# Multi2Sim 4.1

## Multi-Architecture ISA-Level Simulation of OpenCL

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## Outline

Introduction Simulation methodology

#### Part 1 - Simulation of an x86 CPU

Emulation Timing simulation Memory hierarchy Visualization tool OpenCL on the host

#### Part 2 - Simulation of a Southern Islands GPU

OpenCL on the device The Southern Islands ISA The GPU architecture Southern Islands simulation Validation results Improving heterogeneity

Concluding remarks

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## Introduction

Getting Started

Follow our demos!

#### • User accounts for demos

\$ ssh iwocl<N>@fusion1.ece.neu.edu -X
Password: iwocl2013

#### Installation of Multi2Sim

\$	wget http://www.multi2sim.org/files/multi2sim-4.1.tar.gz
\$	tar -xzf multi2sim-4.1.tar.gz
\$	cd multi2sim-4.1
\$	./configure && make

@ www. <b>n</b>	nulti2sim.org						
Home	Benchmarks	Development	Tools	Mailing Li	ist	Forum	
<b>M</b> A CI	ulti2 PU-GPU Si	2Sim	r		Col and So	mpletely Fr d Open urce	ee
Hete Proje	erogeneou ect Features Download Rev. 1516, Ma	IS Computil > Multi2Sim 4.1 r. 27th, 2013	ng		Mult code unde avai dow mod	i2Sim's source is distributed er GPL-2 license lable for free nload and lification.	,
	Multi2Sim Rev. 311, Mar.	<mark>Guide</mark> 27th, 2013			· ·		

## Introduction

#### **First Execution**

#### • Source code

Native execution

```
    Execution on Multi2Sim
```

```
$ test-args hello there $ m2s test-args hello there
Number of arguments: 4
    arg[0] = 'test-args'
    arg[1] = 'hello'
    arg[2] = 'there'
    arg[2] = 'there'

Simulator message in stderr >
Number of arguments: 4
    arg[0] = 'test-args'
    arg[1] = 'hello'
    arg[2] = 'there'

Simulator statistics >
```

Demo 1 -

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## Introduction

Simulator Input/Output Files

• Example of INI file format

```
; This is a comment.
[ Section 0 ]
Color = Red
Height = 40
[ OtherSection ]
Variable = Value
```

#### Multi2Sim uses INI file for

- Configuration files.
- Output statistics.
- Statistic summary in standard error output.

## Simulation Methodology

Application-Only vs. Full-System





#### Full-system simulation

An entire OS runs on top of the simulator. The simulator models the entire ISA, and virtualizes native hardware devices, similar to a virtual machine. Very accurate simulations, but extremely slow.

#### Application-only simulation

Only an application runs on top of the simulator. The simulator implements a subset of the ISA, and needs to virtualize the system call interface (ABI). Multi2Sim falls in this category.

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## Simulation Methodology

#### Four-Stage Simulation Process



- Modular implementation
  - Four clearly different software modules per architecture (x86, MIPS, ...)
  - Each module has a standard interface for stand-alone execution, or interaction with other modules.

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## Simulation Methodology

**Current Architecture Support** 

	Disasm.	Emulation	Timing Simulation	Graphic Pipelines
ARM	X	In progress	-	-
MIPS	X	-	-	-
x86	X	X	X	X
AMD Evergreen	X	X	X	X
AMD Southern Islands	X	X	X	X
NVIDIA Fermi	X	In progress	-	-

#### • Available in Multi2Sim 4.1

- Evergreen, Southern Islands, and x86 fully supported.
- Three other CPU/GPU architectures in progress.
- This tutorial will focus on x86 and Southern Islands.

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# Part 1 Simulation of an x86 CPU

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## Emulation of an x86 CPU

#### Program Loading

#### Initialization of a process state



#### 1) Parse ELF executable

- Read ELF sections and symbols.
- Initialize code and data.

#### 2) Initialize stack

- Program headers.
- Arguments.
- Environment variables.

