## PERFORMANCE MONITORING OF ARCHITECTURALLY DIVERSE SYSTEMS

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#### We want apps that...

#### Run correctly

- Do not dead-lock
- Meet hard real-time deadlines
- Run fast
  - High-throughput / low latency
  - Low rate of soft deadline misses

#### Infrastructure should help us debug when it runs incorrectly or slow

### **Diverse Computing**

- Increasingly common in HPEC systems
- e.g. Mercury, XtremeData, DRC, Nallatech, ClearSpeed





### **Diverse Computing**

#### App deployed using all four components



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#### **Diverse Computing**



#### **Benefits and Challenges**

- + Large performance gains realized
- + Power efficient compared to CMP alone
- Requires knowledge of individual architectures/languages
- Components operate independently
  - Distributed system
  - Separate memories and clocks

### Motivation

Tool support for these systems insufficient

- Many architectures lack tools for monitoring and validation
- Tools for different architectures not integrated
- Ad hoc solutions

# Solution: Runtime performance monitoring and validation for diverse systems!

### Outline

#### Introduction

- Runtime performance monitoring
- Frame monitoring
- User-guidance

#### **Stream Programming**

- Natural fit for diverse HPEC systems
- Dataflow model
  - Composed of blocks and edges
  - Blocks compute concurrently
  - Data flows along edges
- Languages: StreamIt, Streams-C, X



#### **Mapping Process**



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#### **Mapping Process**



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### **Existing Performance Tools**

Programming model	Strategy	Tools / Environments
Shared Memory	Execution profiling	gprof, Valgrind, PAPI
Message Passing	Execution profiling, message logging	TAU, mpiP, PARAVER
Stream Programming	Simulation	StreamIt [MIT], StreamC [Stanford], Streams-C [LANL], Auto-Pipe [WUSTL]

#### **Traditional Performance Monitoring**

- Limitations for diverse systems
  - No universal PC or architecture
  - No shared memory
  - Different clocks
  - Communication latency and bandwidth

#### Diverse System Performance Monitoring

- Simulation is a useful first step but:
  - Models can abstract away system details
  - Too slow for large datasets
  - HPEC applications growing in complexity
- Need to monitor deployed, running app
  - Measure <u>actual</u> performance of system
  - Validate performance of *large, real-world* datasets

### Goals

Report more than just aggregate statistics

- Capture rare events
- Quantify measurement impact where possible
  - Overhead due to sampling, communication, etc.
- Measure runtime performance efficiently
  - Low overhead
  - High accuracy
- Validate performance of real datasets
- Increase developer productivity

### **Monitoring Strategy**

- Monitor edges / queues
- Find bottlenecks in app
  - Change over time?
  - Computation or communication?
- Measure latency between two points



#### Implementation

- Interconnects are a precious resource
- Uses same interconnects as application
- Stay below bandwidth constraint → Keep perturbation low



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### **Reducing Impact**

- Understand measurement perturbation
- Dedicate compute resources when possible
- Aggressively reduce amount of performance meta-data stored and transmitted
  - Utilize compression in both time resolution and fidelity of data values
  - Use knowledge from user to specify their performance expectations / measurements

#### **Dedicating Resources**

Use CMP core as the server monitor

- Monitor other cores for performance information
- Process data from agents (e.g. FPGA, GPU)
- Combine hardware and software information for global view
  - Use logical clocks to synchronize events

Dedicate unused FPGA area to monitoring

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### **Temporal Monitoring Continuum**



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- A frame summarizes performance over a period of the execution
- Maintain some temporal information
  - Capture system performance anomalies

#### Time

- A frame summarizes performance over a period of the execution
- Maintain some temporal information
  - Capture system performance anomalies



- A frame summarizes performance over a period of the execution
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- A frame summarizes performance over a period of the execution
- Maintain some temporal information
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#### **Properties of Frames**

- Each frame reports one performance metric
- Frame size can be dynamic
  - Dynamic bandwidth budget
  - Low variance data / application phases
  - Trade temporal granularity for lower perturbation
- Frames from different agents will likely be unsynchronized and different sizes
- Monitor server presents user with consistent global view of performance

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### **User-guided** Collection

#### • Why?

- Related work: Performance Assertions for Mobile Devices [Lenecevicius'06]
  - Validates user performance assertions on multithreaded embedded CPU
- Our system enables validation of performance expectations across diverse architectures

### **User-Guided Collection**

#### 1. Measurement

- User specifies a set of "taps" for agent
- Taps can be off an edge or an input queue
- Agent then records events on each tap
- Supported measurements for a tap:
  - Average value + standard deviation
  - Min or max value
  - Histogram of values
  - Outliers (based on parameter)
- Basic arithmetic and logical operators on taps:
  - Arithmetic: add, subtract, multiply, divide
  - Logic: and, or, not

#### **Direct Measurement Example**

#### What is the throughput of block A?



#### **Direct Measurement Example**

What is throughput of block A when it is not data starved?



#### **Direct Measurement Example**

- What is the throughput of block A when
  - not starved for data and
  - no downstream congestion



### **User-Guided Collection (2)**

#### 1. Measurement

- Set of "taps" for agent to count, histogram, or perform simple logical operations on
- Taps can be an edge or an input queue

#### 2. Performance assertion

- User describes their performance expectations of an application as assertions
- Runtime monitor validates these assertions by collecting measurements and evaluating logical expressions
  - Arithmetic operators: +, -, \*, /
  - Logical operators: and, or, not
  - Annotations: t, L

### Logic of Constraints

throughput: "at least 100 A.*Input* events will be produced in any period of 1001 time units"

□  $t(A.Input[i + 100]) - t(A.Input[i]) \le 1001$ 

- Iatency: "A.Output is generated no more than 125 time units after A.Input"
  t(A.Output[i]) t(A.Input[i]) ≤ 125
- queue bound: "A.InQueue never exceeds 100 elements"
  - $\Box L(A.InQueue[i]) \le 100$

### **Abstraction Hierarchy**

- Runtime measurements
  - Query CMP/GPU performance counters
  - Custom FPGA counters
- Local assertions
  - Can be evaluated within a single agent
  - No need for communication with other agents/system monitor
- Global assertions
  - Requires aggregating results from more than one agent on different compute resources

#### **Constraint Properties**

- Some assertions impose prohibitive memory requirements
  - Either disallow these or warn user of large monitoring impact
- Other assertions are compute intensive
- A few are both!
- Fortunately, much can be gained from simple queries
  - Input queue lengths over time

#### Status

- FPGA Agent mostly operational
  - Monitor only, no user assertions yet
- Initial target application is the BLAST biosequence analysis application
  - CPU + FPGA hardware platform
  - [Jacob, et al. TRETS '08]
- Next target application is computational finance
  - CPU + GPU + FPGA
  - Performance significantly worse than models

### **Conclusions & Future Work**

- Runtime performance monitoring enables
  - More efficient development
  - Better testing for real-time systems

- Support correctness assertions
- Investigate ways to best present results to developer