Challenges for MPI in Its Third Decade

William Gropp
wgropp.cs.Illinois.edu
Some Context

• Before MPI, there was chaos – many systems, but mostly different names for similar functions.
  • Even worse – similar but not identical semantics
• Same time(ish) as attack of the killer micros
  • Single core per node for almost all systems
• Era of rapid performance increases due to Dennard scaling
  • Most users could just wait for their codes to get faster on the next generation hardware
  • MPI benefitted from a stable hardware and thus software environment
    • Node programming changed slowly, mostly due to slow quantitative changes in cache, instruction sets (e.g., new vector instructions)
• The end of Dennard scaling unleashed architectural innovation
  • And imperatives – more performance requires exploiting parallelism or specialized architectures
  • (Finally) innovation in memory – at least for bandwidth
HPC Nodes are Increasingly Complex

DOE Sierra
- Power 9 with 4 NVIDIA Volta GPU
- 4320 nodes
- DOE Summit similar, but
  - 6 NVIDIA GPUs/node
  - 4608 nodes

Fugaku
- Fujitsu A64FX (includes Vector Extensions)
- 158,976 (+) nodes

DOE Frontier
- AMD with 4 AMD GPU
- 100+ racks

NCSA Delta similar but
NVIDIA GPUs and fewer racks 😊

DOE Aurora
- Intel SR with 6 Intel Ponte Vecchio GPUs
- Being deployed, >9K nodes (almost ready!)
CFD in 2030: NASA Study

Prediction in 2012 (published 2014)

<table>
<thead>
<tr>
<th>Year</th>
<th>Feature size</th>
<th>Derived parallelism</th>
<th>Stream parallelism</th>
<th>PIM Parallelism</th>
<th>Clock rate GHz</th>
<th>FMAs</th>
<th>GFLOPS (Scalar)</th>
<th>GFLOPS (Stream)</th>
<th>GFLOPS (PIM)</th>
<th>Processor per node</th>
<th>Processor (TFLOP)</th>
<th>nodes per system</th>
<th>Total (PFLOPS)</th>
</tr>
</thead>
<tbody>
<tr>
<td>2012</td>
<td>22</td>
<td>16</td>
<td>512</td>
<td>0</td>
<td>2</td>
<td>2</td>
<td>128</td>
<td>1024</td>
<td>0</td>
<td>2</td>
<td>1</td>
<td>10000</td>
<td>23</td>
</tr>
<tr>
<td>2020</td>
<td>12</td>
<td>54</td>
<td>1721</td>
<td>0</td>
<td>2.8</td>
<td>4</td>
<td>1210</td>
<td>4819</td>
<td>0</td>
<td>2</td>
<td>6</td>
<td>20000</td>
<td>241</td>
</tr>
<tr>
<td>2023</td>
<td>8</td>
<td>122</td>
<td>3873</td>
<td>512</td>
<td>3.1</td>
<td>4</td>
<td>3026</td>
<td>12006</td>
<td>1587</td>
<td>4</td>
<td>17</td>
<td>20000</td>
<td>1330</td>
</tr>
<tr>
<td>2030</td>
<td>4</td>
<td>486</td>
<td>15489</td>
<td>1024</td>
<td>4</td>
<td>8</td>
<td>31104</td>
<td>61956</td>
<td>8192</td>
<td>16</td>
<td>101</td>
<td>20000</td>
<td>32401</td>
</tr>
</tbody>
</table>

Compare 2023 prediction to actual systems in 2022
- Not bad – if “processor” includes GPU, change to 8/node and 10k/system.
- PIM – stands in for HBM with operations. Maybe a miss (or not?)
  - Note that PIM still not a dominant part
- DP performance of an NVIDIA A100 is 9.7TF (19.5TF tensor core) – not too far from “Processor”
- Missed – Assumed tighter integration – “Stream” flops part of processor, not in a separate socket (GPU)
Why Was MPI Successful?

