

# Minimizing Synchronization Overhead in the Implementation of MPI One-Sided Communication

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**Abstract.** The one-sided communication operations in MPI are intended to provide the convenience of directly accessing remote memory and the potential for higher performance than regular point-to-point communication. Our performance measurements with three MPI implementations (IBM MPI, Sun MPI, and LAM) indicate, however, that one-sided communication can perform much worse than point-to-point communication if the associated synchronization calls are not implemented efficiently. In this paper, we describe our efforts to minimize the overhead of synchronization in our implementation of one-sided communication in MPICH-2. We describe our optimizations for all three synchronization mechanisms defined in MPI: fence, post-start-complete-wait, and lock-unlock. Our performance results demonstrate that, for short messages, MPICH-2 performs six times faster than LAM for fence synchronization and 50% faster for post-start-complete-wait synchronization, and it performs more than twice as fast as Sun MPI for all three synchronization methods.

## 1 Introduction

MPI defines one-sided communication operations that allow users to directly access the memory of a remote process [9]. One-sided communication both is convenient to use and has the potential to deliver higher performance than regular point-to-point (two-sided) communication, particularly on networks that support one-sided communication natively, such as InfiniBand and Myrinet. On networks that support only two-sided communication, such as TCP, it is harder for one-sided communication to do better than point-to-point communication. Nonetheless, a good implementation should strive to deliver performance as close as possible to that of point-to-point communication.

One-sided communication in MPI requires the use of one of three synchronization mechanisms: fence, post-start-complete-wait, or lock-unlock. The synchronization mechanism defines the time at which the user can initiate one-sided communication and the time when the operations are guaranteed to be completed. The true cost of one-sided communication, therefore, must include the time taken for synchronization. An unoptimized implementation of the synchronization functions may perform more communication and synchronization than necessary (such as a barrier), which can adversely affect performance, particularly for short and medium-sized messages.

We measured the performance of three MPI implementations, IBM MPI, Sun MPI, and LAM [8], for a test program that performs nearest-neighbor ghost-area exchange, a communication pattern common in many scientific applications such as PDE simulations. We wrote four versions of this program: using point-to-point communication (isend/irecv) and using one-sided communication with fence, post-start-complete-wait, and lock-unlock synchronization. We measured the time taken for a single communication step (each process exchanges data with its four neighbors) by doing the step a number of times and calculating the average. Figure 1 shows a snippet of the fence version of the program, and Figure 2 shows the performance results.

```

for (i=0; i<ntimes; i++) {
    MPI_Win_fence(MPI_MODE_NOPRECEDE, win);
    for (j=0; j<nbrs; j++) {
        MPI_Put(sbuf + j*n, n, MPI_INT, nbr[j], j, n, MPI_INT, win);
    }
    MPI_Win_fence(MPI_MODE_NOSTORE | MPI_MODE_NOPUT | MPI_MODE_NOSUCCEED, win);
}

