### MPI vs the Commercialization of HPC

Ideas for a modern MPI

Joseph Schuchart EuroMPI'23, September 16, Bristol, UK





### About Me

- Masters: TU Dresden (2012)
- PhD: Stuttgart University (2020)
- Research Scientist @ ICL
- First Forum Meeting: May 2019

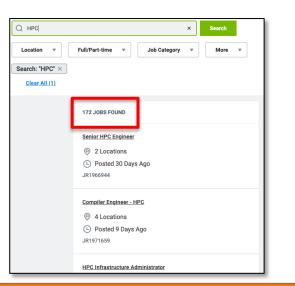




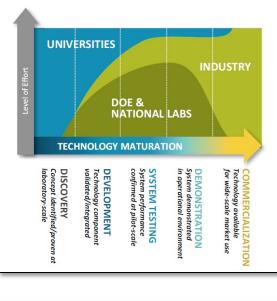


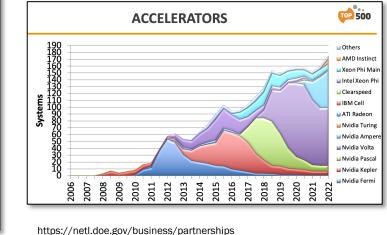
### The HPC Landscape Today

- Commercialization of HPC
- Accelerators (GPU, APU, TPU, Quantum?)
- Alternative communication libraries (NCCL, RCCL)
- Decline in public funding



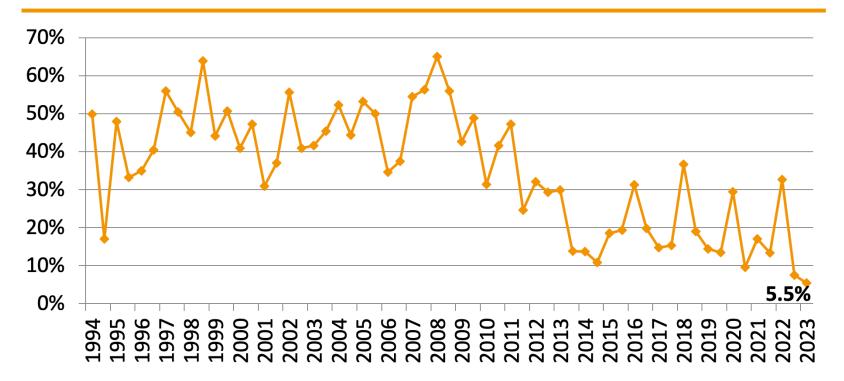








### NEW ADDED HPL PERFORMANCE PER LIST





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TOP 500

### **MPI & HPC Over Time**





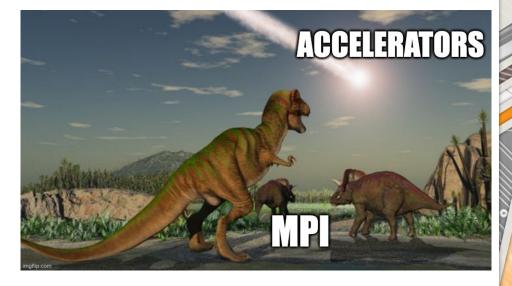
### **HPC vs Cloud Computing**





## The Computing Landscape is Changing

- What can MPI learn from commercial approaches?
- What does MPI bring to the table?
- How can MPI stay relevant?
- What can we learn from the past?





### **MPI: A History of Stability**

### The MPI standard is

A consistent & stable framework Covering many aspects of distributed memory programming Nurturing a mature **tools environment Community-driven Research-driven** Mostly funded through research Catering to traditional HPC (academia & HPC Centers)

The MPI standard is not

Moving fast

Compact

Easy to extend and adapt

Removing features easily

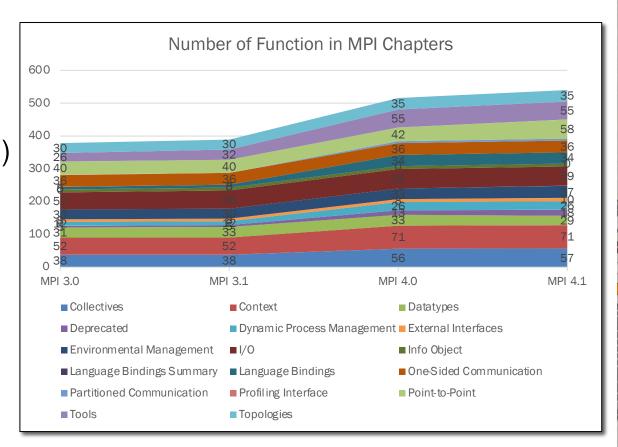
Catering to broader demands



### **MPI Chapters by the Numbers**

- MPI 4.1: 540 functions
  - 4.0 4.1: +2.9%
  - 3.1 4.0: +32%
  - 4.0 4.1: +4.6%
  - Includes deprecated functions (5-18)
  - Does not include big-count & PMPI







