# An Evaluation of Message Passing Implementations on Beowulf Workstations

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*Abstract*— Beowulf workstations have become a popular choice for high-end computing in a number of application domains. One of the key building blocks of parallel applications on Beowulf workstations is a message passing library. While there are message passing library implementations available for use on Beowulf workstations, as of yet none have been specifically tailored to this new, unique architecture. Thus it is important to evaluate the existing packages in order to determine how they perform in this environment. This paper examines a set of four message passing libraries available for Beowulf workstations, focusing on their features, implementation, reliability, and performance. From this evaluation we identify the strengths and weaknesses of the packages and point out how implementations might be optimized to better suit the Beowulf environment.

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## **1** INTRODUCTION

As parallel processing has matured, two programming paradigms have been developed, shared memory and message passing. Particularly for distributed memory machines, message passing has become the most popular technique for implementing parallel applications. As this popularity increased, message passing interfaces and libraries developed and matured to match demand. Now it is common for commercial machines to include a machine-specific message passing implementation such as the NX library for the Paragon and the MPL and MPI libraries for the IBM SP-2.

As clusters of workstations were recognized as a viable platform, message passing libraries grew to support this new architecture as well. This led to libraries such as PVM [4], which was specifically designed for use in situations where the "virtual machine" often varied each time the software was started. As the number of message passing libraries grew, standard API's for message passing, such as MPI [13], were introduced to provide a common interface for programmers developing for multiple architectures, while allowing the architecture vendors the flexibility to implement the interface efficiently. This has helped to eliminate situations where programmers are forced to recode applications to move them to a new platform.

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A new class of parallel machines, termed Beowulf workstations, has become a popular approach to providing high end computing resources. These machines consist of a Pile of PCs (PoPCs) built from off-the-shelf hardware components, a private high speed network such as switched fast ethernet, and freely available software tools and operating system. While message passing libraries exist that will operate on this platform, the characteristics of these machines differ significantly from previous clusters of workstations, providing thus far unexplored opportunities for software optimization specific to this environment.

While evaluations of message passing libraries and performance have already been performed on a variety of message passing implementations, most of them concentrate on how these libraries perform on MPP's such as the Intel Paragon, the IBM SP-2, and the Thinking Machines CM-5 [1, 8, 3]. In order to better understand how message passing software performs on the Beowulf architecture, the many different interfaces and implementations should be qualitatively and quantitatively compared. In this paper we examine a number of message passing packages which can operate on Beowulf workstations, focusing on the features, implementation, reliability, and performance of these packages. Specifically, we evaluate two versions of the Message Passing Interface (MPI), LAM/MPI and MPICH [6], and the Parallel Virtual Machine (PVM). In addition, we will compare these to a new message passing implementation, which we will introduce, called Beowulf Network Messaging (BNM). By looking at the characteristics of these packages we hope to discover areas where improvement could me made with respect to operation in the Beowulf environment.

In the following introduction sections, we will provide back-

ground on the Beowulf workstation concept and how software available for this environment is maturing in addition to introducing the message passing packages. In Section 2 we qualitatively examine the software packages, discussing issues such as features and implementation details. In Section 3 we examine the performance of the packages both for spawning tasks and for some sample communication patterns. Conclusions are drawn in Section 4, recommendations are made on potential areas of improvement, and future areas of study are discussed.

## 1.1 Beowulf

The Beowulf-class parallel machine has evolved from early work in low cost computing. The first work in this area centered around clusters of workstations [2]. These clusters are often built using existing workstations which are used as interactive systems during the day, can be heterogeneous in composition, and rely on extra software to balance the load across the machines in the presence of interactive jobs. As it became obvious that workstations could be used for parallel processing, groups began to build dedicated machines from inexpensive, non-proprietary hardware. These "Pile-of-PCs" consist of a cluster of machines dedicated as nodes in a parallel processor, built entirely from commodity off the shelf parts, and employing a private system area network for communication [11]. The use of off-the-shelf parts results in systems that are tailored to meet the needs of the users, built using the most up-to-date technology at the time of purchase, and cost substantially less than previous parallel processing systems. The Beowulf workstation concept builds on the Pile-of-PCs concept by utilizing a freely available base of software. The free availability of most system software source encourages customization and performance improvements. Experiments have shown Beowulf workstations capable of providing high performance for applications in a number of problem domains.