```

**Fig. 1.** Fence version of the test

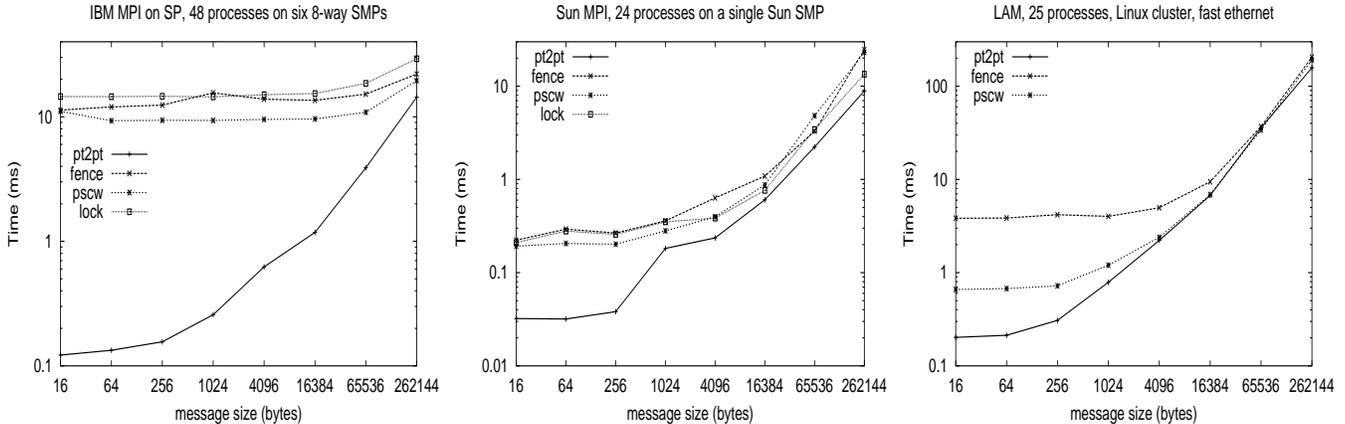
With IBM MPI on an SP, one-sided communication is almost two orders of magnitude slower than point-to-point (pt2pt) for short messages and remains significantly slower until messages get larger than 256 KB. With Sun MPI on a shared-memory SMP, all three one-sided versions are about six times slower than the point-to-point version for short messages. With LAM on a Linux cluster connected with fast ethernet, for short messages, post-start-complete-wait (pscw) is about three times slower than point-to-point, and fence is about 18 times slower than point-to-point.<sup>1</sup> As shown in Figure 1, we pass appropriate assert values to `MPI_Win_fence` so that the MPI implementation can optimize the function. Since LAM does not support asserts, we commented them out when using LAM. At least some of the poor performance of LAM with fence can be attributed to not taking advantage of asserts.

We observed similar results for runs with different numbers of processes on all three implementations. Clearly, the overhead associated with synchronization significantly affects the performance of these implementations. Other researchers [4] have found similarly high overheads in their experiments with four MPI implementations: NEC, Hitachi, Sun, and LAM.

Our goal in the design and implementation of one-sided communication in our MPI implementation, MPICH-2, has been to minimize the amount of additional communication and synchronization needed to implement the semantics defined by the synchronization functions. We particularly avoid using a barrier anywhere. As a result, we are able to achieve much higher performance than do other MPI implementations. We describe our optimizations and our implementation in this paper.

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<sup>1</sup> LAM does not support lock-unlock synchronization.



**Fig. 2.** Performance of IBM MPI, Sun MPI, and LAM for a nearest-neighbor ghost-area exchange test

## 2 Related Work

One-sided communication as a programming paradigm was made popular initially by the SHMEM library on the Cray T3D and T3E [6], the BSP library [5], and the Global Arrays library [12]. After the MPI-2 Forum defined an interface for one-sided communication in MPI, several vendors and a few research groups implemented it, but, as far as we know, none of these implementations specifically optimizes the synchronization overhead. For example, the implementations of one-sided communication for Sun MPI by Booth and Mourão [3] and for the NEC SX-5 by Träff et al. [13] use a barrier to implement fence synchronization. Other efforts at implementing MPI one-sided communication include the implementation for InfiniBand networks by Jiang et al. [7], for a Windows implementation of MPI (WMPI) by Mourão and Silva [11], for the Fujitsu VPP5000 vector machine by Asai et al. [1], and for the SCI interconnect by Worringer et al. [14]. Mourão and Booth [10] describe issues in implementing one-sided communication in an MPI implementation that uses multiple protocols, such as TCP and shared memory.

## 3 One-Sided Communication in MPI

In MPI, the memory that a process allows other processes to access via one-sided communication is called a *window*. Processes specify their local windows to other processes by calling the collective function `MPI.Win_create`. The three functions for one-sided communication are `MPI.Put` (remote write), `MPI.Get` (remote read), and `MPI.Accumulate` (remote update). They are nonblocking functions: They initiate but not necessarily complete the one-sided operation. These three functions are not sufficient by themselves because one needs to know when a one-sided operation can be initiated (that is, when the remote memory is ready to be read or written) and when a one-sided operation is guaranteed to be com-