### **Comparing Communication Libraries**

| Feature                            | MPI 4.1      | (NV)SHMEM | NCCL |
|------------------------------------|--------------|-----------|------|
| Communicators, Groups              |              |           |      |
| Custom Reduction Operators         | $\checkmark$ | ×         |      |
| Collective Communication           |              |           |      |
| P2P Communication                  | $\checkmark$ | ×         |      |
| Profiling API (call interposition) |              |           |      |
| One-Sided Communication            | $\checkmark$ |           | ×    |
| Tool Introspection                 |              | ×         | ×    |
| Custom Datatypes                   | $\checkmark$ | ×         | ×    |
| Multi-Library Support              | $\checkmark$ | ×         | X    |
| Failure Mitigation                 | ×            | ×         |      |
| Stream-aware communication         | ×            | ×         |      |
| Device-Side Communication          | X            |           | X    |

Other Alternatives: Gloo MapReduce



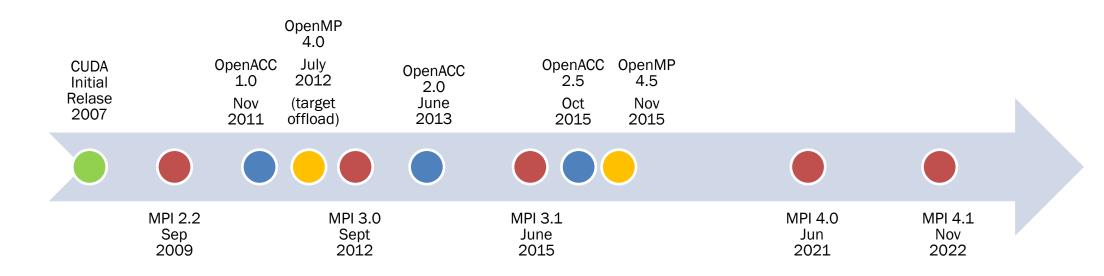
### **Example: Allreduce**

| MPI_ALLREDUCE(sendbuf, recvbuf, count, datatype, op, comm) |          |  |  |  |  |  |  |
|--|----------|--|--|--|--|--|--|
| IN   | sendbuf  | starting address of send buffer (choice)                 |  |  |  |  |  |
| OUT  | recvbuf  | starting address of receive buffer (choice)              |  |  |  |  |  |
| IN   | count    | number of elements in send buffer (non-negative integer) |  |  |  |  |  |
| IN   | datatype | datatype of elements of send buffer (handle)             |  |  |  |  |  |
| IN   | ор       | operation (handle)                                       |  |  |  |  |  |
| IN   | comm     | communicator (handle)                                    |  |  |  |  |  |
|  |          |  |  |  |  |  |  |

| ncclAllReduce   |
|---|
| ncclResult_t ncclAllReduce(cor st void senabur), void retvbuff, size_t count, ncclDataType_t datatype,<br>ncclRedOp_t op, ncclComm_t comm, cudaStream_t stream) |
| Reduce data arrays of length count in sendbuff using op operation and leaves identical copies of the result on each recvbuff.                                   |
| In-place operation will happen if sendbuff == recvbuff.   |



### An Analogy? OpenMP and OpenACC

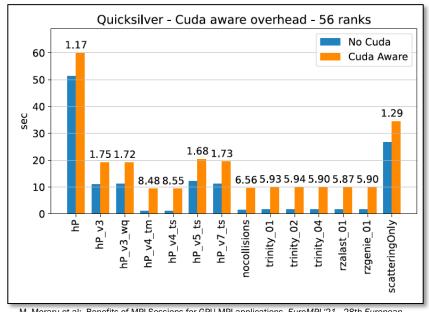




# **Device Support in MPI 4.1**

- Enabling/requesting support for certain memory spaces during startup/initialization
- Asserting usage of memory spaces in communication
- Side document describing memory spaces
- Hybrid & Accelerator WG (Jim Dinan)

**Goal:** avoid unnecessary initialization and buffer checks



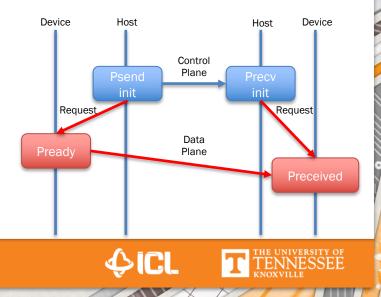
M. Moraru et al.: Benefits of MPI Sessions for GPU MPI applications. EuroMPI '21 - 28th European MPI Users' Group Meeting, Sep 2021.



