Programming with MPI

Debugging, Performance and Tuning

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Programming with MPI – p. 1/**??**

Available Implementations

Two open source versions – MPICH and OpenMP IMost vendors have own, inc. ^Intel and Microsoft

Wide range of tuning and debugging tools Mostly commercial , but not all

Or can use built-in profiling interface Easy to use and can help with <mark>debugging</mark>

 \bullet • Not ideal, but consensus is pretty good This lecture is just the general principles

Debugging vs Tuning

Iⁿ practice, these overlap to ^a large extent

 \bullet • Tuning MPI is more like tuning I/O than code

Many performance problems are logic errors E.g. everything is waiting for one process

Many l<mark>ogic errors</mark> show up as <mark>poor performance</mark>

 \bullet So don'^t consider these as completely separate

Classes of Problem (1)

 \bullet Most common is breach of language standardParallelism exposes aspects that you never realised

Generally, debuggers and other tools don'^t helpThe aspects are usually subtle ones of semantics Most books and Web pages are <mark>very</mark> misleading

This is why my courses often seem too pedantic I warn about issues that you hope you don'^t seeContact your supervisor for advice

Classes of Problem (2)

- \bullet **Second most common is logic errors** You wrote what you meant , but that doesn'^t work
- E.g. distributing data/work between processes
- Debuggers and other tools help only ^a littleYou need to find <mark>how</mark> things went wrong, a , and why

Recommendations in this course are for safetyThey should help to minimise these

• But this class of problem is unavoidable \bullet

Classes of Problem (3)

 \bullet **•** Least common is MPI coding errors E.g. a receive with no matching send

Parallel debuggers help ^a lot with this But do what I say, and such bugs should be rare

Most programmers don'^t use parallel debuggersSome others find them very helpful

My Hobby-Horse (1)

A good language would prevent 90% of errors
A good language would prevent 90% of course though only a few <mark>logic errors</mark> , of course

A restricted subset of MPI would allow checking Would then be easy to detect many common errorsI^t would only help with the ones entirely in MPI

Most modern languages are complete **** As far as error detection and prevention go Ada is the main exception , possibly PythonFortran 2003 goes ^a little way towards that

My Hobby-Horse (2)

We can agree that flexibility and features are good

Modern dogma is that restrictions are always bad and languages should define only correct codeand performance always trumps correctness

• I am a heretic $-$ that is totally false

Checked restrictions are the programmer'^s friendLonger to get running, but quicker to get working

Which is why ${\rm I}$ say to impose your own restrictions

My Hobby-Horse (3)

Programming MPI shows this <mark>very</mark> clearly

Very hard to debug even ^a known correct algorithmby doing it using general point-to-point

Back off , constrain the design (e.g. with barriers) and it'^s hard to tell where the problem was

I believe that a language could do this for you Would be completely different from current onesHoare's BSP uses this approach

Partial Solution

 \bullet Design primarily for debuggability

KISS–– Keep It Simple and Stupid

This course has covered many MPI specific points

See also How to Help Programs Debug Themselves

 \bullet • Do that, and you rarely need a debugger Diagnostic output is usually good enough

 \bullet • Only then worry about performance

Parallel Debuggers (1)

These exist , and some people like themNone worth using are available for freePlease tell me if you find an exception

I have never more than dabbled with themTotalview is the best-known one Intel is also reported to be good

There are others, especially from HPC vendors

Parallel Debuggers (2)

These must be integrated with

- The compiler for your language
- **•** The MPI implementation
- The job scheduler \bullet

That is not easy to arrangeUnless you are ^a vendor that sells all of them!

