#### Performance Analysis of Lattice QCD Application with APGAS Programming Model

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#### Programming Models for Exascale Computing

- Extremely parallel supercomputers
  - It is expected that the first exascale supercomputer will be deployed by 2020
  - Which programming model will allow easy development and high performance is still unknown
- Programming models for extremely parallel supercomputers
  - Partitioned Global Address Space (PGAS)
    - Global view of distributed memory
    - Asynchronous PGAS (APGAS)
  - → Highly Scalable and Productive Computing using APGAS Programming Model





#### **Problem Statement**

- How is the performance of APGAS programming model compared with existing massage passing model?
  - Message Passing (MPI)
    - Good tuning efficiency
    - High programming complexity
  - Asynchronous Partitioned Global Address Space (APGAS)

High programming productivity, Good scalability
Limited tuning efficiency



## Approach

- Performance analysis of lattice QCD application with APGAS programming model
  - Lattice QCD
    - one of the most challenging application for supercomputers
  - Implement lattice QCD in X10
    - Port C++ lattice QCD to X10
    - Parallelize using APGAS programming model
  - Performance analysis of lattice QCD in X10
    - Analyze parallel efficiency of X10
    - Compare the performance of X10 with MPI





## **Goal and Contributions**

- Goal
  - Highly scalable computing using APGAS programming model
- Contributions
  - Implementation of lattice QCD application in X10
    - Several optimizations on lattice QCD in X10
  - Detailed performance analysis on lattice QCD in X10
    - 102.8x speedup in strong scaling
    - MPI performs 2.26x 2.58x faster, due to the limited communication overlapping in X10

#### Table of Contents

- Introduction
- Implementation of lattice QCD in X10
  - Lattice QCD application
  - Lattice QCD with APGAS programming model
- Evaluation
  - Performance of multi-threaded lattice QCD
  - Performance of distributed lattice QCD
- Related Work
- Conclusion

## Lattice QCD

- Lattice QCD
  - Common technique to simulate a field theory (e.g. Big Bang) of Quantum ChromoDynamics (QCD) of quarks and gluons on 4D grid of points in space and time
  - A grand challenge in high-performance computing
    - Requires high memory/network bandwidth and computational power
- Computing lattice QCD
  - Monte-Carlo simulations on 4D grid
  - Dominated by solving a system of linear equations of matrixvector multiplication using iterative methods (etc. CG method)
  - Parallelizable by dividing 4D grid into partial grids for each place
    - Boundary exchanges are required between places in each direction





#### Implementation of lattice QCD in X10

- Fully ported from sequential C++ implementation
- Data structure
  - Use Rail class (1D array) for storing 4D arrays of quarks and gluons
- Parallelization
  - Partition 4D grid into places
    - Calculate memory offsets on each place at the initialization
    - Boundary exchanges using asynchronous copy function
- Optimizations
  - Communication optimizations
    - Overlap boundary exchange and bulk computations
  - Hybrid parallelization
    - Places and threads

## **Communication Optimizations**

- Communication overlapping by using "asyncCopy" function
  - "asyncCopy" creates a new thread then copy asynchronously
  - Wait completion of "asyncCopy" by "finish" syntax
- Communication through Put-wise operations
  - Put-wise communication uses one-sided communication while Get-wise communication uses two-sided communication
- Communication is not fully overlapped in the current implementation
  - "finish" requires all the places to synchronize



## Hybrid Parallelization

- Hybrid parallelization on places and threads (activities)
- Parallelization strategies for places
  - (1) Activate places for each parallelizable part of computation
  - (2) Barrier-based synchronization
    - Call "finish" for places at the beginning of CG iteration
  - We adopt (2) since calling "finish" for each parallelizable part of computation causes increase of synchronization overheads
- Parallelization strategies for threads
  - (1) Activate threads for each parallelizable part of computation
  - (2) Clock-based synchronization
    - Call "finish" for threads at the beginning of CG iteration

We adopt (1) since we observed "finish" performs better scalability compared to the clock-based synchronization

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## Evaluation

- Objective
  - Ánalyze parallel efficiency of our lattice QCD in X10
  - Comparison with lattice QCD in MPI
- Measurements
  - Effect of multi-threading
    - Comparison of multi-threaded X10 with OpenMP on a single node
    - Comparison of hybrid parallelization with MPI+OpenMP
  - Scalability on multiple nodes
    - Comparison of our distributed X10 implementation with MPI
    - Measure strong/weak scaling up to 256 places
- Configuration
  - Measure elapsed time of one convergence of CG method
    - Typically 300 to 500 CG iterations
  - Compare native X10 (C++) and MPI C