One of the greatest strengths of commercial systems in general has always been the support, both in software and troubleshooting, that is made available to owners. Along this same vein the Beowulf community has banded together to build a software infrastructure and to assist one another with problems. Most of this software already existed, including the operating system, compiler, network file system, and most common utilities. However, it has become apparent that while this software is robust and fulfills users' needs, there is room for improvement. Parallel file systems such as PVFS [9] provide better I/O performance and consistency for parallel applications using distributed data sets, processor-specific compiler enhancements and libraries can boost application performance, and kernel modifications can provide services such as global process ID's, global signalling, and Distributed Shared Memory (DSM) which help build a more complete environment.

Along these same lines, the existing message passing libraries were built before the Beowulf environment had matured. Thus this software too could potentially be altered or rewritten to more effectively operate in the Beowulf environment. In the past the message passing libraries available for Beowulf have been used primarily by individuals on clusters of workstations. These individuals would most often configure and install the software personally, then start the necessary daemons on the appropriate machines when they wished to execute a parallel program. The set of machines used often varied between executions based on availability and load. In the Beowulf environment, on the other hand, message passing support should be considered system software. Ideally this software would be installed and configured by the administrator and any necessary daemons would be started along with other services when the machine is booted. Additionally many of these packages are written to support heterogeneous collections of machines. This again is not an issue in most Beowulf machines. Luckily most of these packages have options to disable encoding that would take place if heterogeneous collections were used.

## 1.2 Message Passing Packages

In this evaluation we will focus on implementations of three different interfaces, the Parallel Virtual Machine, Message Passing Interface, and Beowulf Network Messaging. Here we give an overview of these packages; details of the specific implementations will be discussed in section 2.

*1.2.1 PVM*— The Parallel Virtual Machine (PVM) [4] was originally developed at Oak Ridge National Laboratory (ORNL) specifically to handle message passing on heterogeneous distributed computers. In addition to providing a message passing interface, PVM implements resource management, signal handling, and fault tolerance features that help build a user environment for parallel processing. As a result of the additional generic capabilities needed to pass data reliably in a heterogeneous environment, PVM is generally a less efficient message passing interface on Massively Parallel Processors (MPP's) [5]. While PVM is the defacto standard for clusters of workstations, the need to implement additional features beyond the message passing interface hinders it from becoming ubiquitous on MPP's.

PVM's implementation and interface development occur mainly at ORNL. There are, however, commercial implementations of PVM available that are designed for efficient message passing on MPP architectures. One example is PVMe for the IBM SP-2 MPP [12]. These MPP implementations, along with competing implementations for PVM on clusters of workstations, are not common.

*1.2.2 MPI*— The Message Passing Interface (MPI) Forum has been meeting since 1992 and is comprised of high performance computing professionals from over 40 organizations

[13]. Their goal is to develop a message passing interface that meets the needs of the majority of users in order to foster the use of a common interface on the ever-growing number of parallel machines. By separating the interface from the implementation, MPI provides a framework for MPP vendors to utilize in designing efficient commercial implementations.

A number of vendors have jumped on the MPI bandwagon, and vendor-supplied implementations are now available from IBM, Cray Research, SGI, Hewlett Packard, and others. In addition, a number of competing implementations have been created for clusters of workstations. Two popular choices on clusters, MPICH and LAM/MPI, will be evaluated in this study. These two implementations have been the subject of a previous study conducted on a cluster of DEC 3000/300 machines connected with FDDI [10].