<i>Process 0</i>	<i>Process 1</i>
MPI_Win_fence(win)	MPI_Win_fence(win)
MPI_Put(1)	MPI_Put(0)
MPI_Get(1)	MPI_Get(0)
MPI_Win_fence(win)	MPI_Win_fence(win)

a. Fence synchronization

<i>Process 0</i>	<i>Process 1</i>	<i>Process 2</i>
	MPI_Win_post(0,2)	
MPI_Win_start(1)		MPI_Win_start(1)
MPI_Put(1)		MPI_Put(1)
MPI_Get(1)		MPI_Get(1)
MPI_Win_complete(1)		MPI_Win_complete(1)
	MPI_Win_wait(0,2)	

b. Post-start-complete-wait synchronization

<i>Process 0</i>	<i>Process 1</i>	<i>Process 2</i>
MPI_Win_create(&win)	MPI_Win_create(&win)	MPI_Win_create(&win)
MPI_Win_lock(shared,1)		MPI_Win_lock(shared,1)
MPI_Put(1)		MPI_Put(1)
MPI_Get(1)		MPI_Get(1)
MPI_Win_unlock(1)		MPI_Win_unlock(1)
MPI_Win_free(&win)	MPI_Win_free(&win)	MPI_Win_free(&win)

c. Lock-unlock synchronization

**Fig. 3.** The three synchronization mechanisms for one-sided communication in MPI

pleted. To specify these semantics, MPI defines three different synchronization mechanisms.

**Fence.** Figure 3a illustrates the fence method of synchronization (without the syntax). `MPI_Win_fence` is collective over the communicator associated with the window object. A process may issue one-sided operations after the first call to `MPI_Win_fence` returns. The next fence completes any one-sided operations that this process issued after the preceding fence, as well as the one-sided operations other processes issued that had this process as the target. The drawback of the fence method is that if only small subsets of processes are actually communicating with each other, the collectiveness of the fence function over the entire communicator results in unnecessary synchronization overhead.

**Post-Start-Complete-Wait.** To avoid the drawback of fence, MPI defines a second mode of synchronization in which only subsets of processes need to synchronize, as shown in Figure 3b. A process that wishes to expose its local window to remote accesses calls `MPI_Win_post`, which takes as argument an `MPI_Group` object that specifies the set of processes that will access the window. A process that wishes to perform one-sided communication calls `MPI_Win_start`, which also takes as argument an `MPI_Group` object that specifies the set of processes that will be the target of one-sided operations from this process. After issuing all the one-sided operations, the origin process calls `MPI_Win_complete` to complete the operations at the origin. The target calls `MPI_Win_wait` to complete the operations at the target.

**Lock-Unlock.** In this synchronization method, the origin process calls `MPI_Win_lock` to obtain either shared or exclusive access to the window on the target, as shown in Figure 3c. After issuing the one-sided operations, it calls `MPI_Win_unlock`. The target does not make any synchronization call. When `MPI_Win_unlock` returns, the one-sided operations are guaranteed to be completed at the origin and the target. `MPI_Win_lock` is not required to block until the lock is acquired, except when the origin and target are one and the same process.

## 4 Implementing MPI One-Sided Communication

Our current implementation of one-sided communication in MPICH-2 is layered on the same lower-level communication abstraction we use for point-to-point communication, called CH3 [2]. CH3 uses a two-sided communication model in which the sending side sends packets followed optionally by data, and the receiving side explicitly posts receives for packets and, optionally, data. The content and interpretation of the packets are decided by the upper layers. We have simply added new packet types for one-sided communication. So far, CH3 has been implemented on top of TCP and shared memory, and therefore our implementation of one-sided communication runs on TCP and shared memory. Implementations of CH3 on other networks are in progress.

For all three synchronization methods, we do almost nothing in the first synchronization call; do nothing in the calls to put, get, or accumulate other than queuing up the requests locally; and instead do everything in the second synchronization call. This approach allows the first synchronization call to return immediately without blocking, reduces or eliminates the need for extra communication in the second synchronization call, and offers the potential for communication operations to be aggregated and scheduled efficiently as in BSP [5]. We describe our implementation below.

### 4.1 Fence

An implementation of fence synchronization must take into account the following semantics: A one-sided operation cannot access a process's window until that process has called fence, and the next fence on a process cannot return until all processes that need to access that process's window have completed doing so.