### **Device Support Beyond MPI 4.1**

### Device-side triggered communications

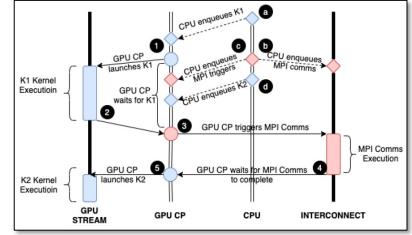
- Partitioned communication to separate control plane (CPU) and data plane (device)
- Missing from 4.1: Request transfer to device & RTS/CTS signaling
- But: Partitioned communication is not a panacea
  - Static communication patterns
  - Dynamic pattern need different approaches



### **Device Support Beyond MPI 4.1**

### Stream-synchronous communication

- Make MPI aware of device streams
- Order communication with computation on stream
- Several proposals to consolidate:
  - MPIX\_Streams
  - MPIX\_Queue
  - Graph Execution Engine



N. Namashivayam et al: Exploring GPU Stream-Aware Message Passing using Triggered Operations. 2022. <u>https://doi.org/10.48550/arXiv.2208.04817</u>



### **Device Support in Implementations**

- Implementations slowly added CUDA for reductions
- MPI can achieve performance similar to NCCL
- Why do only 2 implementations support device offload of reductions?
  - Mostly engineering effort
  - Conflict with proprietary network libraries

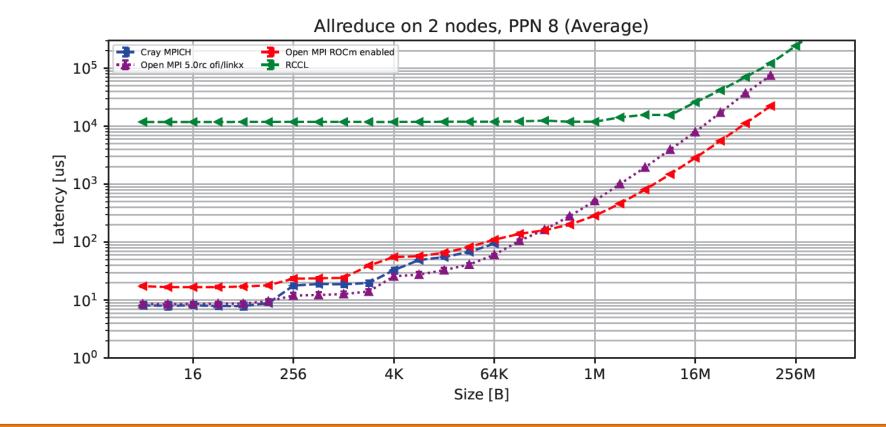
| Scalable Dis<br>CUDA-A<br>Ammar Ahmad A   | 2019 19th IEEE/ACM International Symposium on Cluster, Cloud and Grid Computing (CCGRID)<br>Scalable Distributed DNN Training using TensorFlow and<br>CUDA-Aware MPI: Characterization, Designs, and<br>Performance Evaluation<br>Ammar Ahmad Awan, Ching-Hsiang Chu, Jeroen Bédorf<br>Hari Subramoni, and Dhabakewar K. Panda Mindsai |   |           |              |   |         |  |  |  |  |
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■Horovod-NCCL2 ■Horovod-MPI-Opt ■Ideal Fig. 9. Performance comparison for ResNet-50: Training performed using two Horovod designs on the Owens Cluster (up to 64 GPUs). 1) NCCL 2.3.4 was used for NCCL experiments. 2) Horovod-MPI-Opt refers to the design that takes advantage of the new Allreduce implementation made available in the MVAPICH2-GDR 2.3rc1 library.



No. of Nodes (GPUs

### **Allreduce on Frontier**



¢iCl.

Allreduce on Frontier (RCCL, Open MPI (unofficial), Cray MPICH)

### Sessions: Make it count

- Sessions become available in implementations
- Many envisioned features have not materialized [1]
  - Resource isolation
  - Fault Tolerance
- Uptake by applications?
  - Too early to say
- Mainly vehicles for malleability research?

