$  times as fast as the line rate. Unfortunately, at high line rates, memories with sufficient bandwidth are simply not available.

On the other hand, the fabric and the memory of an input-queued (IQ) switch needs only to run as fast as the line rate. This makes input queueing very appealing for switches with fast line rates or with a large number of ports. For this reason, the highest-performance switches and routers use IQ-crossbar switches [3], [4]. But IQ switches can suffer from head-of-line (HOL) blocking, which can have a severe effect on throughput. It is well known that if each input maintains a single first in/first out (FIFO), then HOL blocking can limit the throughput to just 58.6% [5].

One method that has been proposed to reduce HOL blocking is to increase the “speedup” of a switch. A switch with a speedup of  $S$  can remove up to  $S$  packets from each input and deliver up to  $S$  packets to each output within a time slot, where a time slot is the time between packet arrivals at input ports. Hence, an OQ switch has a speedup of  $N$ , while an IQ switch has a speedup of one. For values of  $S$  between 1 and  $N$ , packets need to be buffered at the inputs before switching, as well as at the outputs after switching. We call this architecture a combined input/output-queued (CIOQ) switch.

Both analytical and simulation studies of a CIOQ switch that maintains a single FIFO at each input have been conducted for various values of speedup [6]–[9]. A common conclusion of these studies is that with  $S = 4$  or 5, one can achieve about 99% throughput when arrivals are independently, identically distributed (i.i.d) at each input, and the distribution of packet destinations is uniform across the outputs. Whereas these studies consider *average* delay (and simplistic input traffic patterns), they make no guarantees about the delay of individual packets. This is particularly important if a switch or router is to offer QoS guarantees.

We believe that a well-designed network switch should perform predictably in the face of all types of arrival process,<sup>2</sup> and it should allow the delay of individual packets to be controlled. Hence, our approach is quite different: rather than find values of speedup that work well on average, or with simplistic and unrealistic traffic models, we find the minimum speedup such that a CIOQ switch behaves *identically* to an OQ switch for *all* types of traffic. (Here, “behave identically” means that when the same inputs are applied to both the OQ switch and to the CIOQ switch, the corresponding output processes from the two switches are completely indistinguishable.) This approach was first formulated in the recent work of Prabhakar and McKeown [12]. They show that a CIOQ switch with a speedup of four can behave identically to a FIFO-OQ switch for arbitrary input traffic patterns and switch sizes. In this sense, this paper builds upon and extends the results in [12], as described in the following paragraph. A number of researchers have recently considered various aspects of the speedup problem, most notably [18], which obtains packet delay bounds and [19], which finds sufficient conditions for maximizing throughput through work conservation and the mimicking of output queueing.<sup>3</sup>

In this paper, we show that a CIOQ switch with a speedup of two can behave identically to an OQ switch. The result holds for switches with an arbitrary number of ports and for any traffic arrival pattern. It is also found to be true for a broad class of widely used output-link scheduling algorithms, such as weighted-fair queueing (WFQ), strict priorities, and FIFO. We introduce some specific scheduling algorithms that achieve this result. We also show more generally that a speedup of  $2 - 1/N$  is both necessary and sufficient for a CIOQ switch to behave identically to a FIFO-OQ switch.

It is worth briefly considering the implications of this result. It demonstrates that it is possible to emulate an  $(N \times N)$ -OQ switch using buffer memory operating at only twice the speed of the external line. Previously, an OQ switch could only be implemented with memories operating at  $N$  times the speed of the external line. However, the advantages do not come for free. In essence, the memory bandwidth is reduced at the expense of a fast cell-scheduling algorithm that is required to configure the crossbar. As we shall see, the scheduling algorithms are complex; the best ones known to date have a running-time complexity of  $N$ . (We discuss the implementation complexity in some detail in Section V.) This means that it is not yet practicable to emulate fast OQ switches with a large number of ports. While we propose some strategies in this paper, this is a topic for further research.

<sup>2</sup>The need for a switch that can deliver a certain grade of service, *irrespective of the applied traffic*, is particularly important given the number of recent studies that show how little we understand network-traffic processes [11]. Indeed, a sobering conclusion of these studies is that it is not yet possible to accurately model or simulate a trace of actual network traffic. Furthermore, new applications, protocols, or data-coding mechanisms may bring new traffic types in future years.

<sup>3</sup>In [20], the aim was to extend the results of [12], but the algorithms and proofs presented there are incorrect and do not solve the speedup problem. See <http://www.cs.cmu.edu/~istoica/IWQoS98-fix.html> for a discussion of the errors.

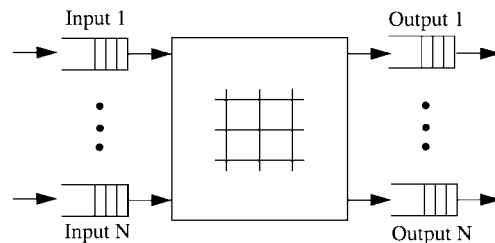


Fig. 1. A general CIOQ switch.