A naïve implementation of fence synchronization could be as follows. At the first fence, all processes do a barrier so that everyone knows that everyone else has called fence. Puts, gets, and accumulates can be implemented either as blocking or nonblocking operations. In the second fence, after all the one-sided operations have been completed, all processes again do a barrier to ensure that no process leaves the fence before other processes have finished accessing its window. This method requires two barriers, which can be quite expensive.

In our implementation, we avoid the two barriers completely. In the first call to fence, we do nothing. For the puts, gets, and accumulates that follow, we simply queue them up locally and do nothing else, with the exception that any one-sided operation whose target is the origin process itself is performed immediately by doing a simple memory copy or local accumulate. In the second

fence, each process goes through its list of queued one-sided operations and determines, for every other process  $i$ , whether any of the one-sided operations have  $i$  as the target. This information is stored in an array, such that a 1 in the  $i$ th location of the array means that one or more one-sided operations are targeted to process  $i$ , and a 0 means no one-sided operations are targeted to that process. All processes now do a reduce-scatter sum operation on this array (as in `MPI_Reduce_scatter`). As a result, each process now knows how many processes will be performing one-sided operations on its window, and this number is stored in a counter in the `MPI.Win` object. Each process is now free to perform the data transfer for its one-sided operations; it needs only to ensure that the window counter at the target gets decremented when all the one-sided operations from this process to that target have been completed.

A put is performed by sending a put packet containing the address, count, and datatype information for the target. If the datatype is a derived datatype, an encapsulated version of the derived datatype is sent next. Then follows the actual data. The MPI progress engine on the target receives the packet and derived datatype, if any, and then directly receives the data into the correct memory locations. No rendezvous protocol is needed for the data transfer, because the origin has already been authorized to write to the target window. Gets and accumulates are implemented similarly.

For the last one-sided operation, the origin process sets a field in the packet header indicating that it is the last operation. The target therefore knows to decrement its window counter after this operation has completed at the target. When the counter reaches 0, it indicates that all remote processes that need to access the target's window have completed their operations, and the target can therefore return from the second fence. This scheme of decrementing the counter only on the last operation assumes that data delivery is ordered, which is a valid assumption for the networks we currently support. On networks that do not guarantee ordered delivery, a simple sequence-numbering scheme can be added to achieve the same effect.

We have thus eliminated the need for a barrier in the first fence and replaced the barrier at the *end* of the second fence by a reduce-scatter at the *beginning* of the second fence before any data transfer. After that, all processes can do their communication independently and return when they are done.

## 4.2 Post-Start-Complete-Wait

An implementation of post-start-complete-wait synchronization must take into account the following semantics: A one-sided operation cannot access a process's window until that process has called `MPI.Win_post`, and a process cannot return from `MPI.Win_wait` until all processes that need to access that process's window have completed doing so and called `MPI.Win_complete`.

A naïve implementation of this synchronization could be as follows. `MPI.Win_start` blocks until it receives a message from all processes in the target group indicating that they have called `MPI.Win_post`. Puts, gets, and accumulates can be implemented as either blocking or nonblocking functions. `MPI.Win_complete` waits until all one-sided operations initiated by that process have completed locally

and then sends a done message to each target process. `MPI_Win_wait` on the target blocks until it receives the done message from each origin process. Clearly, this method involves a great deal of synchronization.

We have eliminated most of this synchronization in our implementation as follows. In `MPI_Win_post`, if the assert `MPI_MODE_NOCHECK` is not specified, the process sends a zero-byte message to each process in the origin group to indicate that `MPI_Win_post` has been called. It also sets the counter in the window object to the size of this group. As in the fence case, this counter will get decremented by the completion of the last one-sided operation from each origin process. `MPI_Win_wait` simply blocks and invokes the progress engine until this counter reaches zero.

On the origin side, we do nothing in `MPI_Win_start`. All the one-sided operations following `MPI_Win_start` are simply queued up locally as in the fence case. In `MPI_Win_complete`, the process first waits to receive the zero-byte messages from the processes in the target group. It then performs all the one-sided operations exactly as in the fence case. The last one-sided operation has a field set in its packet that causes the target to decrement its counter on completion of the operation. If an origin process has no one-sided operations destined to a target that was part of the group passed to `MPI_Win_start`, it still needs to send a packet to that target for decrementing the target's counter. `MPI_Win_complete` returns when all its operations have locally completed.