Towards dynamic resource management with MPI sessions and PMIx D Huber, M Streubel, I Comprés, <u>M Schulz</u>... - ... the 29th European MPI ..., 2022 - dLacm.org ... We build on top of the MPI Sessions prototype in Open MPI [8] as well as its already existing usage of the PMIx interface [3]. The latter provides mechanisms for runtime environments to ...  $\frac{1}{3}$  Save 90 Cite Cited by 9 Related articles All 8 versions  $\gg$ 

Benefits of MPI Sessions for GPU MPI applications M Morarı, <u>A Roussel</u>, M <u>Pérache..</u> ... European MPI ..., 2021 - hal-cea archives-ouvertes.fr ... Secondly, we bring a lightweight solution based on the new MPI Sessions concept. Our goal is to highlight the benefits of MPI sessions on CUDA-Aware libraries and GPU hybrid ... ☆ Save 99 Cite Cited by 2 Related articles All 13 versions ②

An Emulation Layer for Dynamic Resources with MPI Sessions J Fecht, M Schreiber, <u>M Schulz</u>, H Pritchard..., - ... Conference on High ..., 2022 - Springer ... an emulated MPI Sessions environment on top of existing MPI implementations without MPI Sessions ... Using this proof-of-concept environment, we show how an MPI Sessions enabled ... ☆ Save 59 Otte Cited by 1 Related articles All 8 versions

An Emulation Layer for Dynamic Resources with MPI Sessions
<u>DJ Holmes</u> -... Workshops: Hamburg, Germany, May 29–June 2..., 2023 - books.google.com
... an emulated MPI Sessions environment on top of existing MPI implementations without MPI
Sessions ... Using this proof-ofconcept environment, we show how an MPI Sessions enabled ... % Save 99 Cite Related articles

MPI Session: External Network Transport Implementation (V. 1.0) HP Pritchard Jr, <u>T Herschberg</u> - 2020 - osti.gov

... facilitate acceptance of the Sessions proposal by the ... MPI Sessions that removes this restriction for the networks to be used in the next generation of DOE exa-scale systems. Open MPI  $\Rightarrow$  Save 99 Cite Related articles  $\gg$ 

[PDF] An Emulation Layer for Dynamic Resources with **MPI Sessions** <u>M Schulz</u>, H Pritchard, <u>DJ Holmes</u> - martin-schreiber.info

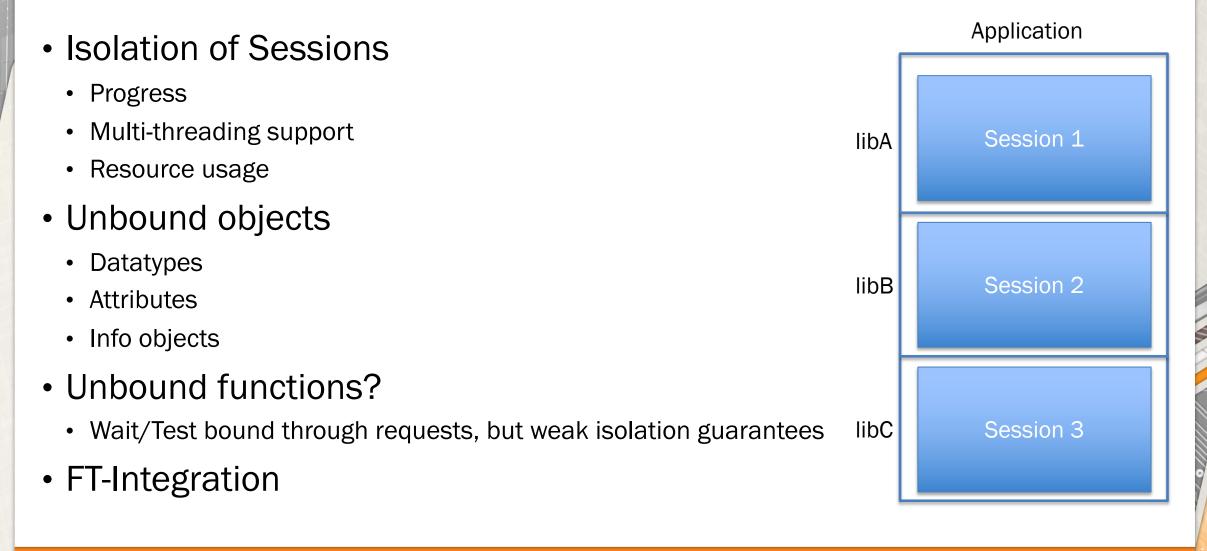
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Exploring and Prototyping the **MPI** Process Set Management of **MPI Sessions** VA Suma - 2019 - mediatum.ub.tum.de

... decisions and suggestions made by the "Sessions working group" in MPI forum. Our work is ... any MPI application written in OpenMPI. We demonstrate the working of MPI Sessions with ... ☆ Save 199 Otte Cited by 1 Related articles 100



### **Sessions Going Forward**





Today, MPI's error handling model is what it has always been; you can assign an error handler to be called when an error occurs in an MPI program, and when that happens you can... well, you can print a nice message before you crash, instead of crashing without the nice message.