The MPI Chameleon (MPICH) effort began in 1993 as an attempt to provide an immediate implementation of MPI that would track the standard as it matured [6]. It was developed at Argonne National Laboratory as a research project to provide features that make implementing MPI simple on many types of hardware. To do this, MPICH implements MPI over an architecture independent Abstract Device Interface (ADI). The ADI has a smaller interface than MPI, making it easier for vendors to implement, resulting in quicker development time without loss in efficiency. MPICH takes this one step further by implementing the ADI on top of what they call a "channel interface", providing an even smaller interface for a vendor to implement. While the "channel interface" implementations will be extremely inefficient, it provides for a quick and dirty implementation that can be streamlined later by implementing the ADI piecemeal.

Local Area Multicomputer (LAM) originated at the Ohio Super computing Facility and is now maintained by the Laboratory of Scientific Computing at Notre Dame. LAM is a package that provides task scheduling, signal handling, and message delivery in a distributed environment, and is layered to allow implementation with any message passing interface. For example, PVM has been implemented over LAM, however only LAM's MPI version will be evaluated in this study.

*1.2.3 BNM*— Beowulf Network Messaging (BNM) is currently under development at the Parallel Architecture Research Laboratory at Clemson University as a low level solution for task spawning and communication in the Beowulf environment. BNM provides only a minimal set of facilities, including remote task spawning, task ID management, and byte oriented message passing. The goal of the project is to provide a simple and efficient communications library for Beowulf that could be used as a building block for implementations of higher level interfaces such as MPI. At the moment BNM is in its infancy stage and the results of this study will have a direct impact on its development.

#### 2 IMPLEMENTATION OF PACKAGES

While all of these packages provide a common core functionality, there are significant differences in the implementations that have an impact on both the ease of use and particularly the performance of applications using them. Three areas of particular interest are the software architecture and related tools, the approach used for spawning tasks, and the method of communication between tasks. Each of these will be discussed in turn here.

The versions of the packages we are using are as follows:

- PVM version 3.3.11
- LAM version 6.1
- MPICH version 1.1.1 (ch\_p4 interface)
- BNM version 1.0

#### 2.1 Architecture

There are significant differences between the packages in terms of the architecture of the software and the tools provided. All packages provide a library of message passing primitives to which applications link. PVM and LAM/MPI provide an additional daemon that is started by the user before parallel applications are executed. BNM uses a similar daemon, but a single daemon on each node handles requests for all users and is started when the machine boots. MPICH, by default, attempts to use a system level daemon, but can be configured for either user level daemons or the standard remote shell service.

In terms of debugging and monitoring tools, PVM and LAM/MPI are strongest. PVM includes a console allowing the user to check the status of PVM tasks and send signals to them. LAM provides a set of executable tools which provide similar functionality. MPICH provides very few runtime utilities, but it does, along with PVM and LAM, provide for log file generation and trace utilities. BNM, on the other hand, provides little or no support for monitoring or debugging.

There are two common techniques for starting parallel tasks using these implementations: the use of a command line executable that starts the parallel tasks and the use of library calls to spawn tasks on remote nodes. PVM, LAM/MPI, and BNM provide both mechanisms. PVM allows execution to be started from the console and allows parallel tasks to be started from within an application using pvm\_spawn(). LAM/MPI provides mpirun to start tasks and additionally implements the MPI 2.0 MPI\_Spawn() call which allows tasks to be started from within the application. BNM implements both bnmrun executable and a bnm\_spawn() library call. Finally, MPICH provides an mpirun executable for starting the parallel tasks, but does not support the MPI\_Spawn() call.

Option	LAM	MPICH	PVM	BNM
spawn method	user daemon	rsh	user daemon	system daemon
Startup command	mpirun	mpirun	pvm	bnmrun
Spawn command	MPI_Spawn()	N/A	pvm_spawn()	bnm_spawn()
UDP communication	default	No	default	No
UDP packet size	approximately 8K	N/A	$\leq$ 4K (settable w/	N/A
			pvm_setopt)	
TCP communication	-c2c (mpirun option)	default	PvmDirectRoute	default
			(pvm_setopt)	
TCP packet size	maximum	maximum	approximately 4K	maximum
Homogeneous mode	-O (mpirun option)	automatic	PvmDataRaw	default
			(pvm_initsend)	

Table 1: Message Passing Summary

## 2.2 Task Spawning

There are three major factors that determine the time necessary for spawning tasks: the method used to start the process, the location of the executable and libraries, and the functions performed on startup. In all of our tests executables were stored on an NFS mounted file system, so this factor was held constant.