### A. Background

Consider the single stage  $(N \times N)$ -switch shown in Fig. 1. Throughout the paper, we assume that packets begin to arrive at the switch from time  $t = 1$ , the switch having been empty before that time. Although packets arriving to the switch or router may have variable length, we will assume that they are treated internally as fixed-length “cells.” This is common practice in high-performance LAN switches and routers; variable-length packets are segmented into cells as they arrive, carried across the switch as cells and reassembled back into packets again before they depart [3], [4]. We take the arrival time between cells as the basic time unit and refer to it as a *time slot*. The switch is said to have a speedup of  $S$  for  $S \in \{1, 2, \dots, N\}$ , if it can remove up to  $S$  cells from each input and transfer at most  $S$  cells to each output in a time slot. A speedup of  $S$  requires the switch fabric to run  $S$  times as fast as the input or output line rate. For  $1 < S < N$ , buffering is required both at the inputs and at the outputs and leads to a CIOQ architecture. The following is the problem we wish to solve.

1) *The Speedup Problem*: Determine the smallest value of  $S$  and an appropriate cell-scheduling algorithm  $\pi$  that:

- 1) allows a CIOQ switch to exactly mimic the performance of an OQ switch (in a sense that will be made precise);
- 2) achieves this for any *arbitrary* input traffic pattern;
- 3) is independent of switch size.

In an OQ switch, arriving cells are immediately forwarded to their corresponding outputs. This a) ensures that the switch is *work-conserving*, i.e., an output never idles so long as there is a cell destined for it in the system and b) allows the departure of cells to be scheduled to meet latency constraints.<sup>4</sup> We will require that any solution of the speedup problem possess these two desirable features; that is, a CIOQ switch must *behave identically* to an OQ switch in the following sense.

2) *Identical Behavior*: A CIOQ switch is said to behave identically to an OQ switch if, under identical inputs, the departure time of every cell from both switches is identical.

As a benchmark with which to compare our CIOQ switch, we will assume there exists a shadow  $(N \times N)$ -OQ switch that is fed the same input traffic pattern as the CIOQ switch. Our goal is to arrange for each cell to depart from the CIOQ switch at exactly the same time that its counterpart cell departs from the OQ switch. In the CIOQ switch, the sequence in which

<sup>4</sup>For ease of exposition, we will at times assume that the output uses a FIFO-queueing discipline, i.e., cells depart from the output in the same order that they arrived to the inputs of the switch. However, we are interested in a broader class of queueing disciplines: ones that allow cells to depart in time to meet particular bandwidth and delay guarantees.

cells are transferred from their input queues to the output queue is determined by a scheduling algorithm. In each time slot, the scheduling algorithm matches each nonempty input with at most one output, and conversely, each output is matched with at most one input. The matching is used to configure the crossbar fabric before cells are transferred from the input side to the output side. A CIOQ switch with a speedup of  $S$  is able to make  $S$  such transfers during each time slot.

Selecting the appropriate scheduling algorithm is the key to achieving identical behavior between the CIOQ switch and its shadow OQ switch.

### B. Push-In Queues

Throughout this paper, we will make repeated use of what we will call a *push-in queue*. Similar to a discrete-event queue, a push-in queue is one in which an arriving cell is inserted at an arbitrary location in the queue, based on some criterion. For example, each cell may carry with it a departure time, and it will be placed in the queue ahead of all cells with a later departure time, yet behind cells with an earlier departure time. The only property that defines a push-in queue is that once placed in the queue, cells may not switch places with other cells. In other words, their relative ordering remains unchanged. In general, we distinguish two types of push-in queues.

- 1) There are “push-in first-out” (PIFO) queues, in which arriving cells are placed at an arbitrary location, and the cell at the head of the queue is always the next to depart. PIFO queues are quite general—for example, a WFQ scheduling discipline operating at an OQ switch is a special case of a PIFO queue.
- 2) There are “push-in arbitrary-out” (PIAO) queues, in which cells are removed from the queue in an arbitrary order, i.e., it is not necessarily the case that the next cell to depart is the one currently at the head of the queue.

It is assumed that each input of the CIOQ switch maintains a queue, which can be thought of as an ordered set of cells waiting at the input port. In general, the CIOQ switches that we consider can all be described using PIAO input queues.<sup>5</sup> Many orderings of the cells are possible—each ordering leading to a different switch scheduling algorithm, as we shall see.

Each output maintains a queue for the cells waiting to depart from the switch. In addition, each output also maintains an *output priority list*, an ordered list of cells at the inputs waiting to be transferred to this particular output. The output priority list is drawn in the order in which the cells would depart from the OQ switch we wish to emulate (i.e., the shadow OQ switch). This priority list will depend on the queueing policy followed by the OQ switch (FIFO, WFQ, strict priorities etc.).

### C. Definitions

The following definitions are crucial to the rest of the paper.

**Definition 1—Time to Leave:** The “time to leave” for cell  $c$  [ $TL(c)$ ] is the time slot at which  $c$  will leave the shadow

<sup>5</sup>In practice, we need not necessarily use a PIAO queue to implement these techniques. But we will use the PIAO queue as a general way of describing the input queueing mechanism.

OQ switch. Note that it is possible for  $TL(c)$  to increase. This happens if new cells arrive to the switch, destined for  $c$ 's output, and they have a higher priority than  $c$ . (Of course,  $TL(c)$  is also the time slot in which  $c$  must leave from our CIOQ switch for the identical behavior to be achieved.)

**Definition 2—Output Cushion:** At any time, the “output cushion” of a cell  $c$  [ $OC(c)$ ] is the number of cells waiting in the output buffer at cell  $c$ 's output port with a smaller “time to leave” value than cell  $c$ .