[J. Dursi: HPC is dying, and MPI is killing it. 2015]



### **MPI-4 Error Handling Evolutions**

- As part of MPI-4, we introduced changes that makes error handling more 'localized'
- Initial error handler: set the error handling during mpiexec (to avoid FATAL behavior during MPI Init)
- MPI\_ERRORS\_ABORT (localize errors to the current comm)
- Errors routed to MPI\_COMM\_SELF rather than MPI\_COMM\_WORLD (localize non-comm errors to the local process)

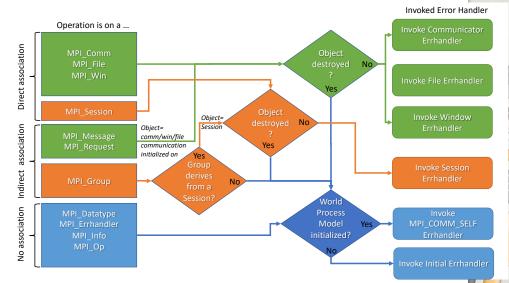
- Overarching goal is that MPI errors would behave more like "Posix" errors
  - Error indicate that the particular operation failed
  - The rest of MPI is not necessarily in a "broken" state
  - Errors should be as local as possible



# Error Handling MPI 4.1 items

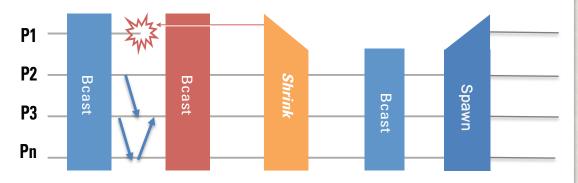
- MPI\_COMM\_CREATE\_FROM\_GROUP (Issue 511) DONE
  - Error handling changed from 4.0 (Errata)
  - Errors during the operation raised on the Session/Initial error handler
  - Error handler argument is set on the created communicator
- Clarification of error handling fallback (Issue 588) VOTING
  - We found that figuring out where to raise an error (e.g., on a comm, a session, or fallback) was not clear
  - Added flow diagram that clarifies
- MPI\_ERR\_ERRHANDLER (Issue 525) DONE
  - New error for when an invalid error handler handle is passed to an MPI procedure
- MPI\_Delete\_error\_class/code/string (Issue 283) READING
  - · New capability to remove user defined error management handles

#### Error handling fallback diagram



### What's Next? Towards MPI-5

- Current status with "posix-like error handling" gives fallback from MPI errors, crude fault tolerance, but no MPI fault recovery
- Working on two main proposals:
  - Fine-grained recovery: "ULFM v2" Led by Aurelien Bouteiller
  - Coarse-grained recovery: "Reinit" Led by Ignacio Laguna
  - Proposals designed independently, but designed to be compatible and completement each other
- Implementation Status
  - ULFM v1 and v2 in Open MPI v5.0.x/main
  - ULFM v1 in MPICH
  - Reinit in Open MPI branch



#### ULFM FT mode:

operations can continue on failure-damaged communicators SHRINK operation can create new clean communicators without failed processes

Replacement process spawning under user control



Reinit FT mode:

Faults cause the application to return to the MPI\_Reinit call Replacement processes spawned implicitly All communicators invalidated



## **Upcoming new FT features Timetable**

- ULFM Slice 1: General Chapter Structure and error reporting
  - MPI\_ERR\_PROC\_FAILED, MPI\_Comm\_get\_failed, MPI\_Comm\_ack\_failed, MPI\_Comm\_revoke
  - Implicit control for uniformity (same error raised at all ranks in collectives)
  - Implicit control for error range (error raised per-operation/group/universe)
  - VOTED-IN! (Q1/23)
- ULFM Slice 2: MPI\_COMM\_(I)AGREE
  - New interface removes linkage with "ack\_failed" (cleaner
  - Ready for reading ETA: Q2/23?
- ULFM Slice 3: MPI\_COMM\_(I)SHRINK
  - Communicator centric mode for creating repaired comms
  - Support spawning replacement in combination with MPI2 Dynamics
  - Ready for reading ETA: Q3/23?
- Slice 4: Query interface for FT mode, --with-ft mpiexec argument
  - Query from the program if an FT mode is available at runtime (code must compile, but FT is expected to be runtime-off by default in most impl.)
  - Prior interface with Attribute on MPI\_COMM\_WORLD undesirable (incompatible with sessions)
  - New interface required, must support enabling/querying multiple modes (if applicable)
  - Design phase ETA: Q4/23

#### Slice 5: MPI 2 Dynamics

Old text complex, because we wanted to support fully local model (root-only consistency)

- Revisit: should we move to a "uniform" model, or "uniform by default" model for dynamics? Text would be simpler, examples too. ETA: Q4/23
- Slice 6: Files
  - Old text probably good ETA: /24
- Slice 7: RMA
  - Old text generally sound, but may need some rework to unify with the wording in Slice 1 ETA: /24
  - Should we have "group" error range by default on Windows?
  - Should we have only "group" error range on Windows?