Starting tasks is accomplished via one of three techniques in these packages:

- direct use of remote shell to start each task
- use of remote shell to start a daemon which subsequently starts tasks
- use of a full-time daemon for starting tasks

Before a user begins running parallel applications under PVM, he or she first starts up PVM and defines the virtual machine. This process starts a user level PVM daemon on each of the nodes in the machine by using the remote shell facility. These daemons provide the user runtime spawning services for PVM tasks. One unique feature of the PVM daemon is its ability to start multiple tasks on the same node with only one communication from the parent; as we will see this leads to better performance from PVM when starting multiple tasks on the same node.

LAM/MPI uses a technique similar to PVM for spawning tasks. The user first starts up user level daemons on each node in the Local Area Multicomputer. These daemons then spawn MPI tasks for the user at runtime. BNM, like PVM and LAM, uses a daemon to start processes; however, this daemon provides a system service, so it is started when the machine boots, and only one such daemon is needed to serve multiple users. BNM, LAM, and MPICH, unlike PVM, require multiple communications for multiple tasks spawned on the same node.

MPICH attempts to start remote processes by connecting to a default system level daemon, and if that daemon is unavailable, uses the remote shell facility. This default daemon can also be configured at the user level, but we were unable to get this daemon to startup remote processes properly during the testing. Therefore, the remote shell was used, which is extremely slow, particularly when the inetd server is used. Hence, MPICH is at a severe disadvantage when it comes to the speed of starting new tasks.

The last factor in startup time is the amount of additional initialization and setup performed. For PVM (including PvmDirectRoute version) this is minimal; network connections are set up but not established. LAM and MPICH require additional synchronization of the MPI\_COMM\_WORLD communicator from each task. MPICH, in order to synchronize, establishes connections to the appropriate tasks and subsequently close those connections before the initialization is complete. BNM does not need to perform synchronization as with MPI, but it does require that the network connections be published for each process in sequential order. This additional overhead significantly effects the spawn time, as we will see in Section 3.

Other spawn environment options, not tested, are available on both the MPI and PVM versions. MPI allows the executable to be passed to the target node, not requiring the program to exist on that node. MPI and PVM have options to provide a current working directory and a search path to find the executable. They do so by setting the paths up in a script file during initialization of the virtual machine or local area multicomputer daemons. BNM provides this capability by passing the environment every time a new message passing program executes. During testing, we used full pathnames for the executables, hence environments were not used, so we could eliminate this variable from our testing.

## 2.3 Message Passing

All of these packages use standard IP protocols for message passing between nodes. PVM by default passes messages in three steps. First the message is passed from the application to the local PVM daemon via a TCP stream socket (some implementations use UNIX stream sockets). The daemon then divides the message up into "packets" of 4K bytes, which it passes to the PVM daemon on the remote machine using UDP. Each "packet" is acknowledged by the receiver individually, and lost packets are resent. PVM uses a simple round trip time estimator [4], does not seem to use Karn's algorithm [14], and implements no delayed acknowledgment strategy.

When using the PvmDirectRoute option for PVM, TCP is used to communicate directly between application tasks. These connections are established when they are needed, and they are left open, once connected, until application completion. When using TCP, PVM still breaks the messages into packets of approximately 4K, but acknowledgements are not used (because they are not needed with a reliable protocol such as TCP).

LAM/MPI also uses UDP by default. Applications pass messages through UNIX stream sockets to the LAM daemon, which uses UDP to pass the message to the LAM daemon on the remote machine, which then passes the message to the application through a UNIX stream socket. LAM breaks messages into packets of approximately 8K when transferring across the network, and each packet is acknowledged individually.