#### 3) Initialize registers

- Program entry  $\rightarrow eip$
- Stack pointer  $\rightarrow esp$

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## Emulation of an x86 CPU

#### **Emulation Loop**



#### • Emulation of x86 instructions

- Update x86 registers.
- Update memory map if needed.
- Example: add [bp+16], 0x5

#### • Emulation of Linux system calls

- Analyze system call code and arguments.
- Update memory map.
- Update register *eax* with return value.
- Example: read(fd, buf, count)

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## Timing Simulation of an x86 CPU

#### Superscalar Processor



#### • Superscalar x86 pipelines

- 6-stage pipeline with configurable latencies.
- Supported features include speculative execution, branch prediction, microinstruction generation, trace caches, out-of-order execution, ...
- Modeled structures include fetch queues, reorder buffer, load-store queues, register files, register mapping tables, ...

## Timing Simulation of an x86 CPU

Multithreaded and Multicore Processors



#### Multithreading

- Replicated superscalar pipelines with partially shared resources.
- Fine-grain, coarse-grain, and simultaneous multithreading.

#### • Multicore

- Fully replicated superscalar pipelines, communicating through the memory hierarchy.
- Parallel architectures can run multiple programs concurrently, or one program spawning child threads (using OpenMP, *pthread*, etc.)

Demo 3

Configuration

#### Flexible hierarchies

- Any number of caches organized in any number of levels.
- Cache levels connected through default cross-bar interconnects, or complex custom interconnect configurations.
- Each architecture undergoing a timing simulation specifies its own entry point (cache memory) in the memory hierarchy, for data or instructions.
- Cache coherence is guaranteed with an implementation of the 5-state MOESI protocol.

**Configuration Examples** 

## Example 1

Three CPU cores with private L1 caches, two L2 caches, and default cross-bar based interconnects. Cache L2-0 serves physical address range [0, 7ff...ff], and cache L2-1 serves [80...00, ff...ff].



Demo 4

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**Configuration Examples** 

## Example 2

Four CPU cores with private L1 data caches, L1 instruction caches and 12 caches shared every 2 cores (serving the whole address space), and four main memory modules, connected with a custom network on a ring topology. 



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**Configuration Examples** 

## Example 3

Ring connection between four switches associated with end-nodes with routing tables calculated automatically based on shortest paths. The resulting routing algorithm can contain cycles, potentially leading to routing deadlocks at runtime.



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**Configuration Examples** 

## Example 4

Ring connection between for switches associated with end nodes, where a routing cycle has been removed by adding an additional virtual channel.



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## **Pipeline Visualization Tool**

**Pipeline Diagrams** 



- Cycle bar on main window for navigation.
- Panel on main window shows software contexts mapped to hardware cores.
- Clicking on the *Detail* button opens a secondary window with a pipeline diagram.

x86 GPU										
Core-0	•									
ctx-1000	😣 🖨 🗊 Core-0									
			167303	167304	167305	167306	167307	167308	167309	167310
		load ebx/ea [0xbffef854,4]	I I	l I	I.	I I	WB	СО		
areas CDU	test ebx, ebx	and zps,cf,of/ebx,ebx	DI	DI	DI	DI	I.	WB	CO	
	jne 805a288	branch -/zps	DI	DI	DI	DI	DI	I	WB	CO
a a	xor edx, edx	xor edx,zps,cf,of/edx,edx	WB	WB	WB	WB	WB	WB	Squash	
	mov eax, edx	move eax/edx	WB	WB	WB	WB	WB	WB	Squash	
	pop ebx	effaddr aux/esp	WB	WB	WB	WB	WB	WB	Squash	
		load ebx/aux [0xbffef840,4	I	1	1	I. I.	I	I	Squash	
		add esp/esp	WB	WB	WB	WB	WB	WB	Squash	
	pop ebp	effaddr aux/esp	FE	FE	DEC	DI	1	1	Squash	
		load ebp/aux [0xbffef844,4	FE	FE	DEC	DI	DI	DI	Squash	

## **Pipeline Visualization Tool**

#### Memory Hierarchy

- Panel on main window shows how memory accesses traverse the memory hierarchy.
- Clicking on a *Detail* button opens a secondary window with the cache memory representation.
- Each row is a set, each column is a way.
- Each cell shows the tag and state (color) of a cache block.
- Additional columns show the number of sharers and in-flight accesses.

