Program Flow Graph Construction for Static Analysis of Explicitly Parallel Message-Passing Programs

by Dale R. Shires and Lori Pollock

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Program Flow Graph Construction for Static Analysis of Explicitly Parallel Message-Passing Programs

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Abstract

In recent years, message-passing parallel codes have rallied around using the message passing interface (MPI). The parallelism in these codes is most often explicit; the developer must instrument the source code with calls to an optimized communications runtime library. MPI has been widely used for developing efficient and portable parallel programs, in particular for distributed memory multiprocessors and workstation/personal computer (PC) clusters, although its use in shared memory systems has been equally effective. This report presents algorithm for building a program flow graph representation of an MPI program. As an extension of the control flow graph representation of sequential codes, this representation provides a basis for important program analyses useful in software testing, debugging tools, and code optimization.
Acknowledgments

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1. Introduction

The message passing interface (MPI) is a library for writing distributed memory parallel programs that conform to a vendor-independent standard, thus enabling parallel programs that are portable to many platforms [1]. A significant number of large applications have been written in MPI, and it has been demonstrated that message passing programs written in MPI can be both efficient and portable to various parallel environments and architectures. However, MPI is often described as being analogous to assembly language programming due to the low-level details required of the programmer. The step from a sequential code to a correct, and not necessarily efficient, message passing parallel program is a challenging and time-consuming one. Few sophisticated program analysis, testing, or debugging tools exist to aid the programmer in this daunting task, as the design of these tools is complicated by concurrency, nondeterministic execution, data distribution, and communication.

Optimization of message passing programs has focused on aggregating communication, moving communication statements to hide communication latency by overlapping communication and computation, and reducing communication latency and unnecessary synchronization. However, techniques such as data flow analysis, classic optimization, data flow testing, and program slicing have not been addressed in the context of MPI programs.

Data flow analysis techniques for shared memory programs [2, 3], as well as data flow and dependence analysis for concurrent Ada programs [4] and distributed applications (i.e., those not of the form single program-multiple data [SPMD] [5, 6]), have been developed. Dynamic slicing methods for different models of concurrent programs have been developed for distributed programs with Ada-type rendezvous communication [7, 8], synchronous message passing distributed programs [9], and shared memory parallel programs [10]. Static slicing methods for concurrent programs [5, 11, 12] have focused on shared memory parallel programs with parallel sections and object-oriented features.
2. MPI Program Analysis

MPI programs present a different model of concurrent programming than these models. MPI programs are written in the SPMD style, in which each process executes the same program with unique data. Within these programs, special conditional statements based on the unique process identifiers allow for selectively executing various code segments. Although it is now possible in MPI-2 to create a multiple instruction-multiple data (MIMD) application by using a dynamic task creation feature, it is preferable to create a static SPMD MPI program, primarily for performance reasons. All processes are started as the program begins. Each process has its own local memory address space; there are no shared global variables among processes. All communication is performed through library calls to MPI routines.

This report describes efforts to develop a program representation for MPI programs that will enable static program analysis for software testing, debugging, and compiler optimization. All of these techniques require robust program understanding, achieved through good intertask data flow analysis and data dependency analysis. Calls to communication libraries in MPI explicitly parallel code complicates all of these factors. However, these issues must be addressed to achieve the most optimized code possible. For example, automatic differentiation of functions containing message passing constructs is often less efficient than hand-coded versions. By providing a representation that will allow the compiler to perform a better analysis (dependence, control flow, data flow, etc.) in the presence of messages, the performance gap should shrink substantially [13].

Developing this representation for MPI programs introduces several challenges. First, the SPMD nature of the codes implies that the program representation for each process is not necessarily distinct. Rather, processes execute the same program, with segments to be executed by a subset of the processes designated by conditional statements. All processes execute the code that resides outside of these special conditionals. This behavior needs to be modeled correctly in the program representation and taken into account during static
program analysis. Second, programmers often exploit the rich set of collective communication routines in the MPI library, in addition to point-to-point communication. One way of handling programs with collective communication is translating them into a sequence of point-to-point communication calls for program analysis. However, one intended use of the representation is to display information about the program flow to the programmer through a graphical user interface (GUI); thus, the program representation should be presented to the programmer in terms of the original MPI program. Additionally, collective communication, such as scatter and gather operations, involve different sections of an array being partitioned or gathered to the various processes, respectively. It would be most useful to have the data flow information reflect this sectioning of the array.

