## Practical Parallel and Concurrent Programming Course Overview

http://ppcp.codeplex.com/

These Course Materials Brought to You By

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  - Research in Software Engineering (RiSE)
- University of Utah
  - Computer Science
- With support from
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- The headshot of the alpaca used throughout the lectures is licensed under
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  - <u>http://en.wikipedia.org/wiki/File:Alpaca\_headshot.jpg</u>

## Overview

- Context
  - Trends
  - Applications
  - System and environment
- Concepts
- Units, Materials and Tools

## **Technology Trends**

- Increasing *parallelism* in a "computer"
  - multi-core CPU
  - graphical processing unit (GPU)
  - cloud computing
- Increasing *disk capacity* 
  - we are awash in interesting *data*
  - data-intensive problems require *parallel processing*

## Technology Trends (2)

- Increasing networks and network bandwidth
  - wireless, wimax, 3G, ...
  - collection/delivery of massive datasets, plus
  - real-time responsiveness to asynchronous events
- Increasing number and variety of computers
  - smaller and smaller, and cheaper to build
  - generating streams of asynchronous events

## Parallelism and Concurrrency: System and Environment

- Parallelism: exploit system resources to speed up computation
- Concurrency: respond quickly/properly to events
  - from the environment
  - from other parts of system



## **Application Areas**

- Entertainment/games
- Finance
- Science
- Modeling of real-world
- Health care
- Telecommunication
- Data processing

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Discuss application areas in context of Trends Parallelism/Concurrency System/Environment

## Practical Parallel and Concurrent Programming (P<u>P&C</u>P)

P8.C	<u>P</u> arallelism	<u>C</u> oncurrency
<u>P</u> erformance	Speedup	Responsiveness
<u>Correctness</u>	Atomicity, Determinism, Deadlock, Livelock, Linearizability, Data races,	

## Overview

- Context
- Concepts
  - 1. Multi-core computer
  - 2. Speedup
  - 3. Responsiveness
  - 4. Correctness
- Units, Materials and Tools

## Concept #1: System = Multi-core Hardware

## What is Today's Multi-core?

- What is the architecture?
- What are its properties?
  - Computation
  - Communication
    - Delivery guarantees
    - Latency
    - Throughput
  - Consistency
  - Caching

## A simple microprocessor model ~ 1985



- Single h/w thread
- Instructions execute one after the other
- Memory access time
  ~ clock cycle time

## FastFwd Two Decades (circa 2005): Power Hungry Superscalar with Caches





- Dynamic out-oforder
- Pipelined memory accesses
- Speculation



#### Power wall + ILP wall + memory wall = **BRICK WALL**

• Power wall

- we can't clock processors faster

- Memory wall
  - many workload's performance is dominated by memory access times
- Instruction-level Parallelism (ILP) wall
  - we can't find extra work to keep functional units busy while waiting for memory accesses

## Multi-core h/w – common L2



## Multi-core h/w – additional L3



## SMP multiprocessor



## NUMA multiprocessor



## Three kinds of parallel hardware

- Multi-threaded cores
  - Increase utilization of a core or memory b/w
  - Peak ops/cycle fixed
- Multiple cores
  - Increase ops/cycle
  - Don't necessarily scale caches and off-chip resources proportionately
- Multi-processor machines
  - Increase ops/cycle
  - Often scale cache & memory capacities and b/w proportionately

## Concept #2: Speedup

## Speedup Concerns

- 1. Focus on the longest running parts of the program first
  - be realistic about possible speedups
  - *different parts* may need to be parallelised with *different techniques*
- 2. Understand the different resource requirements of a program
  - computation, communication, and locality
- 3. Consider how data accesses interact with the memory system:
  - will the computation done on additional cores pay for the data to be brought to them?

## **Abstractions for Speedup**

- Imperative parallelism
  - Parallel.For/ForEach
  - Lightweight *tasks* (not threads)
- Functional parallelism
  - Functional programming (F#)
  - Parallel Language Integrated Queries (PLINQ)
  - Array parallel algorithms (Accelerator)
- Concurrent components
  - for example, data structures that can efficiently accommodate many clients

## Concept #3: Responsiveness

## **Responsiveness Concerns**

- 1. Quick reaction to conditions over event streams
- 2. Handle multiple tasks at the same time
- 3. Don't block essential tasks unnecessarily

#### 4. Coordinate responses to requests

## Abstractions for Responsiveness

- Asynchronous computation
  - lightweight tasks (not threads)
  - F#'s async
- Application-specific scheduling
- Complex event handling
  - IObservable
  - Reactive extensions (RX) to .NET
- Actors/agents