Memory Hier

cpu-l1-0

Deta

Demo 5

	cpu-l1-0	0	0				1				
	0	0x55800 (E)	-	-	0x11000 (E)	-					
	1	0x56c40 (E)	-		0x2840 (M)	-					
	2	0x0 (I)	-	+1	0x0 (I)	-	+				
	3	0x30c0 (M)	-	-	0x560c0 (E)	-					
	4	0x2900 (E)	-	-	0x11100 (E)	-					
	5	0x3140 (S)	-		0x56140 (E)	7					
	6	0x55980 (E)	-	-	0x56180 (E)	-					
	7	0x561c0 (E)	-		0x29c0 (M)	-					
	8	0x2a00 (M)	-	-	0x56200 (E)	-					
	9	0x64240 (E)	-	-	0x56240 (E)						
	10	0x2e80 (M)	-	-	0x64280 (E)	-					
	11	0x642c0 (E)	-	-	0x1c2c0 (E)						
У	12	0x64300 (E)	-	-	0x3c700 (S)	-					
	13	0x50f40 (S)	-	-	0x64340 (E)	-					
	14	0x50f80 (S)	-	-	0x64380 (E)	-					
	15	0x1afc0 (E)	-	-	0x643c0 (E)	-					

**Execution Framework** 

- Multi2Sim 4.1 includes a **new execution framework for OpenCL**, developed in collaboration with University of Toronto.
- The new framework is a more accurate analogy to a native execution, and is fully **AMD-compliant**.
- When working with x86 kernel binaries, the OpenCL runtime can perform both **native** and **simulated** execution correctly.
- When run natively, an OpenCL call to *clGetDeviceIDs* returns only the x86 device.
- When run on Multi2Sim, *clGetDeviceIDs* returns **one device per** supported architecture: x86, Evergreen, and Southern Islands devices (more to be added).

**Execution Framework** 

- The following slides show the modular organization of the OpenCL execution framework, based on 4 software/hardware entities.
- In each case, we compare **native execution (left)** with **simulated execution (right)**.



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The OpenCL CPU Host Program

#### Native

An x86 OpenCL host program performs an OpenCL API call.

Multi2Sim Exact same scenario.



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The OpenCL Runtime Library

#### Native

AMD's OpenCL runtime library handles the call, and communicates with the driver through system calls *ioctl*, *read*, *write*, etc. These are referred to as ABI calls.

#### Multi2Sim

Multi2Sim's OpenCL runtime library, running with guest code, transparently intercepts the call. It communicates with the Multi2Sim driver using system calls with codes not reserved in Linux.



The OpenCL Device Driver

#### Native

The AMD Catalyst driver (kernel module) handles the ABI call and communicates with the GPU through the PCIe bus.

#### Multi2Sim

An OpenCL driver module (Multi2Sim code) intercepts the ABI call and communicates with the GPU emulator.



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The GPU Emulator

#### Native

The command processor in the GPU handles the messages received from the driver.

#### Multi2Sim

The GPU emulator updates its internal state based on the message received from the driver.



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Transferring Control

#### Beginning execution on the GPU

 The key OpenCL call that effectively triggers GPU execution is clEnqueueNDRangeKernel.

#### Order of events

- The **host program** performs API call *clEnqueueNDRangeKernel*.
- The **runtime** intercepts the call, and enqueues a new task in an OpenCL command queue object. A user-level thread associated with the command queue eventually processes the command, performing a *LaunchKernel* ABI call.
- The **driver** intercepts the ABI call, reads ND-Range parameters, and launches the GPU emulator.
- The **GPU emulator** enters a simulation loop until the ND-Range completes.

## Need a break?



## Part 2

# Simulation of a Southern Islands GPU

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## **OpenCL** on the Device

Execution Model

#### Execution components

- Work-items execute multiple instances of the same kernel code.
- Work-groups are sets of work-items that can synchronize and communicate efficiently.
- The ND-Range is composed by all work-groups, not communicating with each other and executing in any order.



## **OpenCL** on the Device

**Execution Model** 

#### Software-hardware mapping

- When the kernel is launched by the Southern Islands driver, the OpenCL
   ND-Range is mapped to the compute device (Fig. a).
- The **work-groups** are mapped to the **compute units** (Fig. b).
- The work-items are executed by the SIMD lanes (Fig. c).
- This is a simplification of the GPU architecture. The following slides show a more detailed structure of a Southern Islands compute unit.