- It addresses all of the following issues:
  - Portability
  - Performance
  - Simplicity and Symmetry
  - Modularity
  - Composability
  - Completeness

- For a more complete discussion, see “Learning from the Success of MPI”,
- [https://link.springer.com/chapter/10.1007/3-540-45307-5_8](https://link.springer.com/chapter/10.1007/3-540-45307-5_8)
Performance vs. Productivity

• MPI gives the tools for achieving performance
  • In large part by not getting in the way of locality management
• But that very feature impacts productivity
  • User has *no choice* but to manage locality, which is both hard and tricky
• In addition, as Marc Snir has noted, MPI is neither high nor low level
• But is that part of MPI’s *success* – it does both high and low level, and the tradeoff in greater use (mostly) makes up for loss of performance/function
• Any programming system will need to consider the tradeoffs of
  • Latency vs. Bandwidth vs. Convenience vs. Modularity (among others)
MPI Drives Large Scale Parallel Computing

• OpenAI uses MPI for training large language models
  https://openai.com/research/scaling-kubernetes-to-7500-nodes

• “Our biggest jobs run MPI, and all pods within the job are participating in a single MPI communicator. If any of the participating pods die, the entire job halts and needs to be restarted. The job checkpoints regularly, and when restarted it resumes from the last checkpoint.”
But What about the Programming Crisis?

• Use the right tools!
• MPI tries to satisfy everyone, but the real strengths are in
  • Attention to performance and scalability
  • Support for libraries and tools
• Many computational scientists use frameworks and libraries built upon MPI
  • This is the right answer for most people
  • Saying that MPI is the problem is like saying C (or C++) is the problem, and if we just eliminated MPI (or C or C++) in favor of a high productivity framework everyone’s problems would be solved
  • In some ways, MPI is too usable – many people can get their work done with it, which has reduced the market for other tools
    • Particularly when those tools don’t satisfy the 6 features in the success of MPI
What Might Be Next

• Intranode considerations
  • SMPs (but with multiple coherence domains); new memory architectures
  • Accelerators, customized processors (custom probably necessary for power efficiency)
  • MPI can be used (MPI+MPI or MPI everywhere), but somewhat tortured
    • No implementation built to support SIMD on SMP, no sharing of data structures or coordinated use of the interconnect

• Internode considerations
  • Networks supporting RDMA, remote atomics, even message matching (partially supported in MPI now – but what’s next?)
  • Overheads of ordering
  • Reliability (who is best positioned to recover from an error)
What Might Be Next

• MPI is both high and low level – can we resolve this?
• Challenges and Directions
  • Scaling at fixed (or declining) memory per node
    • How many MPI processes per node is “right”?
  • Realistic fault model that doesn’t guarantee state after a fault
  • Support for complex memory models (MPI_Get_address 😃)
  • Support for applications requiring strong scaling
    • Implies very low latency interface and overheads
    • Low latency means paying close attention to the implementation
      • RMA latencies sometimes 10-100x point-to-point in implementations (!)
  • MPI performance in MPI_THREAD_MULTIPLE mode
  • Integration with code re-writing and JIT systems as an alternative to a full language
Adapt to Innovation in Architecture

• Complex nodes
  • MPI + X, for X such as OpenMP, CUDA, OpenACC, etc. often effective
  • But challenges in the “+”: sharing of resources such as cores, memory, …

• Implementation of MPI on complex nodes
  • Sharing information between MPI processes on the same node that must share resources, such as memory, network, accelerators, …
  • Optimize data movement

• Some can be hidden from the user (shared memory for intranode message passing)

• Some requires user action – e.g., node-aware algorithms and methods
SMP Nodes Change The Performance Model

- For \( k \) processes sending messages, the sustained rate is:
  \[ \min(R_{\text{NIC-NIC}}, k \cdot R_{\text{CORE-NIC}}) \]

- Thus:
  \[ T = s + k \cdot \frac{n}{\min(R_{\text{NIC-NIC}}, k \cdot R_{\text{CORE-NIC}})} \]