Thus the only synchronization in this implementation is the wait at the beginning of `MPI_Win_complete` for a zero-byte message from the processes in the target group, and this too can be eliminated if the user specifies the assert `MPI_MODE_NOCHECK` to `MPI_Win_post` and `MPI_Win_start` (similar to `MPI_Rsend`).

### 4.3 Lock-Unlock

Implementing lock-unlock synchronization when the window memory is not directly accessible by all origin processes requires the use of an asynchronous agent at the target to cause progress to occur, because one cannot assume that the user program at the target will call any MPI functions that will cause progress periodically.

Our design for the implementation of lock-unlock synchronization involves the use of a thread that periodically wakes up and invokes the MPI progress engine if it finds that no other MPI function has invoked the progress engine within some time interval. If the progress engine had been invoked by other calls to MPI, the thread does nothing. This thread is created only when `MPI_Win_create` is called and if the user did not pass an info object to `MPI_Win_create` with the key `no_locks` set to `true` (indicating that he will not be using lock-unlock synchronization). In `MPI_Win_lock`, we do nothing but queue up the lock request locally and return immediately. The one-sided operations are also queued up locally. All the work is done in `MPI_Win_unlock`.

For the general case where there are multiple one-sided operations, we implement `MPI_Win_unlock` as follows. The origin sends a “lock-request” packet to the target and waits for a “lock-granted” reply. When the target receives the lock request, it either grants the lock by sending a lock-granted reply to the origin

or queues up the lock request if it conflicts with the existing lock on the window. When the origin receives the lock-granted reply, it performs the one-sided operations exactly as in the other synchronization modes. The last one-sided operation, indicated by a field in the packet header, causes the target to release the lock on the window after the operation has completed. Therefore, no separate unlock request needs to be sent from origin to target.

The semantics specify that `MPI.Win_unlock` cannot return until the one-sided operations are completed at both origin and target. Therefore, if the lock is a shared lock and none of the operations is a get, the target sends an acknowledgment to the origin after the last operation has completed. If any one of the operations is a get, we reorder the operations and perform the get last. Since the origin must wait to receive data, no additional acknowledgment is needed. This approach assumes that data transfer in the network is ordered. If not, an acknowledgment is needed even if the last operation is a get. If the lock is an exclusive lock, no acknowledgment is needed even if none of the operations is a get, because the exclusive lock on the window prevents another process from accessing the data before the operations have completed.

**Optimization for Single Operations.** If the lock-unlock is for a single short operation and predefined datatype at the target, we send the put/accumulate data or get information along with the lock-request packet itself. If the target can grant the lock, it performs the specified operation right away. If not, it queues up the lock request along with the data or information and performs the operation when the lock can be granted. Except in the case of get operations, `MPI.Win_unlock` blocks until it receives an acknowledgment from the target that the operation has completed. This acknowledgment is needed even if the lock is an exclusive lock because the origin does not know whether the lock has been granted.

Similar optimizations are possible for multiple one-sided operations, but at the cost of additional queuing/buffering at the target.

## 5 Performance Results

To study the performance of our implementation, we use the same ghost-area exchange program described in Section 1. Figure 4 shows the performance of the test program with MPICH-2 on a Linux cluster with fast ethernet and on a Sun SMP with shared memory.<sup>2</sup> We see that the time taken by the point-to-point version with MPICH-2 is about the same as with other MPI implementations in Figure 2, but the time taken by the one-sided versions is much lower. To compare the performance of MPICH-2 with other MPI implementations, we calculated the ratio of the time with point-to-point communication to the time with one-sided communication and tabulated the results in Table 1.<sup>3</sup> For short mes-

<sup>2</sup> Since the MPICH-2 progress engine is not yet fully thread safe, we ran the lock-unlock test without a separate thread for making progress. The MPI calls on the main thread made progress.

<sup>3</sup> Since MPICH-2 does not run on an IBM SP yet, we could not compare with IBM MPI.