#### Slice 5.5: Sessions and Malleability

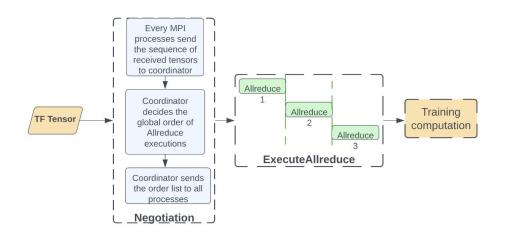
- Define fault behavior for MPI\_COMM\_CREATE\_FROM\_GROUP (the main session entrypoint that is not a local operation) Discussion started, ETA: Q4/23
- Define fault behavior for MPI\_SESSION\_FREE/DISCONNECT (since these are collective) Discussion started, ETA: Q4/23
- MPI\_SESSION\_REVOKE?
- Shrinking psets? Versionned psets? Discussion started but still nebulous
- Reinit
  - Ignacio will show some text soon (maybe next meeting depending on agenda)
  - Concepts can coexist in both standard and implementation
  - Incorporating both models will require some glue text (not hard)

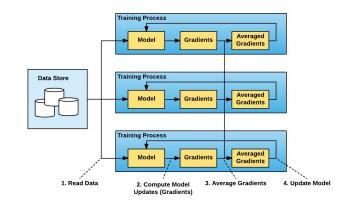


#### 25 Courtesy A. Boutellier

### Case Study1: MPI in Horovod

- Horovod coordinates allreduce of gradients
- NCCL allreduce executed in stream order
- Horovod designed around these constraints
- Serialized communication in Horovod-MPI





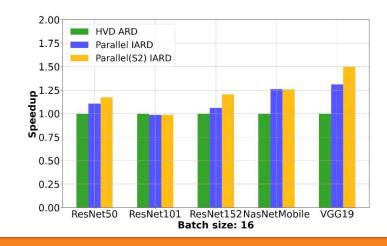


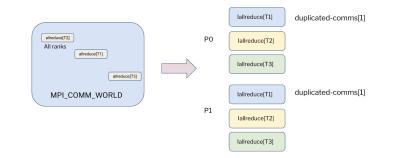


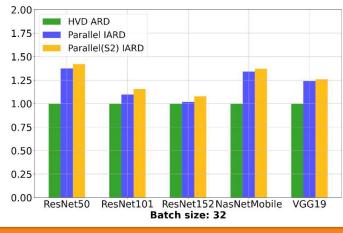
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### **Concurrent Allreduce in Horovod**

- Communicators: concurrent collectives
  - Not possible with NCCL
- Avoid negotiation phase in Horovod
- Better utilize network bandwidth
- Improve training throughput up to 50%
  - Over default Horovod-MPI



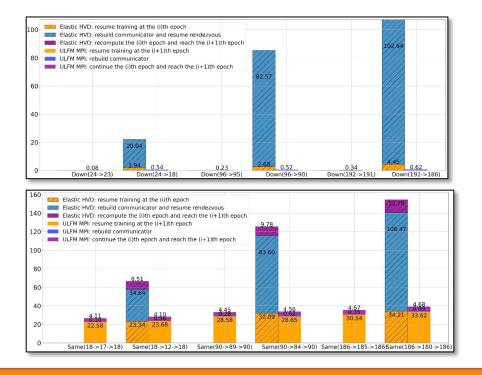


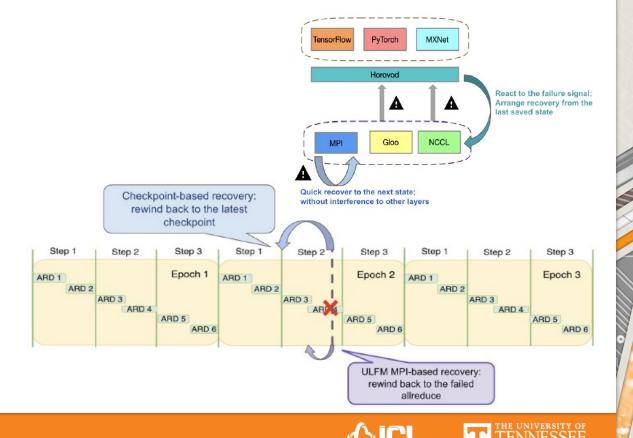




### Case Study 2: ULFM & Horovod

- Elastic Horovod: fault mitigation through checkpointing
- ULFM: shrinking & growing of communicators