The remainder of this report presents the results of a characterization study of a set of MPI programs that helped guide the design of these techniques, as well as an algorithm for constructing an MPI program flow graph.

3. Characterization Study

While the goal is to build a suite of “real-world” codes, finding stable MPI production codes is a common problem being addressed by consortia and vendors. MPI usage was statically analyzed in the Numerical Aerospace Simulation (NAS) Parallel Benchmark suite and five other major codes listed in Table 1. The NAS codes include various kernel and application MPI benchmarks. ST3D from Washington University is a numerical relativity code that solves the full Einstein equations in three dimensions. CRUNCH3D from the Naval Research Laboratory addresses dissipative, compressible magnetohydrodynamics using three-dimensional (3-D) Fourier collocation. Znsflow from the U.S. Army Research Laboratory (ARL) is a computational fluid dynamics code that solves the unsteady Reynolds averaged Navier-Stokes equations and can be targeted to various projects of interest. OVERFLOW and BATSRUS come from NASA. OVERFLOW computes numerical solutions of the com-
Table 1: Characteristics of MPI Usage in Parallel Programs

<table>
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<tr>
<th>Code</th>
<th>Source Lines</th>
<th>Source Calls</th>
<th>Total Collective</th>
<th>Total In Special Branches</th>
<th>Trivially Matched</th>
</tr>
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<td>NPB Block Tridiagonal</td>
<td>5432</td>
<td>54</td>
<td>6</td>
<td>24</td>
<td>12</td>
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<tr>
<td>NPB Multigrid</td>
<td>2438</td>
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<td>NPB LU Decomposition</td>
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<td>57</td>
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<tr>
<td>NASA BATSRUS</td>
<td>16324</td>
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<td>32</td>
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Several concluding observations were possible after a cursory examination of these programs. In all of the codes except one, the number of source lines related to MPI communications is less than 2% of the total number of lines of code (in most cases it is far less than 2%). The “MPI Calls” column in Table 1 gives a count of all MPI calls found in the code. The “Total Collective” column lists the number of MPI collective communications. Data pertaining to MPI point-to-point communication was further broken down. The “Total” column gives the number of sends and receives.

Special conditional statements (e.g., if [myrank == 0]) involving the process identifier are present, but not common. These statements are usually indicative of manager-worker style parallelism. The column “In Special Branches” shows the number of MPI sends and receives found in these branches. Many of these codes work on grid-based data, which seems
to naturally favor a data parallel approach to parallelism. As message passing codes, however, many of these programs rely upon initialization routines to compute arrays or scalars, such as north, south, etc., to hold information about neighboring processes and domains. Source and destination fields in the communication calls contain expressions using precomputed arrays, scalars, constants, and in some cases, the process identifier. MPI wildcards, such as MPI_ANY_TAG or MPI_ANY_SOURCE, are not common. Some codes use nested conditionals or loop constructs to further refine execution paths and interprocess communication.

Ultimately, while these programming styles make flow graph construction more difficult, they do not necessarily preclude it in most cases. Many of the scalars and arrays are defined with some reference to a unique process identifier. A static backward slice and variable substitution within the local process’s flow graph can be used to reformulate these expressions in terms of the process identifier. Constant folding used in source and destination fields would also assist in the process.

Many point-to-point communication statements can be trivially matched. The number is given in the “Trivially Matched” column in Table 1. In these cases, a simple analysis of the communicator, type, and tag fields is enough to explicitly match communication statements.