## Concept #4: Correctness

## **Correctness Concerns**

- All those we have for sequential code
  - Assertions, invariants, contracts,
  - buffer overflows, null reference,

- Plus those related to parallelism/concurrency
  - Data races, deadlocks, livelocks, ...
  - Memory coherence/consistency

## **Correctness Abstractions**

- Atomicity
- Determinism
- Linearizability
- Serializibility
- Temporal logic

## Outline

- Context
- Concepts
- Units, Materials and Tools

## Units 1 – 4

- Unit 1: Imperative Data Parallelism
  - Data-intensive parallel programming (Parallel.For)
  - Concurrent Programming with Tasks
- Unit 2: Shared Memory
  - Data Races and Locks
  - Parallel Patterns
- Unit 3: Concurrent Components
  - Thread-Safety Concepts (Atomicity, Linearizability)
  - Modularity (Specification vs. Implementation)
- Unit 4: Functional Data Parallelism
  - Parallel Queries with PLINQ
  - Functional Parallel Programming with F#

## Units 5 – 8

- Unit 5: Scheduling and Synchronization
  - From {tasks, DAGs} to {threads, processors}
  - Work-stealing
- Unit 6: Interactive/Reactive Systems
  - External vs. internal concurrency
  - Event-based programming
- Unit 7: Message Passing

- Conventional MPI-style programming

- Unit 8: Advanced Topics
  - Parallelization, Transactions, Revisions

## **Unit Dependences**



## IDE, Libraries, Tools, Samples, Book

- Visual Studio 2010
  - C# and F# languages
  - .NET 4: Libraries for multi-core parallelism and concurrency
- Other Libraries
  - <u>Accelerator</u>
  - Code Contracts
  - <u>Rx: Reactive Extensions for</u>
    <u>.NET</u>

#### • <u>Alpaca</u>

- A lovely parallelism and concurrency analyzer
- <u>Source code</u>
- Code for all units, with Alpaca tests
- Parallel Extensions Samples
- Free book: <u>Parallel</u>
  <u>Programming with Microsoft</u>
  <u>.NET</u>



# .NET 4 Libraries for Parallelism and Concurrency



# **Alpaca**: A lovely parallelism and concurrency analyzer





- Attribute-based testing, for performance and correctness concepts
- [UnitTestMethod]
  - simply run this method normally, and report failed assertions or uncaught exceptions.
- [DataRaceTestMethod]
  - Run a few schedules (using CHESS tool) and detect data races.
- [ScheduleTestMethod]
  - Run all possible schedules of this method (with at most two preemptions) using the CHESS tool.
- [PerformanceTestMethod]
  - Like UnitTestMethod, but collect & graphically display execution timeline (showing intervals of interest)

## Why Alpaca?

- Improve the learning experience for concurrent and parallel programming
- Vehicle for including instantly runnable sample code (incl. bugs)
- Unit tests: A quick way to validate / invalidate assumptions, about correctness or performance
- Provide simple graphical front end for various tools

## PPCP – Unit X - \*.sln

- Each Unit has a VS2010 Solution
  - supporting
    examples
  - Alpaca Project



## Parallel Extensions Samples

- http://code.msdn.microsoft.com/ParExtSamples
- Over 15 Samples
  - applications illustrating use of .NET 4
  - some included in courseware



ParallelExtensionsExtras.csproj
 MarallelExtensionsExtras.csproj
 MarallelAlg
 Properties
 References
 Coordinat
 Drawing
 Extensions
 ParallelAlg

References
 CoordinationDataStructures
 Drawing
 Extensions
 ParallelAlgorithms
 Partitioners

ParallelExtensionsExtras

- TaskSchedulers
  - 📋 Utils

## Sample: Ray Tracer





Animated, ray traced bouncing balls. Sequential and parallel implementations are provided, as is a special parallel implementation that colors the animated image based on which thread was used to calculate which regions.

## Sample: Image Morphing





#### Implements a <u>morphing</u> algorithm between two images. Parallelization is done using the Parallel class.

## Sample: N-Body Simulation





Implements a classic n-body simulation using C# and WPF for the UI and using F# for the core computation. Parallelism is achieved using the Parallel class.

### Free book:

### **Parallel Programming with Microsoft .NET**



Design Patterns for Decomposition and Coordination on Multicore Architectures

Colin Campbell, Ralph Johnson, Ade Miller and Stephen Toub