- Note if \( R_{\text{NIC-NIC}} \) is very large (very fast network), this reduces to:
  \[ T = s + \frac{n}{k \cdot R_{\text{CORE-NIC}}} = s + \frac{n}{R_{\text{CORE-NIC}}} \]

- This is the \textit{max-rate} model (for performance limited by the maximum available bandwidth)

\textit{Modeling MPI Communication Performance on SMP Nodes: Is it Time to Retire the Ping Pong Test}, W Gropp, L Olson, P Samfass, Proceedings of EuroMPI 16, [https://doi.org/10.1145/2966884.2966919](https://doi.org/10.1145/2966884.2966919)
Adapt to New Language Models – And to Their Rapid Evolution

• Is (long-term) backward compatibility still important?
  • Many newer languages and systems don’t think so – 5 years is long for them

• How does the value of backward compatibility change with age?
  • As older codes become less important (or more modern codes become available), what is the tradeoff in making newer codes more capable/flexible/etc. or the environment more productive?

• What is the cost to future applications and usage from providing backward compatibility?
  • Many of us started careers when long-term backward compatibility was expected. Is this still the right thing?

• What does this mean for MPI?
MPI and I/O

• One area where the technology is changing *despite* HPC is I/O
  • POSIX I/O never designed to support parallel applications
    • Does define behavior of concurrent writers, readers
  • High performance with POSIX I/O challenging
    • Lots of state (e.g., access times, permissions), hierarchical file structure
    • Reflected in concerns about “metadata” impacting performance and stability
  • Apps that say they require POSIX almost always mean
    • I can’t/won’t change my code, which uses read/write/open/close
    • Almost never depend on full POSIX semantics
    • That is, they do not need POSIX
  • Modern “big data” systems are not based on POSIX
    • “Object store” decouples where data is stored from high-level information about how data relationships are organized
MPI I/O

• Essential features
  • Whole job I/O (communicator scope)
  • Efficient mapping of data from MPI processes to storage object ("file")
  • Relaxed consistency model
  • Very limited metadata requirements

• Implementation Issues
  • POSIX a poor match to MPI I/O – overly strong consistency model, defines behavior of individual processes, not parallel application
  • HPC sites still focus on POSIX
  • Thread interactions – why not have the user put thread-same MPI calls into a thread to obtain non-blocking actions?

• Opportunities
  • Database
  • Coordination with storage APIs to match needs of MPI applications
MPI I/O and POSIX

• MPI I/O designed to be high performance
  • Relaxed consistency encourages data caching, optimization of data transfers – even between MPI processes
  • Use MPI datatypes to describe arbitrary data access patterns
    • Reduces number of routine calls to describe data motion
  • Collective open informs file system that multiple processes are coordinating I/O activity
  • Almost no file metadata requirements

• POSIX I/O supports none of these performance features
  • This has been true and recognized since MPI-IO added to MPI (1997)
  • MPI never required POSIX I/O – and in fact POSIX I/O has been detrimental to MPI I/O and scientific application performance
    • POSIX I/O not designed for parallel science applications

• Modern systems have more complex I/O hardware
  • Node and server SSD
  • Non HPC systems do not use POSIX I/O
  • Some (many) HPC systems do not provide POSIX, but claim to
    • “turn off” consistency or other features that are “inconvenient” – but in the process, violate POSIX standard.
    • Applications (including MPI IO implementations targeting POSIX I/O) that depend on correctness may fail in hard-to-find race conditions

• Some work on MPI IO on non-POSIX parallel file systems
Is the MPI I/O Model Correct for Todays’ Systems and Applications?