When the "-c2c" option is selected, LAM/MPI switches to TCP connections for data transfer. As mentioned earlier, all these TCP connections are established when the tasks are spawned. These connections are made directly between the tasks, and messages are sent as a whole without being broken up into packets by the application. LAM's TCP version uses an eager send strategy with message sizes less than 16K and a rendezvous strategy when message sizes are greater than 16K instead of completely relying on TCP to handle buffering and flow control.

Both BNM and MPICH use TCP exclusively, directly connect between application tasks, and send messages without breaking up the packets at the application layer. They open connections when they are needed and hold them open until task completion. MPICH has been documented to change send strategies over TCP at around 15K or less and this change can be seen with the performance graphs [10]. In addition MPICH reduces the receive buffer size in half for all message sizes.

In the next section we will see how these implementation details affect the overall performance of the message passing libraries both in spawning tasks and in passing messages.

## **3** Performance

Our evaluation of the performance of these packages focuses on two key areas, start-up time for parallel tasks and message passing time for some common patterns. Spawn time for tasks on a Beowulf machine may or may not be important to the user, depending on the average run-time of the applications in use. For users running many iterations of short run-time applications, this time can be critical. In any case, as more and more core functions are distributed across the parallel machine, the time to start a remote task will become more important.

The time to pass messages between tasks obviously has direct impact on the performance of applications, especially when the applications are more fine-grain. In our tests we attempt to cover some common logical configurations of processes that might be seen in applications.

#### 3.1 Test Setup

The Beowulf system used in these tests consists of the following:

- 17 single-processor 150 MHz Intel Pentium nodes
- 64 MB RAM per node
- 2 SMC Tulip-based ethernet cards per node using tulip.c v0.88
- 2 fast ethernet networks, one bus and one full-duplex switch
- Linux 2.0.34

One of the 17 nodes is used for interaction with the system, while the others are used solely for computation. The interactive, or "head", node communicates with the other nodes over the bus network. All compute nodes communicate with each other over the full-duplex switch. On all tests, the "head" node is used to spawn off one process on each of the computation nodes and to time all tests using the gettimeofday() call.

All software was configured for a homogeneous cluster of workstations. PVM provides this with the pvm\_initsend(PvmDataRaw) function, while LAM uses the "-O" option on the mpirun command line. MPICH detects this automatically and BNM provides no other functionality.

We also patched the 2.0.34 Linux kernel to prevent TCP from resetting the congestion window to slow start after not communicating for a "long time" [7]. Without this patch, the tests we performed slow down considerably which inhibits us from seeing TCP in action (see Figure 1). This slow down occurs when a connection performs slow start each time the sender transfers large data messages. For example, when passing messages around in a ring, the combination of the delayed acknowledgement and slow start prevents a node from retransmitting again for a "long time". Since we want to see TCP operating at full capacity, we removed this artifact.

## 3.2 Starting Remote Tasks

In this test we used the head node to spawn off the processes onto the computation nodes with no computations performed. We started timing before spawning began and ended it after the spawning operations completed. For PVM, LAM, and BNM, we had the spawning task use the respective spawn library calls to perform this function and time the operation. With MPICH there is no spawn library call, so we timed the mpirun command.

We did not include MPICH in the results since the remote shell service (see Section 2.2) spawn times would drastically decrease the resolution of Figure 2. After MPICH, BNM takes the longest amount of time to spawn tasks because the current implementation requires that the controlling process setup communication port information with each spawned process in a sequential manner. Moreover, BNM uses a system level daemon that performs additional processing, such as security checks, that increases spawn times.

PVM and LAM communicate with a user level daemon with UDP to spawn tasks. The PVM daemons perform very well since its only task during this stage is to spawn an executable on a remote machine. LAM's increase in spawn time compared to PVM can be attributed to MPI's synchronization overhead as described in Section 2.2.

