DAME: A Runtime-Compiled Engine for Derived Datatypes

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What is DAME?

DAME is a language and interpreter specifically designed for data movement

A DAME program lets a user declaratively describe a data layout.
 The interpreter can then perform pack/unpack operations on this data layout in the most efficient manner possible
 A DAME program can also be compiled using a JIT approach for even greater efficiency

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Where is it used?

We patched MPICH to use the DAME interpreter as its datatype processing engine

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Do we really need a data-movement language?

- Writing packing loops by hand can be cumbersome
- Hand-optimized packing loop nests may not have performance-portability
- Declarative loops allow user to specify only the high-level data layout and allow the runtime to pick the most efficient way of performing the packing

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An example: Matrix transpose

 One implementation has sequential writes and strided reads, the other has strided writes and sequential reads.

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- Relative performance is platform-dependent
- Neither efficient for cache-based systems.

MPI Datatypes

 Bit more verbose, but implementation can choose between strided writes and sequential writes

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Are MPI datatypes always better?



Figure: Communication speedup over manual packing

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Why is the performance poor?

Interpretation overhead

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- No optimizations? (in manual packing, compiler can perform some optimizations)
- Poor choice of intermediate representation?

These are just some possibilities.

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So why runtime compilation?

- Reduce interpretation overhead
- Exploit runtime information. For instance knowing loop bounds can help compiler make better optimization decisions
- Let the compiler handle platform-specific information, e.g., cache sizes, instead of having the programmer do it all
- MPI datatypes are typically created once and reused often.
 Compilation overhead can be amortized

Design considerations

- Reduce interpretation overhead
- Maximize ability of compiler to optimize code. Expose as much as possible of user's program to compiler
- Simplify partial packing/unpacking as much as possible
 - Data may be transfered in packets; thus the pack/unpack code must be able to pause and resume. Keeping this requirement from impacting performance is key.

- Support for memory access optimizations
- Support for runtime compilation

DAME is a primitive-based language with an interpreter organized as a stack machine

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Matrix transpose revisited

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EXIT
BLOCKINDEXED1 (4,1, [0,8,16,24],40)
VECTORFINAL (5,1,4,8)
CONTIGFINAL (8)
BOTTOM
```

- EXIT and BOTTOM are control primitives
- The Final primitives indicate the innermost types. Exposes at least a doubly-nested loop to the compiler

- CONTIGFINAL simplifies partial packing
 - Not executed unless partial pack (or unpack)

DAME interpreter

- 1. Begins at first primitive after EXIT
- 2. Each primitive is "pushed" onto the interpreter stack
- 3. At each non-final primitive, only pointers are updated
- Actual data is moved at each Final primitive. If packing can only be partially done, the maximum amount of data is packed including partial blocks

5. Terminate when **EXIT** is encountered

DAME — Optimizations made possible

- EXIT simplifies termination checks
- CONTIGFINAL simplifies resuming from partial packs because control jumps directly to this primitive to complete the last partially packed block
- In partial packing, the interpretation stack contains the entire state and resuming is as simple as restoring this stack
- Memory access optimizations can be done by shuffling primitives as desired. This is done at "commit" time.
- Other optimizations such as normalization, displacement sorting and merging can also easily be performed at commit-time.

Additional optimizations possible

- Alignment can be determined most accurately and appropriate instructions can be chosen
- Prefetching can be done more accurately because the sizes of the types and the cache are all known

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The main switch statement at the heart of interpretation loops is eliminated Implementation I: DAME-L

First implementation using LLVM

- All the work of code generation, JIT'ted code management handled by LLVM's MCJIT API.
- Plenty of optimizations available
- ► Overhead was terrible (commit-time was ≈100000x slower than non-JIT'ted DAME)

Implementation II: DAME-X

Alternate implementation using XED^1

- Custom opcode generator with support for a very limited subset of x86
- Much lower compile overhead (1000x faster than DAME-L)
- Limited optimizations enabled and will only work on x86

Evaluation

- Evaluated using DDTBench by Schneider et al²
- DAME implementation was MPICH patched to use DAME as the datatype processing engine
- Test machine was the Taub cluster at the University of Illinois consisting of 12-core Xeon E5 X5650 processors with an InfiniBand interconnect
- Cray MPICH was tested on Blue Waters to compare performance over manual packing

²T. Schneider, F. Kjolstad and T. Hoefler. MPI datatype processing using runtime compilation. EuroMPI '13

Datatype create/free overheads

	Create(μs)				Free(μ <i>s</i>)			
	ОМ	DM	D-L	D-X	ОМ	DM	D-L	D-X
FFT2	11	12	153946	967	5	7	834	10
LAMMPS	816	72	439408	2636	99	13	1383	15
MILC	5	3	87115	462	0	1	308	2
NAS_LU_x	1	1	31624	235	0	1	110	1
NAS_LU_y	2	2	77356	425	1	1	232	2
NAS_MG_x	7	3	74376	464	3	0	248	2
NAS_MG_y	2	2	81799	432	1	0	258	2
NAS_MG_z	2	1	77971	431	1	1	230	2

Figure: OpenMPI, DAME, Dame+LLVM, Dame+XED respectively

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Communication speedup (p=2)



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Communication speedup over manual packing (p=2)



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Overall speedup in mini-app: FFT2³

FFT2: Total run time (p = 2)



³T. Hoefler and S.GottLieb. Parallel zero-copy algorithms for fast fourier transform and conjugate gradient using MPI datatypes. EuroMPI <u>10</u> (2) 30

Effect of compiler optimizations (DAME-L with FFT2)



FFT2: Impact of optimizations on total runtime (p=2)

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Figure: Bar graph is execution-time speedup over O0. Line graph is commit-time slowdown (inverse speedup)

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Conclusions

- Implemented DAME, a JIT-enabled language for data movement as the datatype processing engine in MPICH
- Experiments with DDTBench a suite of datatype benchmarks taken from real applications — shows consistent improvement in communication performance over existing MPI implementations
- JIT compilation improves the performance of DAME even further in many cases.
- A comparatively low-overhead special-purpose JIT compiler is beneficial and not impractical to implement