Many vendors sign up to Etnus (Totalview)

Parallel Tools

I haven'^t looked at many of theseIntel bought out Pallas (Vampir)

Some open-source (free) ones might be OK
__ They don't have the same problems as debugger<mark>s</mark>

I have written ^a (not very good) oneIt'^s quite easy to do, in many cases

Interactive Serial Debuggers

These are, by and large, useless for MPI

 \bullet **• Often difficult to run them on MPI processes** Usually needs administrator-level hacking

 \bullet • Often interfere with each other, badly May cause MPI to lock up solid or fail Debugger may display wrong results, or crash

Non-blocking transfers are a major problem Asynchronous progress is even worse

Debugging From Dumps (1)

This is usually much more successful

 \bullet **• Useful for when an MPI process crashes** Do that just as in the serial case

 \bullet • You can usually force a dump , tooJust as you can in ^a serial program

 \bullet • And you can often get one of each process And compare them to see where they have got to

Debugging From Dumps (2)

 \bullet • Biggest problem is getting the dump System-dependent, and may need administrator

 \bullet • All dumps may be written to file 'core' Bad news if all in the same <mark>directory</mark>

Can often avoid that by calling chdir Or can configure to dump to 'core.<pid>'

 \bullet • One dump per process may be too big There are bypasses, but contact your administrator

Debugging From Dumps (3)

 \bullet • Main problem is not getting any dump Or, occasionally, getting dump of wrong process And, far too often, getting diagnostic <mark>no stack</mark>

May be a shell or system feature (e.g. ulimit) May be a compiler or MPI implementation one May be a PATH-related configuration issue

 \bullet **•** Generally soluble, but no good rules Have to investigate problem, and deal with it

Built-in MPI Facility (1)

MPI provides a built–in facility for tuning I^t'^s useful for debugging, and some tools use it

All functions called MPI_... are wrappers They call identical ones called PMPI_\dots

Exceptions are MPI_Wtime and MPI_Wtick Plus ^a few MP I2 ones we haven'^t covered

Built-in MPI Facility (2)

All you do is to write your own MPI_\dots ones Calling the $\mathsf{PMPI}\hspace{-0.5mm}\underline{\hspace{0.5mm}}\hspace{0.5mm}}\ldots$ ones to do the work You can put in any tracing and checking you like

There is an example in Wrappers/Wrappers.c It supports <mark>only</mark> original MPI 1

It worked very well in simple <mark>tracing</mark> mode

Its scaling wasn't entirely successful It conflicted with the MPI <mark>progress engine</mark>

Built-in MPI Facility (3)

 \bullet • You don't have to wrap all of the MPI functions Wrapping the ones that you use is enough

 \bullet Keep the wrapper functions in ^a separate fileThen you can include them or not as you wish

I^t really is very easy to use

Function MPI_Pcontrol controls profiling However, it is almost completely unspecifiedI^t'^s really just ^a hook for ^a specification

MPI Memory Optimisation (1)

The examples waste most of their memoryHere are some guidelines for real programs:

 \bullet Don'^t worry about small arrays etc. If they total less than 10% $\,$, so what?

 \bullet **•** For big ones, allocate only what you need For example, for gather and scatter

 \bullet Reuse large buffers or free them after useBe careful about overlapping use, of course

MPI Memory Optimisation (2)

If the above doesn'^t solve your problem:

 \bullet Scatter large structures across processesThis is the dreaded <mark>data distribution</mark> problem

 \bullet Read and write them in smaller sectionsFor very large amounts of data, it'^s no slower

 \bullet Watch out for memory fragmentationThat has nothing to do with MPI as such

MPI Memory Optimisation (3)

Used to be normal practice up to the 1970s 64 KB was often ^a lot of memory ...

I^t'^s ^a pain in the neck to programPlease ask for help if you need to do it

Generally, avoid optimising for memory Don'^t waste excessive amounts, of courseBut concentrate of writing clean code

 \bullet • MPI itself is rarely an issue

MPI Performance

- \bullet **•** Ultimately only elapsed time matters The real time of program , start to finish
- \bullet All other measurements are just tuning tools

This actually simplifies things considerablySee later under multi-core systems etc.

 \bullet • You may want to analyse this by CPU count Will tell you the scalability of the code

Design For Performance (1)

Here is the way to do this

 \bullet Localise all major communication actions In a module
.< , or whatever is appropriate for youKeep its code very <mark>clea</mark>n and simple

 \bullet Don'^t assume any particular implementationThis applies primarily to the module interface Keep it generic, clean and simple

 \bullet • Keep the module interfaces fairly high level E.g. ^a distributed matrix transpose

Design For Performance (2)

Use the highest level appropriate MPI facility E.g. use its collectives where possible \bullet Collectives are easier to tune, surprisingly