# 3.3 Message Passing Performance

The message passing tests consist of one master program executing on the head spawning off one process on each of the computational nodes. The master's job consists of spawning off the processes, doing the timing, and waiting for a one byte message from each of the processing nodes to signal completion of the test. We designed the tests such that the first computational node in the Beowulf system always gets assigned task 1, the second node gets task 2, and so on.

In performing these tests, we used nonblocking sends and blocking receives. Unless otherwise specified, message sizes are in bytes and we use simple data types in all communications. For instance, the MPI\_BYTE datatype for MPI and the pvm\_pkbyte() command for PVM are used for simple byte sends. BNM provides only byte oriented service and has no functionality to construct complex data types.

3.3.1 *Ring Tests*— In all the ring tests, 100 loops were performed and the message size was varied. The ring loop started with a send from task 1 to task 2 and so on. The ring loop ends

with a send from task 16 to task 1 (see Figure 3).

Figure 4 shows the results of the ring tests. The UDP versions of LAM/MPI and PVM perform the worst mainly because of the additional overhead of passing every message through the user level daemon. However, when comparing the two UDP versions, the reliable layer used in LAM does perform better than PVM. The larger packet sizes and LAM's reliable protocol lead to this boost in performance.

The TCP version of LAM along with MPICH and BNM perform similarly. For smaller message sizes, MPICH does perform worse because of the smaller receive buffer, but starts to match the other TCP versions when its send strategy changes around 15K. PVM, however, performs a little worse at smaller message sizes and a little better as the message size gets larger. The reason for this discrepancy is fairly complicated, but we will attempt to address it.

The TCP version of PVM breaks up messages sent on the network wire into approximately 4K chunks. Since the maximum segment size (MSS) on an ethernet link is 1460 bytes, PVM's message sizes result in two full sized segments and one non-full segment. This inefficient use of ethernet packets results in PVMs poor performance at the smaller message sizes.

As the message sizes get larger, the way PVM fills in ethernet packets has two effects. First, since Linux TCP implementations acknowledge every two full sized segments, most of the time the sender receives one acknowledgment for every two packets sent. However, with PVM, every three segments will be acknowledged since one of the segments is NOT full, effectively reducing the number of returned acknowledgments by a third. This reduction in acknowledgments reduces the amount of interrupt processing done on the sender when receiving acknowledgments.

Second, since PVM sends messages to the TCP layer in approximately 4K chunks, PVM must wait until that 4K is sent onto the network wire prior to sending more data to the TCP layer. If PVM did not wait, the TCP layers would combine subsequent sends together which would cause all of the ethernet packets to be full. Since PVM waits for the data to get to the wire, the frequency of the data packets sent on the wire will decrease which results in slowing down packet reception on the receiver. While this method of sending data seems extremely inefficient and slow, as message sizes get larger, PVM performs better than its full sized segment counterparts.

The Linux 2.0.34 TCP implementation acknowledges every two full sized segments by setting a delayed acknowledgment timer to zero seconds. This method of acknowledging packets results in continuous inefficient timer interrupts and context switches when receiving bulk data transfers. The faster data is received, the more overhead this method of acknowledging segments will create. Since PVM both reduces the number of acknowledgments and the frequency of the sends, less over-