Notice that if a cell is still on the input side and has a small (or zero) output cushion, the scheduling algorithm must urgently deliver the cell to its output so that it may depart on time. Since the switch is work conserving, a cell's output cushion decreases by one during every time slot, and it can only be increased by newly arriving cells that are destined to the same output and have a more urgent time to leave.

**Definition 3—Input Thread:** At any time, the “input thread” of cell  $c$  [ $IT(c)$ ] is the number of cells ahead of cell  $c$  in its priority list.

In other words,  $IT(c)$  represents the number of cells currently at the input that need to be transferred to their outputs more urgently than cell  $c$ . A cell's input thread is decremented only when a cell ahead of it is transferred from the input, and it is possibly incremented by newly arriving cells. Notice that it would be undesirable for a cell to simultaneously have a large input thread and a small output cushion—the cells ahead of it at the input may prevent it from reaching its output before its time to leave. This motivates our definition of *slackness*.

**Definition 4—Slackness:** At any time, the “slackness” of cell  $c$  [ $L(c)$ ] equals the output cushion of cell  $c$  minus its input thread i.e.,  $L(c) = OC(c) - IT(c)$ .

Slackness is a measure of how large a cell's output cushion is with respect to its input thread. If a cell's slackness is small, then it urgently needs to be transferred to its output. Conversely, if a cell has a large slackness, then it may languish at the input without fear of missing its time to leave.<sup>6</sup>

Fig. 2 shows a snapshot of a CIOQ switch with a number of cells waiting at its inputs and outputs. For convenience, we assume the time the snapshot was taken to be one. Let  $(P, t)$  denote a cell that will depart from output port  $P$  at time  $t$  in the shadow switch. Consider, for example, the cell  $c$  denoted in the figure by  $(A, 3)$ . For the CIOQ switch to mimic the shadow OQ switch, the cell must depart from port  $A$  at time 3. Its input thread is  $IT(c) = 1$ , since  $(B, 1)$  is the only cell ahead of  $c$  in the input priority list. Its output cushion is  $OC(c) = 2$ , since out of the three cells queued at  $A$ 's output buffer, only two cells  $(A, 1)$  and  $(A, 2)$  will depart before it. Furthermore, the slackness of cell  $c$  is given by  $L(c) = OC(c) - IT(c) = 1$ .

### D. The General Structure of Our CIOQ Scheduling Algorithms

For most of this paper, we are going to concern ourselves with CIOQ switches that have a speedup of two. Hence, we will break each time slot into four phases.

- 1) Arrival phase: all arrivals of new cells to the input ports take place during this phase.

<sup>6</sup>Note that a cell's input thread and slackness are only defined when the cell is waiting at the input side of the switch.

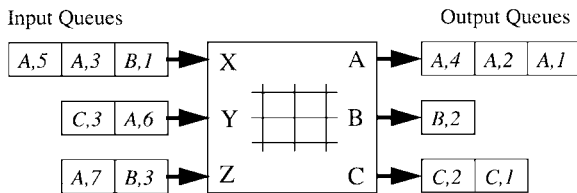


Fig. 2. A snapshot of a CIOQ switch.

- 2) First scheduling phase: the scheduling algorithm selects cells to transfer from inputs to outputs, and then transfers them across the crossbar.
- 3) Departure phase: all departures of cells from the output ports take place during this phase.
- 4) Second scheduling phase: again, the scheduling algorithm selects cells to transfer from inputs to outputs and transfers them across the crossbar.

The order in which the four phases occur is not crucial to our algorithms. However, we shall stick to ordering as it makes our proofs simpler.

A *matching* of input ports to output ports is a (not necessarily maximal) set of cells waiting on the input side, such that all these cells can be sent across the crossbar in a single transfer (i.e., are free of input and output contention). During each scheduling phase, the scheduler finds a *stable* matching between the input ports and the output ports.

*Definition 5—Stable Matching:* A matching of input ports to output ports is said to be “stable” if for each cell *c* waiting in an input queue, one of the following conditions holds.

- 1) Cell *c* is part of the matching, i.e., *c* will be transferred from the input side to the output side during this phase.
- 2) A cell that is ahead of *c* in its input priority list is part of the matching.
- 3) A cell that is ahead of *c* in its output priority list is part of the matching.

Notice that conditions 2 and 3 may be simultaneously satisfied, but condition 1 excludes the other two. The conditions for a stable matching can be achieved using the so-called *stable-marriage problem*. Solutions to the stable-marriage problem are called stable matchings and were first studied by Gale and Shapely [13]—they gave an algorithm that finds a stable matching in at most *M* iterations, where *M* is the sum of the lengths of all the input priority lists.

Our specification of the scheduling algorithm for a CIOQ switch is almost complete: the only thing that remains is to specify how the input queues are maintained. Different ways of maintaining the input queues result in different scheduling algorithms. In fact, the various scheduling algorithms presented later differ *only* in the ordering of their input queues. For reasons that will become apparent, we will restrict ourselves to a particular class of orderings, which is defined as follows.

*Definition 6—PIAO Input-Queue Ordering:* When a cell arrives, it is given a priority number that dictates its position in the queue. i.e., a cell with priority number *X* is placed at location (*X* + 1) from the head of the list. A cell is placed in an input priority list according to the following rules.

- 1) Arriving cells are placed at [or, “push(ed)-in(to)”] an arbitrary location in the queue.
- 2) The relative ordering of cells in the queue does not change once cells are in the queue, i.e., cells in the queue cannot switch places.
- 3) Cells may be selected to depart from the queue from any location.