Most MPI libraries have had extensive tuning

 I^t is ^a rare programmer who will do as well \bullet

mpi_timer implements MPI_Alltoall many ways Usually, 1–2 are faster than built–in MPI_Alltoall Not often the same ones, and often by under 2%

Design For Performance (3)

- \bullet • Put enough timing calls into your module Summarise time spent in MPI and in computation
- \bullet • Check for other processes or threads Only for ones active during MPI transfers

Now look at the timing to see if you have ^a problem

 \bullet If it isn't (most likely), do nothing

 \bullet **• Try using only some of the cores for MPI** I^t'^s an easy change, but may not help

Design For Performance (4)

 \bullet Going further , you have only one module to tuneAnd its code is <mark>clea</mark>n and simple!

 \bullet Won'^t have to start by reverse engineering codeI^t will also help an expert help you

The higher level the module interface is the more scope that you have for tuning

E.g. attempting to use non-blocking transfers may be impossible with a <mark>low level interface</mark>

High-Level Approach (1)

Try to minimise inter-process communication
— There are three main aspects to this:

 \bullet **• Amount of data transferred between processes** Inter–process bandwidth is a limited resource

 \bullet • Number of transactions involved in transfer The message–passing <mark>latency</mark> is significant

 \bullet • One process needs data from another May require it to <mark>wait</mark> , wasting time

High-Level Approach (2)

Partitioning can be critical to efficiency Some principles of that are mentioned later

You can bundle multiple messages together Sending one message has a lower overhead

You can minimise the amount of data you transfer Only worthwhile if your messages are <mark>large</mark>

You can arrange all processes communicate at once Can help a lot because of progress issues

Bundling

On a typical cluster or multi-core system: Packets of less than 1 KB are inefficient Packets of more than ¹⁰ KB are no problem

Avoid transferring a lot of small packets ⇒ Packing up multiple small transfers helps
But only if significant time spent in them But only if significant time spent in them

 \bullet **• Remember integers can be stored in doubles**

Advanced Tuning

This includes even use of non-blocking transfers Reasons for that are the progress issues

They are worth learning to avoid deadlock Can help with performance on some systems

 \bullet This course is not going to cover tuning themOr any other such advanced tuning

Tuning I/O is more system-specific than MPI

Elapsed Time (1)

Isn't MPI_Wtime the answer? – er , no

Times don'^t always mean what you thinkWill describe this shortly, but it'^s complicated

Need to design program for reliable timing Design methodology can also help with debugging

But some programs don'^t match it very well I^t is very hard to measure the time in those

Elapsed Time (2)

Any outstanding transfers make times unreliable
--These are ones that have not been received and completed for non-blocking

Note that a blocking send remains outstanding even after the <mark>send</mark> call returns

You can call MPI_Wtime even at such times But interpreting its value can be extremely hard

Elapsed Time (3)

Simplest use that gives understandable times:

- \bullet • Receive and complete all transfers across the whole communicator , of course[Collectives will do this automatically]
- \bullet • Call MPI_Barrier on the communicator
- Call MPI_Wtime in any or all processes \bullet

All calls show roughly the same elapsed time

Elapsed Time (4)

Beyond that , things can get ^a bit complicated

Remember collectives are not synchronisedAnd that point-to-point can overlap them

This lecture now describes this in more detail

Progress (1)

MPI has an arcane concept called ''progress'' Good news: needn'^t understand it in detail

 \bullet • No valid MPI program can get stuck (hang) I.e. MP^I doesn'^t allow any ''deadly embraces''

An implementation must always make progress A programmer must not make that impossible
There are a ferror strictional to account that is a There are ^a few restrictions to ensure that is so

 \bullet Write sanely, and you will never notice themMistakes will happen, but fix the bug in your code

Progress (2)

MPI does not specify how it is implementedProgress can be achieved in many ways

Bad news: do need to understand these issues

 \bullet All valid MP^I programs will work in all casesBut it changes the most efficient coding style

Will describe ^a few of the most common methodsAnd indicate the main consequences of themBut will start by saying how to proceed

Processes vs CPUs

- \bullet • More MPI processes than cores is Bad News Some systems seem to crawl into ^a hole and die!
- \bullet **• Shared systems will have other threads running**
- \bullet **• And remember MPI may have hidden threads**