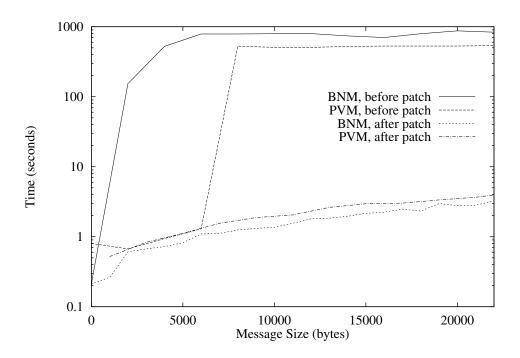


Figure 1: Patched versus Standard Kernel

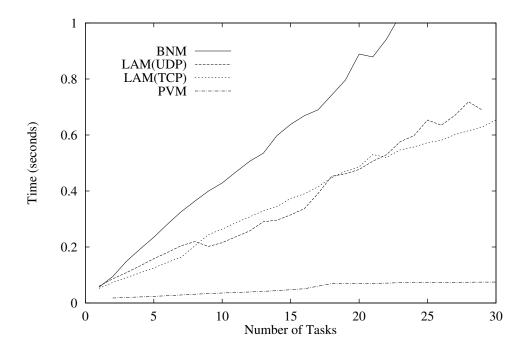


Figure 2: Spawning Tests

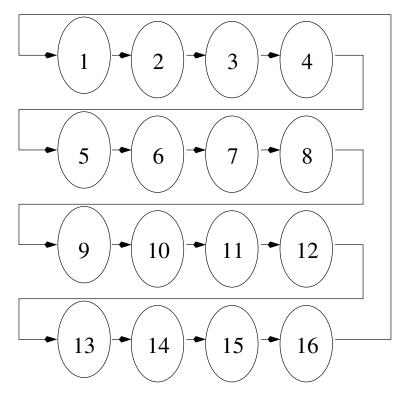


Figure 3: Ring Test Description

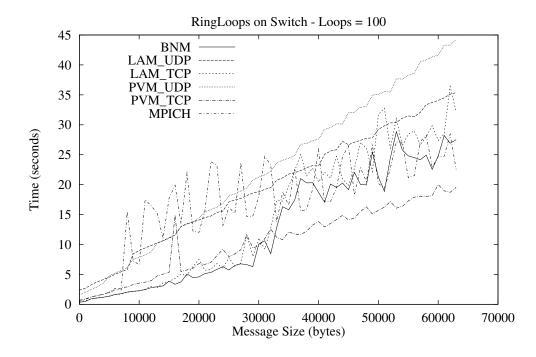


Figure 4: Ring Tests

head results and better performance is seen at larger message sizes. If the TCP implementation performed the acknowledgment in the same context as the reception of the data, PVM would perform worse than it's counterparts at any message size.

*3.3.2 Process Bottleneck Tests*— In this test, a central bottleneck task, task 1, sends data to tasks 2 through 16. After receiving the data, tasks 2 through 16 send data back to task 1 (see Figure 5). We performed this test for 100 iterations of the sends and receives while we varied the message size.

Figures 6, 7, and 8 show very similar behavior as the ring tests concerning the UDP versions of LAM/MPI and PVM. The discussion on UDP can be read in Section 3.3.1. However, the various TCP versions behave differently as the messages sizes increase during this test.

Figures 6 and 7 show that layering over TCP sockets can be detrimental at small message sizes. This can be clearly seen as BNM and LAM/MPI perform very well at message sizes where the eager send strategy is used. As messages sizes increase over 16K, LAM changes its send strategy and the performance degrades. Figure 7 also shows the change in MPICH's send strategy at around 15K.

As message sizes get very large, Figure 8 shows that MPICH's send strategy performs the best with PVM a close second. PVM's performance improvements can be attributed to the same reasoning discussed in Section 3.3.1. We are not clear on where MPICH gains at these large message sizes, but we can hypothesize that the reduction in the receive window effectively slows down the sends while keeping all of the TCP packets full.

LAM's TCP version uses strategies that are very poor on both large and medium sized messages using the Linux 2.0.34 kernel. However, newer versions of the kernel that use better acknowledgment methodology may obtain the benefits these strategies were intended to produce. BNM, on the other hand, will always follow raw TCP performance.

# 3.4 Reliability

LAM and MPICH proved to have the most problems locking up or slowing down unpredictably during testing. For example, when spawning tasks using the MPI\_Spawn command, LAM leaves UNIX accept sockets open to the daemon after the LAM tasks complete. This artifact will eventually cause a program crash when the Linux file descriptor limit is reached. It seems as if this problem only occurs when spawning with the MPI\_Spawn() command and not when using the mpirun command.