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**Vector Addition Source** 

```
__kernel void vector_add(
       __read_only __global int *src1,
        __read_only __global int *src2,
        __write_only __global int *dst)
{
        int id = get_global_id(0);
       dst[id] = src1[id] + src2[id];
}
```

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#### Wavefront

- Up to 64 OpenCL work-item (software threads) are combined into a single hardware thread called a wavefront
- A wavefront executes on a SIMD unit (single PC, different data per work-item)
  - An **execution mask** is used to mask results of inactive work-items



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#### Wavefront – Scalar Opportunities

- Sometimes all work-items in a wavefront will execute an instruction using the same data
  - Loading the base address of a buffer
  - Incrementing/evaluating loop counters
  - Loading constant values)
- To optimize for these scenarios, AMD separates scalar instructions from vector instructions in their ISA
  - Scalar instructions execute on a new hardware unit called the scalar unit



**Disassembly for Vector Addition Kernel** 

```
s_buffer_load_dword s0, s[4:7], 0x04
                                                        // 0000000: C2000504
s buffer load dword s1, s[4:7], 0x18
                                                        // 0000004: C2008518
s buffer load dword s4, s[8:11], 0x00
                                                        // 0000008: C2020900
s buffer load dword s5, s[8:11], 0x04
                                                        // 000000C: C2028904
s buffer load dword s6, s[8:11], 0x08
                                                        // 0000010: C2030908
s load dwordx4 s[8:11], s[2:3], 0x58
                                                        // 0000014: C0840358
s load dwordx4 s[16:19], s[2:3], 0x60
                                                        // 0000018: C0880360
s_load_dwordx4 s[20:23], s[2:3], 0x50
                                                        // 000001C: C08A0350
s waitcnt lgkmcnt(0)
                                                        // 0000020: BF8C007F
s min u32 s0, s0, 0x0000ffff
                                                        // 0000024: 8380FF00 0000FFFF
v_mov_b32 v1, s0
                                                        // 000002C: 7E020200
v mul i32 i24 v1, s12, v1
                                                        // 0000030: 1202020C
v_add_i32 v0, vcc, v0, v1
                                                        // 0000034: 4A000300
v add i32 v0, vcc, s1, v0
                                                        // 0000038: 4A000001
v_lshlrev_b32 v0, 2, v0
                                                        // 000003C: 3400082
v add i32 v1, vcc, s4, v0
                                                        // 0000040: 4A020004
v add i32 v2, vcc, s5, v0
                                                        // 0000044: 4A040005
v add i32 v0, vcc, s6, v0
                                                        // 0000048: 4A000006
tbuffer load format x v1, v1, s[8:11], 0 offen format:
   [BUF_DATA_FORMAT_32, BUF_NUM_FORMAT_FLOAT]
                                                        // 000004C: EBA01000 80020101
tbuffer load format x v2, v2, s[16:19], 0 offen format:
    [BUF_DATA_FORMAT_32, BUF_NUM_FORMAT_FLOAT]
                                                        // 00000054: EBA01000 80040202
s waitcnt
                                                        // 000005C: BF8C1F70
             vmcnt(0)
v add i32
             v1, vcc, v1, v2
                                                        // 0000060: 4A020501
tbuffer store format x v1, v0, s[20:23], 0 offen format:
    [BUF DATA FORMAT 32, BUF NUM FORMAT FLOAT]
                                                        // 0000064: EBA41000 80050100
s_endpgm
                                                        // 000006C: BF810000
```

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#### **Instruction Set Features**

- AMD 6000-series GPUs (Northern Islands) had 1 SIMD with 16 4-way VLIW lanes per compute unit
  - 64 lanes total per compute unit
- AMD 7000-series GPUs (Southern Islands) have 4 SIMDs, each with 16-lanes, per compute unit
  - Still 64 lanes total per compute unit

#### **Instruction Set Features**

- Each compute unit has 4 **wavefront pools** (our term) where allocated wavefronts reside
  - Each wavefront pool is associated with one SIMD
- Each cycle, wavefronts from one wavefront pool are considered
  - One instruction from up to 5 wavefronts can be issued per datapath
  - One instruction can be issued per datapath

#### **Instruction Set Features**

- Simulated datapaths are:
  - Vector ALU (SIMD)
  - Vector memory (global memory)
  - Scalar unit (ALU and scalar memory)
  - Branch unit
  - LDS unit (local memory)

#### Compute Unit

- The **instruction memory** of each compute unit contains a copy of the OpenCL kernel.
- A **front-end** fetches instructions, partly decodes them, and sends them to the appropriate execution unit.
- There is **one instance** of the following execution units: scalar unit, vector-memory unit, branch unit, LDS (local data store) unit.
- There are multiple instances of SIMD units.