### What MPI brings to the table:

Flexible communication patterns Fine-grained fault tolerance



### Case Study 3: MPI vs LCI in PaRSEC

- PaRSEC emulates AMs using Send/Recv
- MPI: Single thread injection & extraction
  - Request management
  - Multi-threading concerns
  - Opaque progress semantics
- LCI backend: explicit progress threads
  - Improved extraction rate
  - Reduced starvation

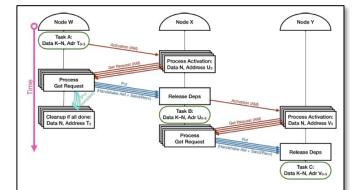
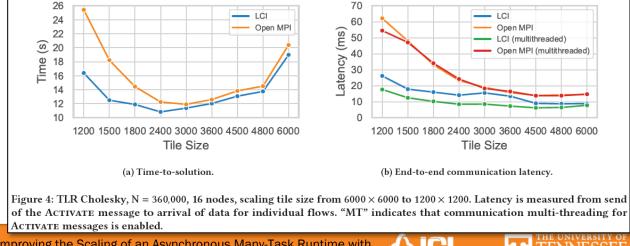


Figure 1: PaRSEC communication example. Task A runs on node W with descendant tasks B and C on nodes X and Y, respectively. There are four dataflows that must be propagated as part of the broadcast.



Omri Mor, George Bosilca, and Marc Snir. "Improving the Scaling of an Asynchronous Many-Task Runtime with a Lightweight Communication Engine." (2023).

## **Progress & Threads in MPI**

- Definition of progress in MPI 4.1 first step
- Cooperative strong progress
  - No application interference
  - But application cooperation
- Revisit previous efforts (MPI teams)
- Ties in with thread-local resources
  - MPIX\_Stream, virtual endpoints
  - Improved injection & extraction





### Why MPI Progress is slow



#### 32 Note: I am not singling out any particular person or institution here.

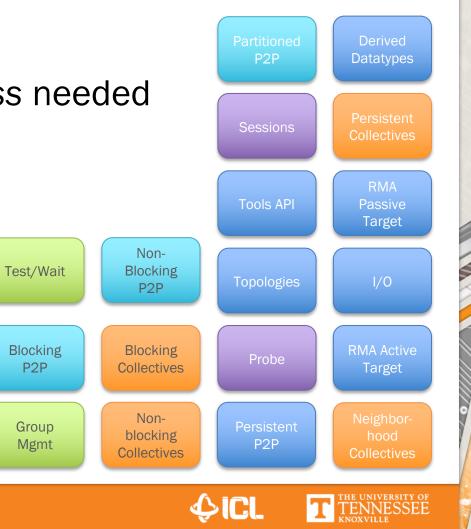


# Where to go from here?

- MPI thrived on stability
- But: past additions were incomplete
- Process for Extensibility and responsiveness needed

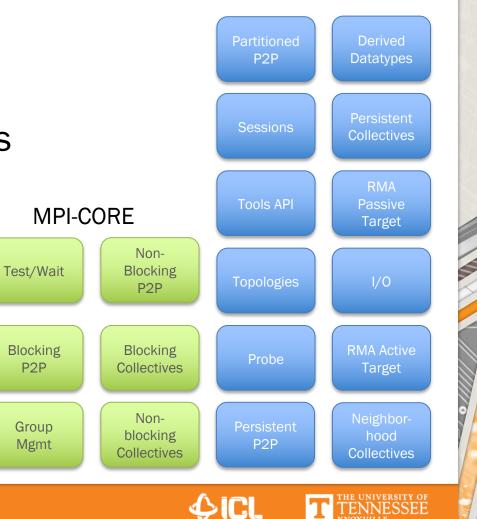
### Proposals

- Modularization
- Extensions
- Modernization



# **Modularizing MPI**

- 2 full implementations of MPI
- Big lift for new implementations
  - OMPI: 350kloc for MPI (w/o comments)
- Some features used by only few (no?) users
- Restructuring of document:
  - Main document: core functions
  - Annexes: optional functionality
- Path for removal of features dropped by implementations



**MPI-OPTs** 

### **Process For Extensions**

- Formalize procedures and requirements
  - 1. Official extension namespace
  - 2. Extension publication (MPI Forum)
  - 3. Full implementation (MPI Advance?)
  - 4. Demonstrated use
  - 5. Upstreaming
- Learn from other communities
  - C & C++
  - OpenMP



#### . Introduction

C and C++ diverge in their definition of forward progress guarantees, and have done so since C++11 and C11 added a memory model and acknowledged that threads exist. Both committees have been working together to reduce needless differences. [?2736)] and [N2644] perform such harmonization.