When setting MPI tuning parameters:

 \bullet • Be careful with spin loops for waiting Use only if each MPI process has its own core Never use spin loops on ^a shared system

Multi-Core Systems

Use of ${\sf SMP}$ systems was described earlier

If using SMP libraries , OpenMP or threading \bullet Use only one MPI process per system

 \bullet **•** Otherwise, write purely serial executables And use multiple MPI processes per system

Either works – the combination doesn't

Serial MPI Processes on SMP

Use total core count for calculations I.e. cores/socket times sockets/system

 \bullet **Consider using only some CPUs for MPI** Often increases the total performance

 \bullet Only way to find out is to time two runs

First reason is that it stresses the memory less More codes are memory-bound than CPU-bound

Second is that it may help asynchronous progress As mentioned, can include physical transfer

Collectives (1)

They may start transferring as soon as they canAnd may leave as soon as they have finished

 \bullet • You can stop that by using MPI_Barrier That can sometimes improve efficiency

I^t always makes initial tuning ^a lot easierCalls to MPI_Wtime become reliable

Collectives (2)

```
error = MPI_Barrier ( MPI_COMM_WORLD ) ;
start = MPI_Wtime ( ) ;
\textsf{error} = \textsf{MPI\_Alltoall}~(\mathrel{\ldots}) \ ;error = MPI_Barrier ( MPI_COMM_WORLD ) ;
total = MPI_{\_}Wtime ( ) – start ;
```
 \bullet **• After initial tuning, start removing the barriers** See if it runs faster with or without themRemember that the <mark>barriers</mark> take time, too

 \bullet Tuning like this is generally quite easy

Behind The Scenes (1)

MPI does not specify synchronous behaviour All transfers can occur asynchronously And, in theory, so can almost all other actions

Transfers can overlap computation , right?Unfortunately, it isn'^t as simple as that

Many I/O mechanisms are often CPU bound
Ten un TCP/IP over Ethernet is often like that

Will come back to this in ^a moment

Behind The Scenes (2)

MPI transfers also include data management
-E.g. scatter/gather in MPI derived datatypes

InfiniBand has such functionality in hardware Does your implementation use it, , or software?

Does your implementation use asynchronous I/O?POSIX'^s spec. (and .NET's?) is catastrophic

May implement transfers entirely synchronously Or may use a separate thread for transfers

Eager Execution

This is one of the mainly synchronous methods Easiest to understand, not usually most efficient

All MPI calls complete the operation they performOr as much of it as they can, at the time of call

- \bullet • MPI_Wtime gives the obvious results Slow calls look slow, and fast ones look fast
- \bullet • Often little point in non-blocking transfers But see later for more on this one

Lazy Execution

This is one of the mainly synchronous methods Just not in the way most people expect

Most MPI calls put the operation onto a queue All calls complete queued ops that are "ready"

 \bullet • MPI_Wtime gives fairly strange results One MPI call often does all of the work for another The total time is fairly reliable , though

Possibly the most common <mark>implementation</mark> type

Asynchronous Execution

MPI calls put the operation onto a queue Another process or thread does the work

 \bullet • MPI_Wtime gives very strange results Need to check the time used by the <mark>other thread</mark>

 \bullet • Start by not using all CPUs for MPI Further tuning is tricky – ask for help

Fairly rare $-$ I have seen it only on ${\rm AIX}$ May become more common on <mark>multi-core</mark> systems

Asynchronous Transfers

Actual data transfer is often asynchronous E.g. TCP/ IP+Ethernet uses ^a kernel thread

 \bullet • One critical question is if it needs a CPU If so, using only some CPUs may well help (a lot)

 \bullet • Sometimes, non-blocking transfers work better Even on implementations with eager execution

 \bullet • And sometimes, blocking transfers do Even with asynchronous execution

Reminder

- \bullet Localise all major communication actions In a high level module, or whatever is appropriate
- \bullet Do nothing if it performs well enough
- \bullet Consider using only some of the CPUs
- \bullet Do simple, high-level, tuning (as above) Often just by adding or removing <mark>barriers</mark>
- \bullet Only then, worry about fine-tuning your code E.g. comparing <mark>blocking</mark> and non–blocking