We did perform additional tests, not shown in this paper, on large sets of processes. For example, we would start up 255 tasks on our 16 node system and then try to perform communications. While the UDP versions handled this fine (for small message sizes), the TCP versions all crashed consistently as a result of the 255 file descriptor limit of Linux. This should rarely be a problem on our system, but may be on larger node systems that want to communicate to a central process.

#### 4 CONCLUSIONS

From our study of message passing implementations we learned that cluster applications should always try to use the TCP versions for optimal performance. The additional overhead of passing data through user level daemons significantly degrades message passing latency. Testing also showed that providing additional layers above TCP can improve performance in some cases.

The benefits we did see with layered strategies over TCP were a direct result of the Linux TCP implementation. Since different kernels will implement TCP in a variety of fashions, optimal strategies will differ depending on the kernel a cluster uses. For example, changing the kernel from Linux 2.0.34 to Linux 2.2.x will significantly alter the effects seen in this paper by changing the performance of the message passing libraries.

We also discovered that modifications of the kernel TCP implementation can improve communication performance on our network. This has led to future work in modifying TCP's transmission algorithms to boost performance on the Beowulf. We plan to design a kernel patch that allows TCP parameters to be modified from the /proc file system and test performance while varying these algorithms. These tests, after obtaining an optimal TCP parameter configuration, should show increased performance using all of the message passing libraries.

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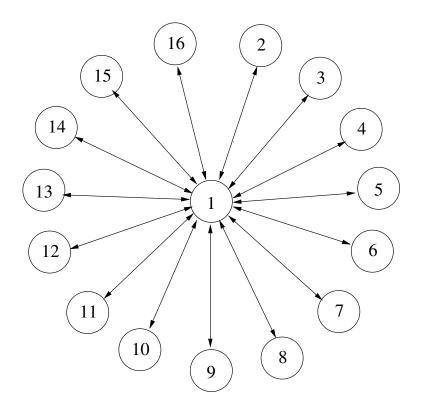


Figure 5: Bottleneck Test Description

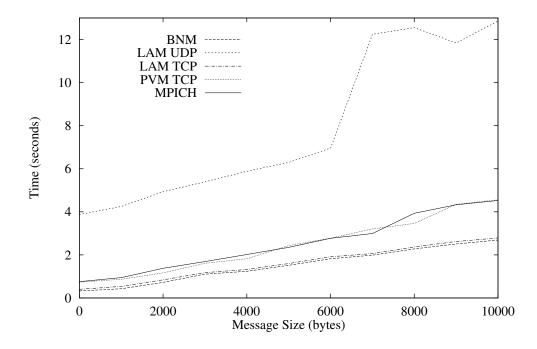


Figure 6: Scatter/Gather - Small Messages

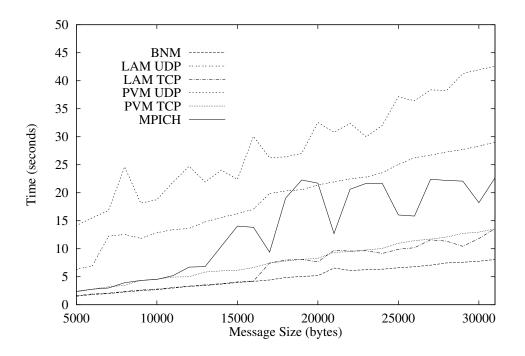


Figure 7: Scatter/Gather - Medium Messages

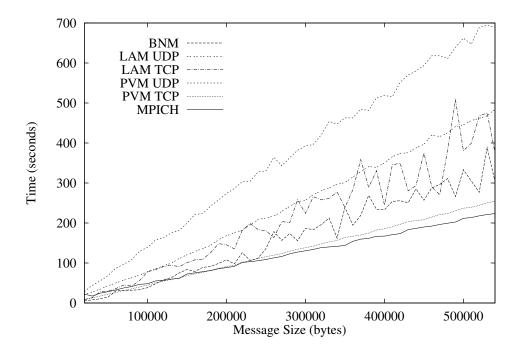


Figure 8: Scatter/Gather - Large Messages

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