• Data vs. Files
  • MPI I/O is mostly low level – Focus on moving bytes
  • One high-level feature – mapping of distributed data structure to files with MPI_File_set_view

• Some applications use the file system as a primitive database
  • All too common to use file as a database
    • Each record a separate file
  • Problem: file metadata can be a bottleneck
    • Rarely of interest to the (scientific) programmer
    • For record-is-file, metadata overly fine-grained

• Modern databases can provide performance and efficiencies
  • EMPRESS: Accelerating Scientific Discovery Through Descriptive Metadata Management
  • https://doi.org/10.1145/3523698 ACM Transactions on Storage (2022)

• How would you drive adoption of a new, non-POSIX approach?
  • Sharing attributes across shared data
  • What role should MPI play?
RMA and MPI

• MPI originally designed for two-sided message passing
  • Both point-to-point and collective

• Success of MPI-1 + emergence of alternative one-sided communication approach led MPI Forum to add more distributed memory programming features
  • MPI is really a “Distributed Memory Programming Interface”

• RMA is a good example of the tension between high- and low-level interfaces
Different Perspectives on RMA

• Different communities have different goals for RMA
  • Express algorithms with different synchronization patterns
    • Improves (perhaps significantly) programmability for some algorithms
    • Better match to algorithm; e.g., avoid extra messages/data transfers/synchronization
  • Access higher performance
    • Reduce CPU overhead (e.g., tag matching, message ordering)
    • Minimize memory motion, control messages
    • Exploit hardware support for communication, overlap with computation, especially for large block transfers
    • Low-latency for short data transfers
    • Remote atomic memory operations or other hardware assist
      • But tricky – e.g., atomics not always faster than lock/ops/unlock for sequences of operations
  • Optimize for important special cases
    • E.g., symmetric allocation of memory
What Can an RMA Design Assume?

• MPI has succeeded by embracing a “Greatest Common Denominator” approach
  • Take advantage of community consensus on hardware features
  • Ensure portability with good performance

• But the “Common” part stifles innovation
  • Features not already adopted are hard to fully exploit from within the standard
  • The tyranny of “Common” forces the standard to sacrifice both performance and programmability for portability and precise semantics

• Q: How can MPI encourage innovation in RMA interfaces?
• Q: Is portability (with performance) a hard or soft constraint?
MPI One Sided/Remote Memory Access History

• MPI-2 added RMA in 1997 (26 years ago!)
  • Some practice, but semantics of other systems often imprecise
  • Matched hardware capabilities of high-end systems of the time (Cray T3D/T3E; NEC Earth Simulator)
  • Expected support in network NIC with local memory (hence memory model)
  • Only collective association of memory with MPI_Win

• Both Fence and PSCW defined to exploit the hardware of the day
  • Fence could be implemented in hardware and was very fast on some systems (e.g., T3D/T3E)
  • PSCW described halo exchange well (though hard to exploit)

• Active target and passive target captured different application styles
  • Passive target limitations an attempt to ensure portable performance
MPI One Sided/Remote Memory Access History

• MPI-2 RMA had limited adoption
  • Complex memory model hard to explain
  • Limitations on passive target memory limit usefulness
  • Limitations on operations, memory, etc.
  • Poor performance of some/many implementations – often unnecessarily so
  • Even with that, some apps and implementations did very well
• MPI-3 substantially revised and enhanced RMA in 2012
  • Address overly strong correctness semantics (undefined rather than erroneous) and additional use cases for applications
  • Add “unified” memory model – HW support for coherency now widespread
  • Add additional ways to associate memory, describe data transfers, complete operations, and extend to processes sharing memory
  • But added to MPI-2 RMA – keeping all features from (then) 15 years before
Relevance

• Is MPI RMA too complex, portable, limited, constrained, etc. to be useful?
  • Consider challenges in using MPI RMA for implementing other one-sided programming systems and libraries (e.g., shmemp, GASNET, GASPI)

• MPI-2 RMA, for all of its limitations, was driven by use examples of the time. MPI-3 also driven by different use examples.
  • What are the right use cases for MPI-5 RMA?
  • Who is the right audience?