Thus, to complete our description of the scheduling algorithms, we need only to specify an insertion policy that determines where an arriving cell gets placed in its input queue.

On the output side, the CIOQ switch keeps track of the time to leave for each waiting cell. During each time slot, the cell that departs from an output and is placed onto the outgoing line is the one with the smallest time to leave. For the CIOQ switch to successfully mimic the shadow OQ switch, we must ensure that each cell crosses over to the output side before it is time for the cell to leave.

Even before we finish defining the algorithm, we can already see that it must maintain a large amount of state. More importantly, the algorithm must keep track of a large amount of global state, taking into account information about the queues at all the inputs and all the outputs. We will discuss in Section V the information complexity of these algorithms and the difficulty of implementing them at high speed.

## II. NECESSITY AND SUFFICIENCY OF A SPEEDUP OF $2 - 1/N$

Having defined speedup, we now address the next natural question: what is the minimum required speedup *S* for a CIOQ switch to emulate an OQ switch? The following theorem answers this question.

*Theorem 1 (Necessity):* An  $(N \times N)$ -CIOQ switch needs a speedup of at least  $2 - 1/N$  to exactly emulate an  $(N \times N)$  FIFO-OQ switch.

*Proof:* The proof is by counterexample and is given in Appendix A. □

*Remark:* Since FIFO is a special case of a variety of output-queueing disciplines (WFQ, strict priorities etc.), the lower bound applies to these queueing disciplines as well.

*Theorem 2 (Sufficiency):* An  $(N \times N)$ -CIOQ switch with a speedup of  $2 - 1/N$  can exactly emulate an  $(N \times N)$  FIFO-OQ switch.

*Proof:* The proof is based on an insertion policy that we call last in highest priority (LIHP) and is presented in Appendix B. □

## III. A SIMPLE INPUT-QUEUE INSERTION POLICY FOR A SPEEDUP OF TWO

The proof of Theorem 2 is based on the LIHP input-queue insertion policy and—unfortunately—the proof is complex and somewhat counterintuitive. Furthermore, the LIHP is complex to implement, making it of little practical value. So in an attempt to provide a more intuitive understanding of the speedup problem, we present a simple and slightly more practical insertion policy that, with a speedup of two, mimics an OQ switch with a FIFO-queueing discipline. We call this insertion policy critical cells first (CCF).

Recall that to specify a scheduling algorithm for a CIOQ switch, we just need to give an insertion policy for the input queues. The CCF policy inserts an arriving cell as far from the head of its input queue as possible, such that the input thread of the cell is not larger than its output cushion. The following section explains the policy more formally.

1) *The CCF Insertion Policy:* Suppose cell  $c$  arrives at input port  $P$ . Let  $X$  be the output cushion of  $c$ . Insert cell  $c$  into the  $(X + 1)$ th position from the front of the input queue at  $P$ . Hence, upon arrival, cell  $c$  has a slackness of zero. If the size of this list is less than  $X$  cells, then place  $c$  at the end of the input priority list at  $P$ . Hence, in this case,  $c$  has a positive slackness.

A consequence of this is that a cell's slackness is nonnegative upon arrival. The intuition behind this insertion policy is that a cell with a small output cushion needs to leave soon (i.e., it is "more critical"), and therefore it needs to be delivered to its output sooner than a cell with a larger output cushion. In other words, a cell with a large output cushion can safely reside further from the head of its input queue.

We now prove that the CCF algorithm with a speedup of two mimics an OQ switch. Informally, the proof proceeds as follows. We first show a property of the CCF algorithm: a cell never has a negative slackness, i.e., a cell's input thread never exceeds its output cushion. We then proceed to show how this ensures that a cell always reaches the output side in time to leave.

*Lemma 1:* The slackness  $L$  of a cell  $c$  waiting on the input side is nondecreasing from time slot to time slot.

*Proof:* Let the slackness of  $c$  be  $L$  at the beginning of a time slot. During the arrival phase, the input thread of  $c$  can increase by at most one because an arriving cell might be inserted ahead of  $c$  in its input priority list. During the departure phase, the output cushion of  $c$  decreases by one. If  $c$  is scheduled in any one of the scheduling phases, then it is delivered to its output, and we need no longer concern ourselves with  $c$ . Otherwise, during each of the two scheduling phases, either the input thread of  $c$  decreases by one, or the output cushion of  $c$  increases by one (by the property of stable matchings—see Definition 5). Therefore, the slackness of  $c$  increases by at least one during each scheduling phase. Counting the changes in each of the four phases (arrival, departure, and the two scheduling phases), we conclude that the slackness of cell  $c$  cannot decrease from time slot to time slot.

*Remark:* Because the slackness of an arriving cell is nonnegative, it follows from Lemma 1 that the slackness of a cell is always nonnegative.

*Theorem 3:* Regardless of the incoming traffic pattern, a CIOQ switch that uses the CCF algorithm with a speedup of two exactly mimics a FIFO-OQ switch.

*Proof:* Suppose that the CIOQ switch has successfully mimicked the OQ switch up until time slot  $t - 1$ , and consider the beginning (first phase) of time slot  $t$ . We must show that any cell reaching its time to leave is either: 1) already at the output side of the switch or 2) will be transferred to the output during time slot  $t$ . From Lemma 1, we know that a cell always has a nonnegative slackness. Therefore, when a cell reaches

its time to leave (i.e., its output cushion has reached zero), the cell's input thread must also equal zero. This means either: 1) the cell is already at its output and may depart on time or 2) the cell is simultaneously at the head of its input priority list (because its input thread is zero) and at the head of its output priority list (because it has reached its time to leave). In this case, the stable-matching algorithm is guaranteed to transfer it to its output during the time slot, and therefore the cell departs on time.