#### **Experimental Environments**

- IBM BladeCenter HS23 (Use 1 node for multi-threaded performance)
  - CPU: Xeon E5 2680 (2.70GHz, L1=32KB, L2=256KB, L3=20MB, 8 cores) x2 sockets, SMT enabled
  - Memory: 32 GB
  - MPI: MPICH2 1.2.1
  - g++: v4.4.6
  - X10: 2.4.0 trunk r25972 (built with "-Doptimize=true -DNO\_CHECKS=true")
  - Compile option
    - Native X10: -x10rt mpi -O -NO\_CHECKS
    - MPI C: -O2 -finline-functions –fopenmp
- IBM Power 775 (Use up to 13 nodes for scalability study)
  - CPU: Power7 (3.84 GHz, 32 cores), SMT Enabled
  - Memory: 128 GB
  - xIC\_r: v12.1
  - X10: 2.4.0 trunk r26346 (built with "-Doptimize=true -DNO\_CHECKS=true")
  - Compile option
    - Native X10: -x10rt pami -O -NO\_CHECKS
    - MPI C: -O3 –qsmp=omp

## Performance on Single Place

- Multi-thread parallelization (on 1 Place)
  - Create multiple threads (activities) for each parallelizable part of computation
  - Problem size: (x, y, z, t) = (16, 16, 16, 32)
- Results
  - Native X10 with 8 threads exhibits 4.01x speedup over 1 thread
  - Performance of X10 is 71.7% of OpenMP on 8 threads
  - Comparable scalability with OpenMP



#### Performance on Difference Problem Sizes

• Performance on (x,y,z,t) = (8,8,8,16)

Poor scalability on Native X10 (2.18x on 8 threads)



Performance on (x,y,z,t) = (16,16,16,32)

- Good scalability on Native X10 (4.01x on 8 threads)



#### Performance on Difference Problem Sizes

• Performance on (x,y,z,t) = (8,8,8,16)

Poor scalability on Native X10 (2.18x on 8 threads)



Performance on (x,y,z,t) = (16,16,16,32)

- Good scalability on Native X10 (4.01x on 8 threads)



#### Performance Breakdown on Single Place

- Running on Native X10 with multi-threads suffers from significant overhead of
  - Thread activations (20.5% overhead on 8 threads)
  - Thread synchronizations (19.2% overhead on 8 threads)
  - Computation is also slower than that on OpenMP (36.3% slower)



#### **Comparison of Hybrid Parallelization** with MPI + OpenMP

- Hybrid Parallelization ٠
  - Comparison with MPI
- Measurement •
  - Use 1 node (2 sockets of 8 cores, SMT enabled)
  - Vary # Processes and # Threads s.t. (#Processes) x (# Threads) is constant
- Best performance when ٠ (# Processes, # Threads) = (4, 4) in MPI, and (16, 2) in X10
  - 4) in MPI, and (16, 2) in X10
    2 threads per node exhibits best performance
    1 thread per node also exhibits similar performance as 2 threads <sup>1</sup>/<sub>1</sub> 2 threads per node exhibits best
  - 1 thread per node also exhibits



(# Processes) x (# Threads)

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## Comparison with MPI

- Compare the performance of X10 Lattice QCD with our **MPI-based lattice QCD** 
  - Point-to-point communication using MPI\_lsend/lrecv (no barrier synchronizations)



#### Strong Scaling: Comparison with MPI

- Measurement on IBM Power 775 (using up to 13 nodes)
  - Increase #Places up to 256 places (19-20 places / node)
    - Not using hybrid parallelization
  - Problem size: (x, y, z, t) = (32, 32, 32, 64)
- Results
  - 102.8x speedup on 256 places compared to on 1 place
  - MPI exhibits better scalability
    - 2.58x faster on 256 places compared to X10



#### Effect of Communication Optimization

- Comparison of Put-wise and Get-wise communications
  - Put: "at" to source place, then copy data to destination place
  - Get: "at" to destination place, then copy data from source place
  - Apply communication overlapping (in Get-wise communication)
    - Multiple copies in a finish



#### Results:

#### Effect of Communication Optimization

- Comparison of PUT with GET in communication
  - PUT performs better strong scaling
    - Underlying PUT implementation in PAMI uses one-sided communication while GET implementation uses two-sided communication



#### Weak Scaling: Comparison with MPI

- Measurement on IBM Power 775
  - Increase #Places up to 256 places (19-20 places / node)
  - Problem size per Place: 131072 ((x, y, z, t) = (16, 16, 16, 32))
- Results
  - 97.5x speedup on 256 places
  - MPI exhibits better scalability
    - 2.26x on 256 places compares with X10
    - MPI implementation performs more overlapping of communication



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#### Related work

- Peta-scale lattice QCD on a Blue Gene/Q supercomputer [1]
  - Fully overlapping communication and applying node-mapping optimization for BG/Q
- Performance comparison of PGAS with MPI [2]
  - Compare the performance of Co-Array Fortran (CAF) with MPI on micro benchmarks
- Hybrid programming model of PGAS and MPI [3]
  - Hybrid programming of Unified Parallel C (UPC) and MPI, which allows MPI programmers incremental access of a greater amount of memory by aggregating the memory of several nodes into a global address space