• Is MPI RMA a high-level interface, expected to be used freely within user applications, or a low-level interface, used to implement core abstractions in an application framework?
  • Like much of MPI, as Marc Snir points out, it is both – and that is likely a bad choice
Innovation and Stability

• How can MPI RMA stay current with technology when there isn’t consensus?
  • It can’t – so we’ll need to make some compromises
    • We’re currently accepting lower performance and capability to get portability and stability of code. Is that the right choice?

• Q: Should MPI RMA provide access to features that can’t be efficiently supported on all platforms?
  • Should implementations be required to support all features, even if they are inefficient, or should the features not be supported?
  • How can users reliably determine what is supported, and what is supported with adequate performance (and how do you define that)?
Audience

• Who is expected to use MPI RMA? End users? Tool developers? Compiler writers?
  • More precisely, which parts of RMA are for each of these groups?
  • What is the role of libraries?
  • For end users, how expert are the users? Shared memory issues are very tricky; RMA shares many of these hazards.

• The MPI RMA specification is aimed at MPI implementors, and (correctly) worries about all the edge cases
  • Users (mostly) don’t want that – they want a subset that is easy to use and understand, even if that might mean missing some optimizations

• Q: Can we describe RMA for a single audience, or should there be different user profiles?

• Q: Can/Should MPI RMA define easier-to-understand subsets? Or is this the obligation of training materials?
Feature Lifetime

- What is the lifetime required? Do RMA codes need to run without change in 20 years? 10? 5? At what cost in potential performance?
  - This impacts how we approach hardware innovation
  - Many modern software systems expect to break backward compatibility – is it time for MPI to do the same, at least in some places?

- Note we’re leaving an era of over 3 decades of architectural stability – which has been of great benefit to MPI
  - But we’re leaving that era – what made sense while architectures were (mostly) stable may no longer make sense

- Q: Is backward compatibility essential?
- Q: Could the standard offer some features with an explicit limited lifetime?
Accelerators and MPI

• Major challenge: Separate memory spaces
  • Even if “unified”, they have different performance characteristics
• Data Movement
  • MPI allows arbitrary access patterns – not just contiguous or strided
  • Like RMA, generality may be a mismatch for hardware support
• Synchronization, not just data movement
  • MPI assumed general processor
• MPI designed around messages, not streams
  • Streams imply some ordering, which can be a performance problem in large networks
  • But intranode, some sort of stream ordering may be preferable – and supported in hardware
Small Steps

• MPI Partitioned Communication
• “High quality” MPI implementation
  • Recognize different memory regions, adapt internally
• MPI Forum HACC WG
  • Continuations proposal #6 (also see #585)
  • Clarification of thread ordering rules #117 (MPI 4.1)
  • Integration with accelerator programming models:
    • Accelerator info keys #3 #714 (MPI 4.1)
    • Accelerator Synchronous MPI Operations #11
    • Accelerator bindings for partitioned communication #4
    • Partitioned communication buffer preparation (shared with Persistence WG) #264
• Asynchronous operations #585
• https://github.com/mpiwg-hybrid/hybrid-issues/wiki
MPI Developments

• MPI Forum continues to discuss evolution of MPI
• MPI 4.1 will be released this year
  • Note MPI 4 added new features, including
    • Sessions
    • Partitioned communication
    • Access to hardware hierarchy
    • Tuning for performance (help implementations with performance tradeoffs)
• MPI 5.0
  • May include new RMA, streams, etc.
• Get involved!
  • Mpi-forum.org
  • Most meetings virtual; March 2023 hybrid
Summary

• MPI has been remarkably successful
  • Powerful abstractions, avoided being tied too closely to HW at a moment in time
  • Benefitted from stability in architecture
• That era of stability has ended
  • MPI needs to adapt
  • HPC no longer driving all high-performance HW, SW
• Time to identify and rethink assumptions
  • Tradeoffs in portability, performance, programmability
• Rethink building blocks
  • Consider streams, notification, subsets
  • Explicit consideration of latency and bandwidth separately