#### The Front-End

- Work-groups are allocated to 4 different wavefront pools. Each wavefront from a work-group is assigned a slot in the wavefront pool.
- Each cycle, the **fetch stage** allows one wavefront pool to submit requests to instruction memory
- The **issue stage** consumes an instructions from one fetch buffer and sends it to the corresponding execution unit's issue buffer, depending on the instruction type.



### The GPU Architecture The SIMD Unit

- Runs arithmetic-logic vector instructions.
- There are **4 SIMD units**, each one associated with one of the 4 wavefront pools.
- The SIMD unit pipeline is modeled with **5 stages**: decode, read, execute, write, and complete.
- In the execute stage, a wavefront (64 work-items max.) is split into 4
   subwavefronts (16 work-items each). Subwavefronts are pipelined over the 16
   stream cores in 4 consecutive cycles.
- The vector register file is accessed in the **read** and **write** stages to consume input and produce output operands, respectively.

### The GPU Architecture The SIMD Unit



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#### **Functional Simulation**

- Sets up the memory image
- Runs one work-group at a time to completion
  - Emulates instructions and updates registers and memory

Demo 6

- Produces some limited statistics
  - Number of executed ND-Ranges and work-groups
  - Dynamic instruction mix of the ND-Range
- Produces an ISA trace
  - Listing memory image initialization
  - Instruction emulation trace

#### **Architectural Simulation**

- Models compute units and the memory hierarchy
- Maps work-groups onto compute units and wavefront pools
- Emulates instructions and propagates state through the execution pipelines
  - Models resource usage and contention



#### **Architectural Simulation**

- Fully configurable via configuration files
  - Number of compute units
  - Number of each execution unit (e.g. SIMDs) per compute unit
  - Latencies of pipeline stages
  - Memory modules and cache hiearchy
    - Levels, banks, sets, associativity, line size, read/write ports, interconnect network, link bandwidths, etc.
  - Issue policy (oldest instruction first, greedy)
- Configuration files are provided with Multi2Sim that model existing GPU models
  - Provided in: multi2sim/samples/southern-islands
  - 7970, 7870, 7850, 7770 are available

#### **Architectural Simulation**



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#### **Visualization Tool**

- Step through program execution
- View in-flight state of pipelines an memory hierarchy



#### Memory Hierarchy

- Fully configurable DRAM and cache modules, based on a 7970 GPU by default
  - 16KB data L1s (per compute unit)
  - Separate scalar L1s (shared by 4 compute units)
  - 6 banks of 128KB L2 (per GPU)
  - L1-to-L2 all-to-all crossbar
  - L2s to DRAM modules
- Cache hiearchy based on 3-state protocol (NSI)
  - N is non-exclusive, modified (similar to Delayed Consistency)



#### Memory Hierarchy

• APU design is possible with caches sharing a single protocol (NMOESI)



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#### Methodology

- Single wavefront
  - Instruction scheduling
- Multiple wavefronts
  - Scheduling
  - Instruction issue
  - Resource sharing (e.g., SIMD unit)

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Single Wavefront



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Single Wavefront



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Multiple Wavefronts



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Multiple Wavefronts



**Multiple Wavefronts** 



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Current OpenCL model

- An OpenCL ND-Range runs entirely on one device
- Scheduling done **manually** by programmer



Current OpenCL model

- Only GPU compute units run the OpenCL ND-Range
- CPU cores stay idle, unless programmer provides them with work



**Proposed Enhancement** 

- Allow multiple devices to execute the same ND-Range
- Automatic distribution of work-groups by the runtime



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**Proposed Enhancement** 

- All devices run the ND-Range (higher resource utilization)
- Complex cores contribute to reduce the execution time



**Proposed Enhancement** 

- Why hasn't this been done already?
  - Impractical with discrete GPU + CPU
    - Combining sparsely modified buffers from multiple distributed memories
    - Imbalance of processing power
- What's changed?
  - Low-power, shared memory CPU + GPU (i.e., APUs)
    - Removes challenge of combining results
    - Processors have more similar processing capability
- What are the benefits?
  - Programmer does not need to predict load ahead of time
  - The device better suited for execution will automatically run more work groups

Proposed Enhancement

- Why Multi2Sim?
  - The complete tool-chain is implemented!
- OpenCL runtime implementation allows extensions to be added
- Device driver model allows scheduler to be implemented
- Memory and cache models allow
  - Coherent memory hierarchies
  - Common physical and virtual address spaces
- Emulator/simulator allows work groups to be processed individually instead of only ND-Ranges

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# Concluding Remarks The Multi2Sim Community



**Additional Material** 

#### • The Multi2Sim Guide

 Complete documentation of the simulator's user interface, simulation models, and additional tools.

