

# **Lecture Summary**

Concepts and Models of Parallel and Data-centric Programming

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## **Outline**

- Organization
- 1. Foundations
- 2. Shared Memory
- 3. **GPU Programming**
- 4. Bulk-Synchronous Parallelism
- Message Passing
- 6. Distributed Shared Memory
- 7. Parallel Algorithms
- 8. Parallel I/O
- 9. MapReduce
- 10. Apache Spark





### 1. Foundations

**Cluster Architecture** 

**Convergence of HPC and Big Data** 

**Overview of Parallel Programming Concepts and Models** 

**Amdahl's Law** 



# 2. Shared Memory

**Processes and Threads** 

Threading in C++

**RAII Idiom, Move Semantics** 

**Example: Simple Queue** 

**Mutual Exclusion** 

Race Condition / Data Race

**Condition Variables** 

**Futures** 

Implementation of a Lock

**Peterson Algorithm** 

**Test-and-set Locks** 

**Remarks on implementations** 

**Memory Consistency / Atomicity** 

**Five Patterns of Synchronization** 

Coarse-grained

Fine-grained

**Optimistic** 

Lazy

Lock-free

**Parallel STL** 

**SIMD Programming** 





# 3. GPU Programming

## **Comparison CPU / GPU**

**Data-Parallel Computing** 

## **GPU Application Design Cycle**

**Assess:** Performance Models (Roofline)

Parallelize: Concepts of GPGPU Programming / CUDA

Optimize: Synchronization, Branching, Data Access Patterns

**Deploy:** Compare outcome with expectations

**Application Area: Machine Learning on GPUs** 





# 4. Bulk-Synchronous Parallelism

**From Nodes to Clusters** 

**Communication Primitives** 

**BSP Computer** 

**BSP Programming Model** 

Computation / Communication

Supersteps

**BSP Cost Model** 

**Example: Inner Product** 

**Bulk Library: Data Distribution, Distributed Variables, Coarrays** 





# 5. Message Passing

**Interface Overview** 

**MPI Messages: Content + Envelope** 

Point-to-Point Communication: Send / Receive

**Communicators** 

**MPI Data Types** 

**Collective Communication: Barriers, Reductions, ...** 





# **6. Distributed Shared Memory**

**Distributed Shared Memory** 

**PGAS Motivation** 

**Comparing Shared Memory, Distributed Memory, and PGAS** 

#### **DASH Overview**

**Distributed Data Structures** 

**Data Distribution** 

Algorithms

Tasking





# 7. Parallel Algorithms

**Berkeley DWARFS** 

**Dense Linear Algebra** 

**Sparse Linear Algebra** 

**Monte Carlo Methods** 

**Graph Traversal** 





### 8. Parallel I/O

## I/O Hierarchy

File Systems (GPFS, Lustre, BeeGFS)

#### Parallel I/O Schemes

Centralized, Task-Local, Shared File, Multi-Shared Files

Data Distribution in Parallel Applications

## **False Sharing of Blocks**

#### **Parallel I/O Libraries**

POSIX-I/O, MPI-I/O, HDF5





# 9. MapReduce

**MapReduce Programming Model** 

**Hadoop Ecosystem** 

**Hadoop Distributed File System (HDFS)** 

**Yet Another Resource Negotiator (YARN)** 

Comparison to MPI / PGAS and SQL

**MapReduce Design Patterns** 

**Summarization Patterns** 

Filtering Patterns

Data Organization Patterns





# 10. Apache Spark

**Spark Programming Model** 

**Resilient Distributed Datasets (RDDs)** 

**Job Scheduling and Fault Tolerance** 

**Streaming and Applications** 

**Comparison to MapReduce** 

**Comparison to Distributed Shared Memory** 





# **Exemplary Oral Exam Questions**





# Examples / 1

#### **Foundations**

What does Amdahl's Law formulate?

## **Shared Memory**

Explain the semantics of a Future as realized by std::async.

Which Patterns of Synchronization do you know? Explain pattern X.

#### **Accelerators**

Explain the differences in the architecture of a GPU and a CPU.

## **Distributed Memory**

Explain the concept of a Superstep in BSP.

Explain how you would implement ...





# Examples / 2

## **Distributed Shared Memory**

What does PGAS stand for? Explain the concept.

#### Parallel I/O

Which schema of Parallel I/O do you know? Explain schema X.

## **MapReduce and Spark**

How does MapReduce differ from MPI or OpenMP? Explain aspect X.

Explain NameNode and DataNode in in Apache Hadoop.

What does the given code do?





# **Questions?**