#### IV. PROVIDING QoS GUARANTEES

As we pointed out in Section I, the goal of our work is to control the delay of cells in a CIOQ switch in the same way that is possible in an OQ switch. But until now, we have considered only the emulation of an OQ switch in which cells depart in FIFO order. We now show that with a speedup of two the CCF algorithm can be used to emulate an OQ switch that uses the broad class of PIFO-queueing policies (a class that includes widely-used queueing policies such as WFQ and strict priority queueing). Notice that with an arbitrary PIFO policy, the  $TL$  of a cell never decreases, but may increase as a result of arrival of higher-priority cells.

The description of the CCF algorithm remains unchanged; however, the output cushion and the output priority lists are calculated using the OQ switch that we are trying to emulate.

*Theorem 4:* Regardless of the incoming traffic pattern, a CIOQ switch that uses the CCF algorithm with a speedup of two exactly mimics an OQ switch that adheres to a PIFO-queueing policy.

The proof of Theorem 4 is almost identical to that of Theorem 3, and it is omitted here for brevity.

#### V. TOWARDS MAKING THE CCF ALGORITHM PRACTICAL

The CCF algorithm, as presented earlier, suffers from two main disadvantages. First, the stable matching that we need to find in each scheduling phase can take as many as  $N^2$  iterations.<sup>7</sup> Second, the algorithm has a high-information complexity—the CCF algorithm needs to know both the output cushion and the time to leave of each cell at the inputs; i.e., information that is not locally available at each input, but that depends on the state of all the switch outputs. We address these disadvantages in this section. The delay-till-critical (DTC) strategy reduces the number of iterations needed to compute a stable matching to  $N$  (from  $N^2$ ); and the group-by-virtual-output queue (GBVOQ) algorithm can emulate FIFO and WFQ-OQ switches without using global information. Unfortunately, the two solutions do not compose, i.e., we can reduce either the number of iterations to  $N$  or the information complexity, but cannot do both at the same time. We leave such a composition as an open problem.

<sup>7</sup>It is not immediately obvious that  $N^2$  iterations suffice. The reason for this is that if two cells at the same input port are destined to the same output port, the one with the lower TL occurs ahead of the other in the input priority list.

### A. The DTC Strategy

The DTC strategy is as follows: During each scheduling phase, mark as “active” all cells with a slackness of zero and mark all other cells inactive. The stable-matching algorithm now considers only active cells. Intuitively, cells with zero slackness are the most critical and should be considered for immediate transfer across the fabric. Since the slackness of a cell can never become negative,<sup>8</sup> the CCF algorithm combined with the DTC strategy can emulate any OQ switch that follows a FIFO-queueing policy.

It remains to be shown that this simple strategy reduces the number of iterations required to compute a stable matching from  $N^2$  to  $N$ . Before we prove this fact, let us examine the problem that we are trying to remove. At any time instant, we define the dependency graph  $G$  to be a directed graph with a vertex corresponding to each active cell that is waiting on the input side of the CIOQ switch. Let  $A$  and  $B$  be two cells waiting at the input side. There is a directed edge from  $B$  to  $A$ , if and only if cell  $A$  is ahead of  $B$ , either in an input queue or in an output priority list. Clearly, two cells have to share either the same input port or the same output port if there is to be an edge between them. If we use the CCF algorithm as defined in Section III, there may be cycles in this dependency graph. These cycles are the main cause of inefficiency in finding stable matchings, and the DTC strategy is designed to remove these cycles.

*Lemma 2:* If the DTC strategy is used in conjunction with the CCF algorithm, then during any scheduling phase, the dependency graph  $G$  is acyclic.

We defer the proof of Lemma 2 to Appendix C; instead, we focus on its implications and how a match can be constructed in  $N$  iterations. First, let us consider how the first cell in the match is found. Since there are no cycles in  $G$ , there has to be at least one “sink” (i.e., a cell with no outgoing edges). Let cell  $X$  be the sink. Since there are no active cells ahead of  $X$  in either its input queue or its output priority list, cell  $X$  has to be part of any stable matching of active cells. Hence,  $X$  is guaranteed to be transferred to the output side, and therefore we can remove from the graph all cells that have the same input or output port as  $X$ ; they clearly can not be part of the match. The resulting graph is again acyclic, and we can repeat the above procedure  $N-1$  more times to obtain a stable matching. Notice that each iteration of the above  $N$  iteration algorithm is quite straightforward.

We now address the second disadvantage of the CCF algorithm, i.e., that of high-information complexity.

### B. The GBVOQ Algorithm

With the CCF algorithm, the stable-matching algorithm needs to calculate both the time to leave and the output cushion of each cell in the input queues. These quantities require centralized information about the state of all the queues in the system, making the CCF algorithm (as described) unsuitable for a distributed implementation. However, for emulating a

FIFO-OQ switch, we can group incoming cells into virtual output queues (VOQ’s) and obtain an upper bound of  $N$  on the number of cells that need to be considered. The GBVOQ algorithm achieves this bound and is described as follows.