4. MPI Program Flow Graph

Since each process in an MPI program has local space allocated for each of the declared variables in the program, and communication occurs only through matching MPI communication calls, data flow local to a given process between communication points in that process is not affected (as a side effect) by the data flow within other processes. The data flow within a given process is only affected by other processes at communication points. In point-to-point communication, a message sent by a particular send operation will be received by another process only through a receive operation executed by the other process. Specifi-
cally, a message can be received by a particular receive operation only if (1) it is addressed
to the receiving process by the sender, (2) the send and receive have matching commun-
icator fields, (3) the sender field of the receive is either MPI_ANY_SOURCE, or it matches the
sender’s process id, and (4) the tag fields of the send and receive match, or the tag field
of the receive is MPI_ANY_TAG. In collective communication, all processes in the designated
communicator are involved in the communication. Although multiple messages sent from
one process to another process are guaranteed to arrive in the order they were sent, there
are no assumptions made on the arrival order of messages from two different sources to the
same destination. When a message receive specifies MPI_ANY_SOURCE as the expected sender,
the originator of the message will be indeterminate at static analysis time; otherwise, the
expected sender is specified, and communication is deterministic. Such indeterminacy is
conservatively represented in this program representation.

A control flow graph (CFG) representation for a sequential program $P$ is a directed
digraph $G = (N, E, S, e)$, where each node $n \in N$ represents a basic block of instructions,
each edge $n \rightarrow m \in E$ represents a potential flow of control from node $n$ to node $m$, and
there is a unique start node $s$ and a unique exit node $e$. A path in $G$ is a sequence of nodes
$(n_1, n_2, \ldots, n_k)$, where $n_i \rightarrow n_{i+1}$ for all $1 \leq i \leq k$. It is assumed that every path in the CFG
is a viable execution order of program $P$.

An $MPI$-$CFG$ extends the CFG with communication edges and isolates each communica-
tion statement into its own separate basic block, represented by a single node in the graph.
These nodes are called communication nodes.

While point-to-point communication can be easily represented by a single communica-
tion edge, collective communications have distinct semantics that result in different data flow
across processes. For example, a broadcast will result in every process receiving the same
value and storing it into the same local variable, whereas a scatter will result in each process
receiving a subset of a set of values sent from the root process to distribute or partition the
data stored in a single array among the processes. The representations of these communi-
cation statements were developed with the goal that each communication statement should have a unique representation that reflects its semantics.

Lastly, the control flow edges of the MPI-CFG are annotated with a value that reflects static information about the number, and possibly the process identifiers (if available) of the processes that could execute along that edge. The value will be one of the following four:

1. \(< c >\), indicating the known process id \(c\) of the only process that will execute that edge,
2. \(<\text{single}>\), indicating that statically one can prove that only a single process will execute this edge, but one cannot determine the process id,
3. \(<\text{unknown}>\), indicating that it could be one or more processes executing this edge, or
4. \(<\text{multiple}>\), indicating that definitely more than one process will execute this code if there is more than one executing process.

A predicate annotation (e.g., \(\text{myproc} < n\)) is also maintained if it is available and possible to identify. This information allows the communication edge addition step and other static program analyses to utilize the information about process ids.

Due to space constraints and the large size of most interesting MPI programs, it is preferable to define a condensed MPI-CFG as an MPI-CFG in which the nodes representing computation blocks between two communication nodes are collapsed into a single representative computation node. This structure is meant for presentation purposes only. Program analysis is to be performed over the MPI-CFG, not the condensed MPI-CFG. The MPI-CFG is illustrated in Figure 1. Figure 1(a) gives the code segment for an SPMD-style MPI program segment that performs a "cascading" style of communication, with processor 0 sending to 1, 1 to 2, etc. The MPI-CFG is shown in Figure 1(b). Control flow edges are indicated...
if (myid.eq.0) then
    call mpi_send(flag,1,MPI_INTEGER,1,tag,
                    &
                    MPI_COMM_WORLD,ierr)
end if

do np=1,nprocs-1
    if (myid.eq,np) then
        call mpi_recv(flag,1,MPI_INTEGER,np-1,
                      &
                      tag,MPI_COMM_WORLD,status,ierr)
        if (myid.ne.(nprocs-1)) then
            call mpi_send(flag,1,MPI_INTEGER,
                          &
                          np+1,tag,MPI_COMM_WORLD,ierr)
        endif
    endif
enddo

(a) MPI Code Segment cascade.