### **Process For Modernization (I)**

- Standard includes 2 languages that are rooted in traditional HPC: Fortran and C
- Make MPI language-independent
- Language bindings as Side Documents



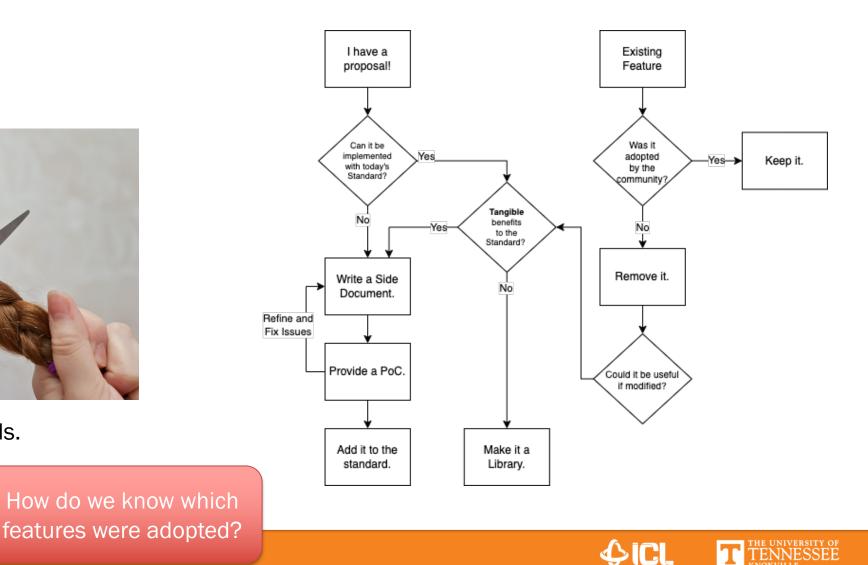


### **Process For Modernization (II)**

• MPI on a diet



Cutting off old braids.





# Supporting Modern Programming Approaches

- ABI efforts important step for distribution portability
- Generalized datatypes:
  - Iterables / non-contiguous containers
  - Generators
- Futures: MPI Continuations
  - Side document for 4.1
  - 2 PoC implementations
  - Demonstrated use in applications
  - Proposal finalization



### What does MPI bring to the table?

- Wide coverage of operations
- Communication contexts
- Blocking, non-blocking & persistent operations
- A stable API with (mostly) stable implementations
- Decades of experience in HPC



### What to learn from the Competition?

- Adaptation to new paradigms requires (only slight) adjustments
- Accelerators are here to stay
- MPI community must adapt to this reality
- Staging grounds for new features needed

#### ncclAllReduce

ncclResult\_t ncclAllReduce(const void\* sendbuff, void\* recvbuff, size\_t count, ncclDataType\_t datatype, ncclRedOp\_t op, ncclComm\_t comm, cudaStream\_t stream)

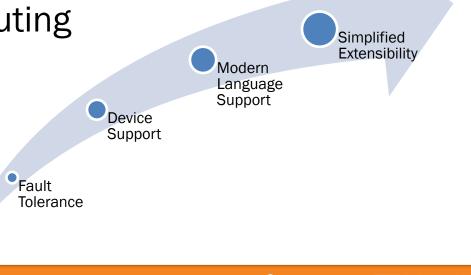
Reduce data arrays of length **count** in **sendbuff** using **op** operation and leaves identical copies of the result on each **recvbuff**.

In-place operation will happen if **sendbuff** == **recvbuff**.



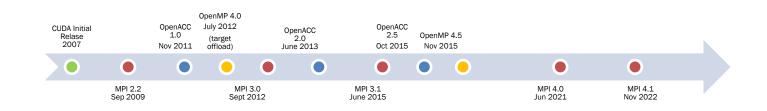
### How can MPI stay relevant?

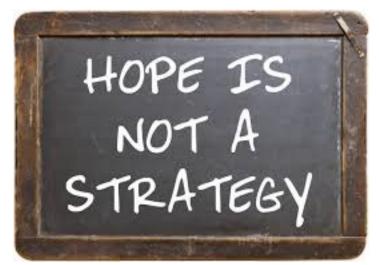
- Fault Tolerance (srsly)
- Device integration:
  - Low-overhead support
  - Device & stream integration
- Support for modern languages
- Timely adaptation to a changing computing eco-systems through extensions
- Focus on current topics



### What can be learned from past mistakes?

- Immature proposals should be delayed
  - Without delaying standard releases
- Regular releases provide timely updates to users
- Official path for experimental extensions
- Stable implementation should be a requirement
- Deliberately slow down expansion of the main standard







### Conclusions

- Manage split between stable framework and adaptable API
- Rethink what communities we focus on
  - Traditional HPC / C & Fortran
  - Modern Languages & compute platforms
- Incorporate advances made in the commercial space
- Deliver solutions for users, not for the MPI standard