At each input, the GBVOQ algorithm maintains a single priority list as before, as well as a VOQ for each output port. All cells belong to a VOQ and the single input priority list. When a new cell arrives, it is always placed at the tail of the corresponding VOQ. If the VOQ was empty, the new cell is placed at the head of the input priority list. If, on the other hand, the VOQ is nonempty, the new cell is inserted in the input priority list just behind the last cell belonging to the same VOQ, i.e., all cells that are in the same VOQ occupy contiguous positions in the input priority list. Therefore, to make a scheduling decision, it is sufficient to just keep track of the relative priority ordering of VOQ’s. Since there are at most  $N$  VOQ’s at an input port in a FIFO switch, the size of the input priority list is bounded. Since the GBVOQ algorithm assigns a nonnegative slackness to an incoming cell, a CIOQ switch that uses the GBVOQ algorithm with a speedup of two successfully emulates a FIFO-OQ switch.

Apart from small priority lists, the GBVOQ algorithm has other desirable properties. First, the decision of where an incoming cell needs to be inserted is much simpler for the GBVOQ algorithm than the CCF—each input port can maintain its local priority queue without any access to global information. Second, during the stable-matching phase, to determine which of two cells has a higher output priority, we just need to compare the arrival timestamps of the two cells; the cell which arrived earlier will have a smaller TL (and hence a higher output priority) because of the FIFO property.

Like the CCF algorithm, the GBVOQ algorithm can be used in conjunction with the DTC strategy to reduce the number of iterations needed to compute a stable matching. In fact, the DTC strategy is made much simpler when used in conjunction with the GBVOQ algorithm because of the following property: if the cell at the head of a VOQ is marked inactive during a scheduling phase, the entire VOQ can be marked inactive, reducing the number of cells that need to be marked active/inactive. Unfortunately, however, to determine which VOQ’s need to be marked active, we again need to access to global state, namely the output cushion of each cell at the head of a VOQ. Finding a solution that simultaneously has low information complexity and a low number of iterations is an interesting and open problem.

The GBVOQ algorithm with per-flow VOQ’s can emulate WFQ with low information complexity. However, we have not been able to show a bound of even  $N^2$  on the number of iterations for this case.

## VI. EXTENSIONS TO MULTICASTING

We now briefly discuss the speedup required for the exact emulation of an OQ switch by a CIOQ switch when the incoming traffic is multicast. Suppose that the maximum “fanout” of an incoming cell (i.e., the maximum number of

<sup>8</sup>As soon as the slackness becomes zero, the cell would be marked active, and the slackness would increase by one during the current scheduling phase (see Lemma 1).

outputs it wishes to go to) is  $F$ . Then, by replicating this cell when it arrives at the input, we obtain up to  $F$  new arrivals in each time slot at that input. (This contrasts with the unicast case  $F = 1$ , in which at most one new cell arrives.) Thus, to extend Theorem 3 to include multicast traffic, we must allow for up to  $F$  new arrivals to take place per time slot. During a departure phase, the slackness of a cell can go down by at most one. During an arrival phase, the slackness of a cell already in the system can go down by at most  $F$ , since a new cell with fanout  $F$  may get inserted ahead of it. Recall from the proof of Lemma 1: the slackness of a cell must go up by at least one during each scheduling phase. Therefore, an equivalent of Lemma 1 (and hence Theorem 3) holds for multicast if the speedup is  $F + 1$ .

## VII. CONCLUSION

With the continued demand for faster and faster switches, it is increasingly difficult to implement switches that use output queueing or centralized shared memory. Before long, it will become impractical to build the highest performance switches and routers using these techniques. It has been argued for some time that most of the advantages of OQ can be achieved using CIOQ. While this has been argued for very specific and benign traffic patterns, there has always been a suspicion that the advantages would diminish in a more realistic operating environment.

We have seen that a CIOQ switch with a speedup of just two can behave identically to an OQ switch that employs a wide variety of packet-scheduling algorithms, such as WFQ, strict priorities, etc. Perhaps more importantly, we show this to be true for any traffic arrival pattern and for arbitrary switch sizes.

However, while this result makes possible a significant reduction in memory bandwidth, it comes at the expense of a scheduling algorithm. The scheduling algorithm is required to configure the crossbar, operating at least twice as fast as cells can arrive. While the algorithms that we describe here are quite simple, they have a running-time complexity of at least  $O(N)$  making them unsuitable for fast switches with a large number of ports. But the result does not preclude algorithms that are more readily implemented at higher speeds. We believe this to be an important area for future research.

## APPENDIX A

### THE NECESSITY OF A SPEEDUP OF $2 - 1/N$

With a speedup of two, the previously mentioned algorithms (the CCF and GBVOQ algorithms) exactly mimic an arbitrary-size OQ switch. The next natural question to ask is whether it is possible to emulate output queueing using a CIOQ switch with a speedup less than two. In this section, we show a lower bound of  $2 - 1/N$  on the speedup of any CIOQ switch that emulates OQ switching, even when the OQ switch uses FIFO. Hence, the algorithms that we have presented in this paper are almost optimal. In fact, the difference of  $1/N$  can be ignored for all practical purposes.

Since a speedup between one and two represents a nonintegral distribution of phases, we first describe how scheduling

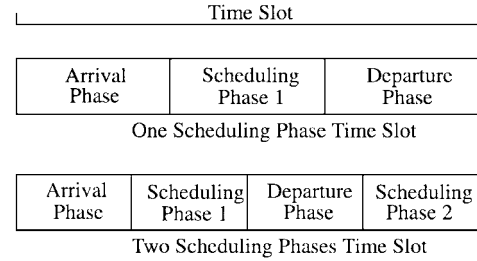


Fig. 3. One scheduling phase and two scheduling-phase time slots.