#### Multi2Sim forums and mailing list

- New version releases and other important information is posted on the Multi2Sim mailing list (no spam, 1 email per month).
- Users share question and knowledge on the website forum.
- M2S-Cluster
  - Automatic verification framework for Multi2Sim.
  - Based on a cluster of computers running *condor*.
- The Multi2Sim OpenCL compiler new!
  - LLVM-based compiler for GPU kernels written in OpenCL C.
  - Front-ends for CUDA and OpenCL in progress.
  - Back-ends for Fermi, Kepler, and Southern Islands in progress.
  - Back-ends accessible through stand-alone assemblers.

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Academic Efforts at Northeastern

#### • The "GPU Programming and Architecture" course

- We started an unofficial seminar that students can voluntarily attend. The syllabus covers OpenCL programming, GPU architecture, and state-of-theart research topics on GPUs.
- Average **attendance** of ~25 students per semester.

#### Undergraduate directed studies

 Official alternative equivalent to a 4-credit course that an undergraduate student can optionally enroll in, collaborating in Multi2Sim development.

#### Graduate-level development

- Lots of research projects at the graduate level depend are based on Multi2Sim, and **selectively included** in the development trunk for public access.
- Simulation of **OpenGL** pipelines, support for **new CPU/GPU** architectures, among others.

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**Collaborating Research Groups** 

- Universidad Politécnica de Valencia
  - Pedro López, Salvador Petit, Julio Sahuquillo, José Duato.
- Northeastern University
  - Chris Barton, Shu Chen, Zhongliang Chen, Tahir Diop, Xiang Gong, David Kaeli, Nicholas Materise, Perhaad Mistry, Dana Schaa, Rafael Ubal, Mark Wilkening, Ang Shen, Tushar Swamy, Amir Ziabari.
- University of Mississippi
  - Byunghyun Jang
- NVIDIA
  - Norm Rubin
- University of Toronto
  - Jason Anderson, Natalie Enright, Steven Gurfinkel, Tahir Diop.
- University of Texas
  - Rustam Miftakhutdinov

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Multi2Sim Academic Publications

#### Conference papers

- Multi2Sim: A Simulation Framework to Evaluate Multicore-Multithreaded Processors, SBAC-PAD, 2007.
- The Multi2Sim Simulation Framework: A CPU-GPU Model for Heterogeneous Computing, PACT, 2012.

#### Tutorials

- The Multi2Sim Simulation Framework: A CPU-GPU Model for Heterogeneous Computing, PACT, 2011.
- Programming and Simulating Fused Devices OpenCL and Multi2Sim, ICPE, 2012.
- Multi-Architecture ISA-Level Simulation of OpenCL, IWOCL, 2013.
- Simulation of OpenCL and APUs on Multi2Sim, ISCA, 2013. ← Upcoming!

Published Academic Works Using Multi2Sim

#### • Recent

- R. Miftakhutdinov, E. Ebrahimi, Y. Patt, Predicting Performance Impact of DVFS for Realistic Memory Systems, MICRO, 2012.
- D. Lustig, M. Martonosi, Reducing GPU Offload Latency via Fine-Grained CPU-GPU Synchronization, HPCA, 2013.

#### Other

- H. Calborean, R. Jahr, T. Ungerer, L. Vintan, A Comparison of Multi-objective Algorithms for the Automatic Design Space Exploration of a Superscalar System, Advances in Intelligent Systems and Computing, vol. 187.
- X. Li, C. Wang, X. Zhou, Z. Zhu, Cache Promotion Policy Using Re-reference Interval Prediction, CLUSTER, 2012.
- ... and 62 more citations, as per Google Scholar.

# Multi2Sim 4.1

## Multi-Architecture ISA-Level Simulation of OpenCL

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