#### Automatic Trace-Based Parallelization of Recursive Programs

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# Outline

- Motivation
- Traces
- Execution Model
- Challenges of Using Traces
- Experimental Evaluation
- Conclusion

# Motivation

- Gap exists between hardware and software
- Hardware
  - Majority of computer chips contain multiple cores
  - Athlon X2, Core 2 Duo, Power5/6, Cell, Niagara
- Software
  - Software is not utilizing hardware
  - Writing parallel software is difficult
- Bridging the gap is important

# **Automatic Parallelization**

- Traditional compile time
  - Perform analysis at compile time
  - Divide program based on analysis
  - Limited success
- Runtime
  - New approach to automatic parallelization is needed
  - Combine analysis with runtime information
  - What information to use?
- Trace-Based
  - Our solution is to use traces

## **Trace Definition**

- A trace is a frequently executed sequence of unique basic blocks or instructions
- Identified by a trace collection system at runtime

```
public static int foo() {
    int a=0;
    for (int i=0;i<n;i++)
        a+=i;
    return a;
}</pre>
```



#### **Benefits of Traces**

- Source code is not required
- Granularity of parallelism can vary
- Traces simplify control flow and analysis
- Traces are simple to identify









# Grouping of Traces

Problem:

Traces have to be grouped to keep overhead small

#### Criteria:

A trace and its most likely successor should be grouped together

#### Solution:

A strongly connected component, which is a graph that contains traces and edges between them such that paths exist between all trace pairs

Works well for iteration when everything scheduled at beginning



SCC

# Grouping of Traces

Problem:

Our previous approach required scheduling at the start of an SCC, which does not work well for recursion because information regarding what to execute becomes available over time.

Criteria:

Divide the SCC into separate tasks that can be scheduled separately over time.

```
void f(int n) {
    if (n>=1) {
        f(n-1);
        f(n-1);
    }
    return;
}
```



# **Edge Categorization**

Three Part Solution:

- 1. Categorize edges.
- Forward edges are from forward control flow (including all returns)
- Bacward edges are from backward control flow
- Indirect edges are from connection between calls and subsequent instructions
  - show a one to one relationship



### **Task Formation**

2. Start tasks at targets of backward edges and end tasks at sources of backward edges that are not sources of indirect edges.



#### Execution

3. Schedule the tasks dynamically.



# Code Hoisting



May need to hoist code to have parallel execution

# **Code Hoisting**

Hoist the start of a new task respecting dependences

Hoisted Code

Execution



**Extraction and Packaging** 



Create two versions and allow transitioning between them

# Scheduling

Queue scheduling based on level in task hierarchy and what a task is waiting for



#### Dependences

- Hardware approach speculation
  - Ordered and nested transactions
  - Task = Transaction
- Software approach inspector/executor
  - Identify potential access patterns
  - Generate and run code to traverse data structures
  - Perform sequential execution if conflicting accesses between tasks exist
- Currenty assessing the approaches

### **Experimental Evaluation**

- Prototype in the Jikes RVM
- Dell PowerEdge 6600
  - Four 1.6GHz Pentium 4 Xeons
  - 2GB of ECC DDR RAM
- Jolden benchmark suite
  - bisort, health, perimeter, treeadd, tsp, and voronoi
  - Recursive
  - No dependences
- Measurement
  - Speedup 1 and 4 processors
  - Offline trace collection system
  - No handling of potential dependences

## **Preliminary Results**



## Conclusion

- Explore trace-based parallelization
- Defined an execution model
- Built a prototype
- Evaluated the performance on several recursive benchmarks
- Performance is promising

#### Future Work

- Deal more with dependences
- Examine extraction and packaging aproaches
- Measure benefit for other benchmarks
- Online trace collection system
- Add more features to the prototype system

#### Multiple Tasks in SCC



# **Edge Categorization**

#### Three types of edges

- Backward edges point to starts of tasks
  - From call and if/jump instructions with earlier targets
- Forward edges are regular control flow
- Indirect edges indicate one to one relationship
  - From call instruction with backward edge to instruction after the call in code order
  - Want to keep start and end on the same task
- Three types of task items
  - Task start
    - Identified by all backward edges
  - Task end
    - When no more instructions in code order
    - When source of backward edge has no indirect edges
  - Task fork
    - Edges to task starts are turned into forks
    - Control goes to target after forked task (indirect or not)
    - Only forks have edges between tasks (no return edges)