Figure 1: An Example MPI-CFG.

by solid lines, while communication edges are shown as dashed lines. Communication edges are labeled with the variables that are involved in the interprocess communication. The conditional \(< myid == 0 >\) is an example of a special conditional statement indicating that the left branch is to be executed only by process 0, while the rest of the processes should execute the right branch.
5. Construction Algorithm

5.1 Basic Approach. The MPI-CFG construction algorithm is summarized in Figure 2. The first step is to create the underlying CFG by using a slight modification to the usual algorithm for CFG construction, which isolates communication statements as separate nodes. Each process's CFG is represented by some subgraph of this graph, where different processes typically have subgraphs that overlap one another. An initial pass of edge annotation, based on the relational operator of the special conditionals, will indicate program segments that are executed by one process vs. possibly multiple processes. Many parallel programmers program in the manager-worker style of programming, where the special conditionals if [myrank == 0] will often be an equality test against a constant. This information is used in the constant propagation phase. Traditional constant propagation can be applied to CFG representation of an SPMD program; however, it will be overly conservative in handling constants at join points from branches taken by different processes. More sophisticated constant propagation that recognizes constants with respect to particular processes would result in more precise information per process. Propagating constants helps to eliminate symbolic information in the parameters of communication statements, as well as the information known about the expressions in special conditionals.

The last step is to conservatively add communication edges. Because the same code segment may represent multiple processes, it is possible for a communication that occurs at runtime to have no associated communication edges, only a communication node. Communication edges are added according to the kind of communication, variables in particular fields of the communication call, any statically determined information about constants and the annotations on control flow edges, and the matching rules for communication statements. Sometimes the communication is ambiguous because of unknown values for variables, or wildcards in the source or tag fields. In these situations, an edge is added for any potential matching communication. In the MPI programs examined, there are very few communica-
Algorithm: MPI-CFG Construction.
Input: MPI program P.
Output: MPI-CFG representation of P.

begin
Treating MPI calls as regular function calls,
   Construct the CFG representation P-CFG of P;
Using the parameter of MPI_Comm_rank,
   Identify special conditionals that
      indicate separate process control flow;
Perform initial annotation of edges based on
   the expression operator in special
   conditionals;
Using annotations, perform modified constant
   propagation over P-CFG;
Perform final annotation of edges using new
   information at special conditionals;
At each MPI communication statement,
   Use constants, CFG slices and MPI matching
      rules to identify potential matching
   communication;
Conservatively add communication edges to
   P-CFG;
end.

Figure 2: MPI-CFG Construction Algorithm.

The most challenging aspect of finding the potentially matching communication statements is identifying the source and destination processes. The source and destination fields of communication statements can be categorized as being (1) a constant, (2) an expression involving the process identifier, or (3) an expression not containing the process identifier. First, a traditional backward CFG slicing is performed (without communication edges) to reformulate expressions that are derived from the process identifier, but do not explicitly contain the process identifier. Then, in cases (1) and (3), the annotations on MPI-CFG edges are used to refine the set of potentially matching communications. In case (2), variable substitution is used in the expression functions of these fields to determine whether the
source and destination expressions of the receive and send operations, respectively, can be equal.

5.2 Extensions. Several enhanced control flow and data flow techniques are being considered. For example, several codes that were analyzed employ a programming style in which many mpi_isend statements are explicitly written. However, there is only one matching mpi_irecv statement, which is located in a function. This function is called repeatedly with the required parameters to match the various sends. Interprocedural analysis, or simply function inlining, will provide more information for static analysis.

Furthermore, approaches that may assist in providing more precise information for loop-nested communications are being investigated. Loop peeling, a technique useful in scalar replacement memory hierarchy optimizations, may prove beneficial [14]. The basic approach is to "peel" $k$ iterations from the beginning of a loop and replace them with copies of the body and the associated increment and test code for the loop index. Where there are loop-nested communications in which the tag or source and destination fields are based on the loop index variable(s), peeling can be useful in restructuring the MPI-CFG to allow for better edge annotations. This technique should also be useful in removing communications edges that point into a loop body, thus simplifying the static slice.

6. Current Directions

The process of program flow graph construction is currently being implemented within the Stanford University Intermediate Format (SUIF) compiler infrastructure [15]. More precise constant propagation analysis is also being investigated. Studying various existing MPI codes revealed the need for a more robust constant folding technique. This should provide for better point-to-point communication matching and should allow for removing communication edges that are currently required to be conservative. Of particular interest is
the extension of the program dependence graph (PDG) representation for SPMD programs. The program dependence graph is a representation that succinctly represents both control and data flow in a program.
7. References


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