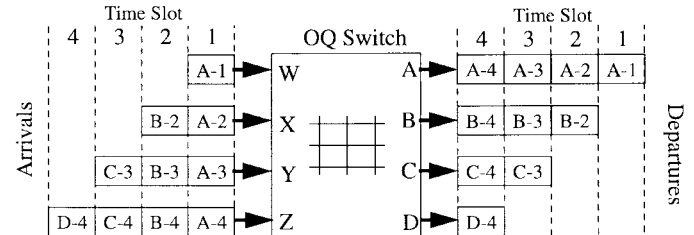


Fig. 4. Lower bound input traffic pattern for a  $4 \times 4$  switch.

phases are distributed. A speedup of  $2 - 1/N$  corresponds to having a *truncated* time slot out of every  $N$  time slots; the truncated time slot has just one scheduling phase, whereas the other  $N - 1$  time slots have two scheduling phases each. In Fig. 3, we show the difference between one-phased and two-phased time slots. For the purposes of our lower bound, we need to assume that the scheduling algorithm does not know in advance whether a time slot is truncated.

Recall from Section III that a cell is represented as  $P-TL$ , where  $P$  represents which output port the cell is destined to and  $TL$  represents the time to leave for the cell. For example, the cell C-7 must be scheduled for port C before the end of time slot 7.

The input traffic pattern that provides the lower bound for an  $(N \times N)$ -CIOQ switch is given as follows. The traffic pattern  $N$  spans time slots, the last of which is truncated.

- 1) In the first time slot, all input ports receive cells destined for the same output port,  $P_1$ .
- 2) In the second time slot, the input port that had the lowest time to leave in the previous time slot does not receive any more cells. In addition, the rest of the input ports receive cells destined for the same output port,  $P_2$ .
- 3) In the  $i$ th time slot, the input ports that had the lowest time to leave in each of the  $i - 1$  previous time slots do not receive any more cells. In addition, the rest of the input ports must receive cells destined for the same output port,  $P_i$ .

We can repeat traffic pattern just mentioned as many times as is required to create arbitrarily long traffic patterns. In Fig. 4, we show the above sequence of cells for a  $4 \times 4$  switch. The departure events from the OQ switch are depicted on the right, and the arrival events are on the left. For simplicity, we present the proof of our lower bound on this  $4 \times 4$  switch instead of a general  $N \times N$  switch.

Fig. 5 shows the only possible schedule for transferring these cells across in seven phases. Of the four time slots,

Phase	PA	PB	PC	PD
1	A-1			
2				
3		B-2		
4				
5			C-3	
6				
7				D-4

(a)

Phase	PA	PB	PC	PD
1	A-1			
2	A-2			
3		B-2		
4		B-3		
5			C-3	
6			C-4	
7				D-4

(b)

Phase	PA	PB	PC	PD
1	A-1			
2	A-2			
3	A-3	B-2		
4		B-3		
5		B-4	C-3	
6			C-4	
7				D-4

(c)

Phase	PA	PB	PC	PD
1	A-1			
2	A-2			
3	A-3	B-2		
4	A-4	B-3		
5		B-4	C-3	
6			C-4	
7				D-4

(d)

Fig. 5. Scheduling order for the lower bound input traffic pattern in Fig. 4.

the last one is truncated, giving a total of seven phases. Cell A-1 must leave the input side during the first phase, since the CIOQ switch does not know whether the first time slot is truncated. Similarly, cells B-2, C-3, and D-4 must leave during the third, fifth, and seventh phases, respectively [see Fig. 5(a)]. Cell A-2 must leave the input side by the end of the third phase. However, it cannot leave during the first or the third phase because of contention. Therefore, it must depart during the second phase. Similarly, cells B-3 and C-4 must depart during the fourth and sixth phases, respectively [see Fig. 5(b)]. Continuing this elimination process [see Fig. 5(c) and (d)], there is only one possible scheduling order. For this input traffic pattern, the switch needs all seven phases in four time slots, which corresponds to a minimum speedup of 7/4 (or  $2 - 1/4$ ).

**Theorem 5:** A minimum speedup of  $2 - 1/N$  is necessary for an  $(N \times N)$ -CIOQ switch operating under *any* algorithm that is not allowed to consider the number of scheduling phases in a time slot.

The proof of Theorem 5 is a straight-forward extension of the CIOQ-switch example.

APPENDIX B  
THE SUFFICIENCY OF A SPEEDUP OF  
 $2 - 1/N$  TO MIMIC A FIFO-OQ SWITCH

We now show that it is possible to emulate a FIFO-OQ switch using a speedup of  $2 - 1/N$ . Specifically, we show that this emulation can be achieved by a CIOQ switch that follows the general framework described in Section II, using a scheme that we call LIHP to determine input priorities for incoming cells. As the name suggests, LIHP places a newly arriving cell right at the *front* of the input priority list. The analysis in this section borrows heavily from ideas described in Section III.

In this section, we use a slightly different time slot structure. A “normal” time slot has an arrival phase followed by two scheduling phases and then a departure phase, whereas a “truncated” time slot has an arrival phase, a scheduling phase, and then a departure phase. Since the speedup is  $2 - 1/N$ , we assume that there are at least  $N - 1$  normal phases between two truncated phases. The CIOQ switch does not need to know which phases are truncated.