[3]: Dinan, J. et al: Hybrid parallel programming with MPI and unified parallel C

<sup>[1]:</sup> Doi, J.: Peta-scale Lattice Quantum Chromodynamics on a Blue Gene/Q supercomputer

<sup>[2]:</sup> Shan, H. et al.: A preliminary evaluation of the hardware acceleration of the Cray Gemini Interconnect for PGAS languages and comparison with MPI

## Conclusion

- Summary
  - Towards highly scalable computing with APGAS programming model
  - Implementation of lattice QCD application in X10
    - Include several optimizations
  - Detailed performance analysis on lattice QCD in X10
    - 102.8x speedup in strong scaling, 97.5x speedup in weak scaling
    - MPI performs 2.26x 2.58x faster, due to the limited communication overlapping in X10
- Future work
  - Further optimizations for lattice QCD in X10
    - Further overlapping by using point-to-point synchronizations
    - Accelerates computational parts using GPUs
  - Performance analysis on supercomputers
    - IBM BG/Q, TSUBAME 2.5

# Source Code of Lattice QCD in X10 and MPI

- Available from the following URL
  - https://svn.code.sourceforge.net/p/x10/code/ applications/trunk/LatticeQCD/

## Backup

## APGAS Programming Model

- PGAS (Partitioned Global Address Space) programming model
  - Global Address Space
    - Every thread sees entire data set
  - Partitioned
    - Global address space is divided to multiple memories
- APGAS programming model
  - Asynchronous PGAS (APGAS)
    - Threads can be dynamically created under programmer control
  - X10 is a language implementing APGAS model
    - New activity (thread) is created dynamically using "async" syntax
    - PGAS memories are called **Places** (Processes)
      - Move to other memory using "at" syntax
    - Threads and places are synchronized by calling "finish" syntax

#### Existing Implementation of Lattice QCD in MPI

- Partition 4D grid into MPI processes
  - Boundary data creation => Boundary exchange => Bulk update
- Computation and communication overlap
  - Overlap Boundary exchange and Boundary/ Bulk update
- Hybrid parallelization
  - MPI + OpenMP

#### Effect of Communication Optimization



#### Hybrid Performance on Multiple

- Hybrid Parallelization on multiple Nodes
- Measurement
  - Use up to 4 nodes
  - (# Places, # Threads) = (32, 2) shows best performance
    - (# Places, # Threads) = (8, 2) per node



#### Performance of Hybrid Parallelization on Single Node

The lower the better

- Hybrid Parallelization
  - Places and Threads
- Measurement
  - Use 1 node (2 sockets of 8 cores, HT enabled)
  - Vary # Places and # Threads from 1 to 32 for each
- Best performance when (# Places, # Threads) = (16, 2)
- Best balance when (# Places) x (# Threads) = 32







	Xeon(Sandy bridge) E5 2680 (2.70GHz, L1=32KB, L2=256KB, L3=20MB, 8 cores, HT ON) x2
	DDR-3 32GB, Red Hat Enterprise Linux Server 6.3 (2.6.32-279.el6.x86_64)
	X10 trunk r25972 (built with "-Doptimize=true -DNO_CHECKS=true")
	g++: 4.4.7
l attion	Compile option for native x10: -x10rt mpi -O -NO_CHECKS
Lauce	

- Time breakdown of Lattice QCD (non-overlapping version) ٠
- Communication overhead causes the performance saturation ٠
  - Communication overhead increases in proportion to the number of nodes
  - Communication ratio increases in proportion to the number of places



**Elapsed Time** 

Xeon(Sandy bridge) E5 2680 (2.70GHz, L1=32KB, L2=256KB, L3=20MB, 8 cores, HT ON) x2 DDR-3 32GB, Red Hat Enterprise Linux Server 6.3 (2.6.32-279.el6.x86 64) X10 trunk r25972 (built with "-Doptimize=true -DNO CHECKS=true") q++: 4.4.7

Compile option for native x10: -x10rt mpi -O -NO CHECKS

- Time breakdown of a part of computation in a single finish (64, 128 places)
  - Significant degradation on 128 places compared to 64 places
  - Similar behavior on each place between using 64 places and 128 places
  - Hypothesis: invocation overhead of "at async" and/or synchronization overhead of "finish"



	Xeon(Sandy bridge) E5 2680 (2.70GHz, L1=32KB, L2=256KB, L3=20MB, 8 cores, HT ON) x2 DDR-3 32GB, Red Hat Enterprise Linux Server 6.3 (2.6.32-279.el6.x86 64)
	X10 trunk r25972 (built with "-Doptimize=true -DNO_CHECKS=true")
L attico	Compile option for native x10: -x10rt mpi -O -NO_CHECKS

- at v/s asyncCopy on data transfer
  - asyncCopy performs 36.2% better when using 2 places (1 place / node)