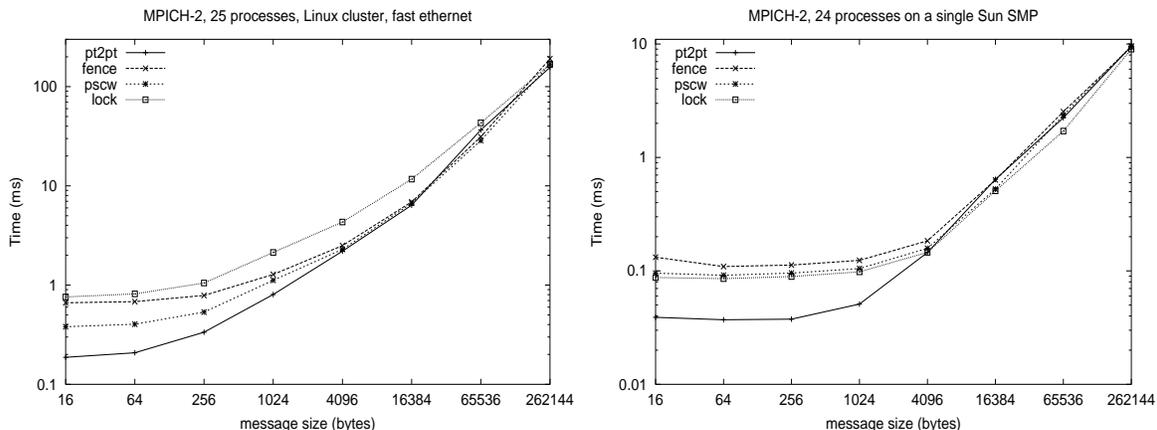


Fig. 4. Performance of MPICH-2 on a Linux cluster and Sun SMP

Table 1. Ratio of the time with one-sided communication to the time with point-to-point communication on the Linux cluster (left) and Sun SMP (right) (the smaller the ratio, the better).

Size (bytes)	LAM		MPICH-2	
	fence	pscw	fence	pscw
16	18.9	3.3	3.5	2.03
64	18.1	3.2	3.28	1.94
256	13.6	2.4	2.35	1.60
1K	5.1	1.52	1.59	1.39
16K	1.40	1.02	1.08	1.05
64K	1.03	0.95	0.85	0.78
256K	1.30	1.21	1.22	1.08

Size (bytes)	Sun MPI			MPICH-2		
	fence	pscw	lock	fence	pscw	lock
16	6.9	6.0	6.5	3.4	2.45	2.24
64	9.2	6.5	8.8	2.94	2.47	2.30
256	7.0	5.3	6.7	3.0	2.55	2.38
1K	2.0	1.55	1.93	2.43	2.06	1.92
16K	1.79	1.44	1.26	0.99	0.82	0.79
64K	1.48	2.16	1.54	1.13	1.06	0.77
256K	2.76	2.59	1.51	0.99	1.01	0.94

sages, MPICH-2 is almost six times faster than LAM for the fence version and about 50% faster for the post-start-complete-wait version. Compared with Sun MPI for short messages, MPICH-2 is more than twice as fast for all three synchronization methods. The difference narrows for large message sizes where the synchronization overheads are less of an issue, but MPICH-2 still performs better than both LAM and Sun MPI. In some cases, we see that the ratio is less than one, which means that one-sided communication is actually faster than point-to-point communication. We attribute this to the waiting time for the receive to be called in the rendezvous protocol used in point-to-point communication for large messages.

## 6 Conclusions and Future Work

This paper shows that an optimized implementation of the synchronization functions significantly improves the performance of MPI one-sided communication. Nonetheless, several opportunities exist for improving the performance further, and we plan to explore them. For example, in the case of lock-unlock synchronization for a single put or accumulate, we can improve the performance substantially

by not having the origin process wait for an acknowledgment from the target at the end of the unlock. This optimization, however, breaks the semantics of unlock, which state that when the unlock returns, the operation is complete at both origin and target. We plan to explore the possibility of allowing the user to pass an assert or info key to select weaker semantics that do not require the operation to be completed at the target when unlock returns. We plan to extend our implementation to work efficiently on networks that have native support for remote-memory access, such as InfiniBand and Myrinet. We also plan to cache derived datatypes at the target so that they need not be communicated each time and aggregate short messages and communicate them as a single message instead of communicating them separately.

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