At any time instant, and for any cell  $X$ , let  $NTS(X)$  denote the number of truncated time slots between now and the time when this cell leaves the OQ switch, inclusive. Recall from Section II that  $L(X) = OC(X) - IT(X)$  is the slackness of cell  $X$ , where  $OC(X)$  and  $IT(X)$  refer to the output cushion and input thread of the cell, respectively.

The following lemma holds for CIOQ switches that use LIHP and operate at a speedup of  $2 - 1/N$ .

**Lemma 3:** If the OQ switch being emulated is FIFO, then  $L(X) \geq NTS(X)$  after the first scheduling phase and just before the arrival phase, for all cells  $X$  waiting on the input side.

Theorem 6 is a consequence of Lemma 3; we defer the proof of the lemma itself to the end of this section.

**Theorem 6:** A speedup of  $2 - 1/N$  suffices for a CIOQ switch that uses LIHP to emulate a FIFO-OQ switch.

*Proof:* Suppose it is time for cell  $X$  to leave the OQ switch, and suppose that the CIOQ switch has successfully mimicked a FIFO-OQ switch so far. Clearly,  $OC(X)$  must be zero. If  $X$  has already crossed over to the output side, then we are done. So suppose  $X$  is still queued at its input port. If the current time slot were truncated, then  $L(X)$  would be at least one (Lemma 3). But then the input thread would be negative, which is not possible. Therefore, the current time slot has two scheduling phases. Invoking Lemma 3 again,  $L(X)$  must be at least zero after the first scheduling phase. Since  $OC(X)$  is zero, the input thread of  $X$  must be zero too. Cell  $X$ , therefore, is at the front of both its input and its output priority lists and will cross the switch in the second scheduling phase, just before the departure phase. This completes the proof of the theorem.  $\square$

*Proof of Lemma 3:* Suppose the lemma has been true until the beginning of time slot  $t - 1$ . We prove that the lemma holds at the end of the first scheduling phase and at the end of the departure phase in time slot  $t$ .

We first consider the end of the first scheduling phase. Cells that were already present on the input side at the beginning of time  $t$  satisfy  $L \geq NTS$ , as  $NTS$  does not change (a property of FIFO—the departure time of a cell from the OQ switch gets fixed upon arrival, and does not change), and  $L$  can only go up (see Lemma 1 for an explanation of why  $L$  cannot decrease) during the arrival and the scheduling phases. Now consider a cell  $X$  which arrives during time slot  $t$ . Let  $k = NTS(X)$ . Since the slackness of a cell is at least zero upon arrival (remember that the input thread of an arriving cell is zero in LIHP), the slackness at the end of the first scheduling phase must be at least one. Therefore,  $X$  trivially satisfies the lemma if  $k \leq 1$ . Suppose  $k > 1$ . At most  $N$  cells could have arrived during the current time slot, and therefore there must have been a cell  $Y$  in the system with an  $NTS$  of



$k - 1$  and the same output port as  $X$  at the *beginning* of time  $t$  (this is where we use the fact that the truncated time slots are spaced at least  $N$  apart). If  $Y$  is waiting on the input side, then  $OC(Y) \geq L(Y) \geq k - 1$ . Since the OQ switch is FIFO,  $OC(X) \geq OC(Y)$ . But the input thread of the arriving cell  $X$  must be zero. Hence, the slackness of  $X$  is at least  $k - 1$  after the arrival phase, and consequently, at least  $k$  after the first scheduling phase. The case where  $Y$  is waiting at the output side is similar, and we omit the details.

Now concentrate on the end of time slot  $t$ . If this time slot turns out to be normal, then the slackness of any cell does not decrease during the second scheduling phase and the departure phase. Else, the slackness of any cell can go down by at most one. But the *NTS* value goes down by one for *all* cells in the system, and the lemma continues to hold.

#### APPENDIX C PROOF OF LEMMA 2

The proof is by contradiction. Assume there does exist a cycle in the dependency graph on active cells. Pick a smallest cycle in this graph. If there is an edge from cell  $X$  to cell  $Y$ , then  $Y$  must be ahead of  $X$  either in the input-queue ordering or in the output-queue ordering. We call the edge an “input” edge in the former case and an “output” edge in the latter; ambiguities are resolved arbitrarily. The smallest cycle must have alternating input and output edges because two successive input or output edges could be collapsed into one resulting in a smaller cycle. If there is an output edge from  $X$  to  $Y$ , then the output cushion of  $Y$  is at most as large as that of  $X$ . But  $X$  and  $Y$  are both active, and the input thread of an active cell must equal its output cushion. Therefore, the input thread of  $Y$  is no larger than the input thread of  $X$ . Also, if there is an input edge from  $X$  to  $Y$ , then the input thread of  $Y$  must be strictly smaller than that of  $X$ ; that is,  $X$  appears in  $Y$ 's input thread. The smallest cycle must have at least two edges, as there can be no self loops in the dependency graph. Consequently, the cycle must contain at least one input edge. If we traverse the cycle once, the input thread of the cell where we start must be larger than the input thread of the cell where we end. Since we start and end at the same cell as we traverse a cycle, this implies that the input thread of this cell must be less than itself. This is clearly impossible. Hence, our assumption that there exists a cycle in the graph cannot be true, and the lemma is proved.

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