## Extending HPCToolkit for GPU-accelerated Systems

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### Outline

- OpenMP 4.5 5.0
- **OMPT API for accelerators**
- **OMPT** implementation with accelerators
- HPCToolkit
  - interface with accelerator programming models
  - measurement
  - attribution
  - code-centric presentation
- Unexpected Challenges
- Remaining work
  - HPCToolkit
  - libomptarget

#### **OpenMP 4.5 and OpenMP 5.0**

- Offload computation to accelerators
- Avoid data movement for each target construct

```
Example target_data.3.c
#include <math.h>
#define COLS 100
void gramSchmidt(float Q[][COLS], const int rows)
ſ
    int cols = COLS;
    #pragma omp target data map(Q[0:rows][0:cols])
    for(int k=0; k < cols; k++)
    ſ
        double tmp = 0.0;
        #pragma omp target map(tofrom: tmp)
        #pragma omp parallel for reduction(+:tmp)
        for(int i=0; i < rows; i++)</pre>
            tmp += (Q[i][k] * Q[i][k]);
        tmp = 1/sqrt(tmp);
        #pragma omp target
        #pragma omp parallel for
        for(int i=0; i < rows; i++)</pre>
            Q[i][k] \star = tmp;
    }
}
```

Figure credit: OpenMP Standards Committee, OpenMP Application ProgrammingInterface Examples.Version 4.5.0, November 2016.

#### **OpenMP 5 API for Target Devices**

- Device-independent host callbacks for target devices
  - ompt\_callback\_device\_initialize
  - ompt\_callback\_device\_load
  - ompt\_callback\_target enter/exit target region
  - ompt\_callback\_target\_map
  - ompt\_callback\_target\_data\_op alloc
    - delete
    - transfer\_to\_device transfer\_from\_device
  - ompt\_callback\_target\_submit launch kernel
  - ompt\_callback\_device\_unload
  - ompt\_callback\_device\_finalize

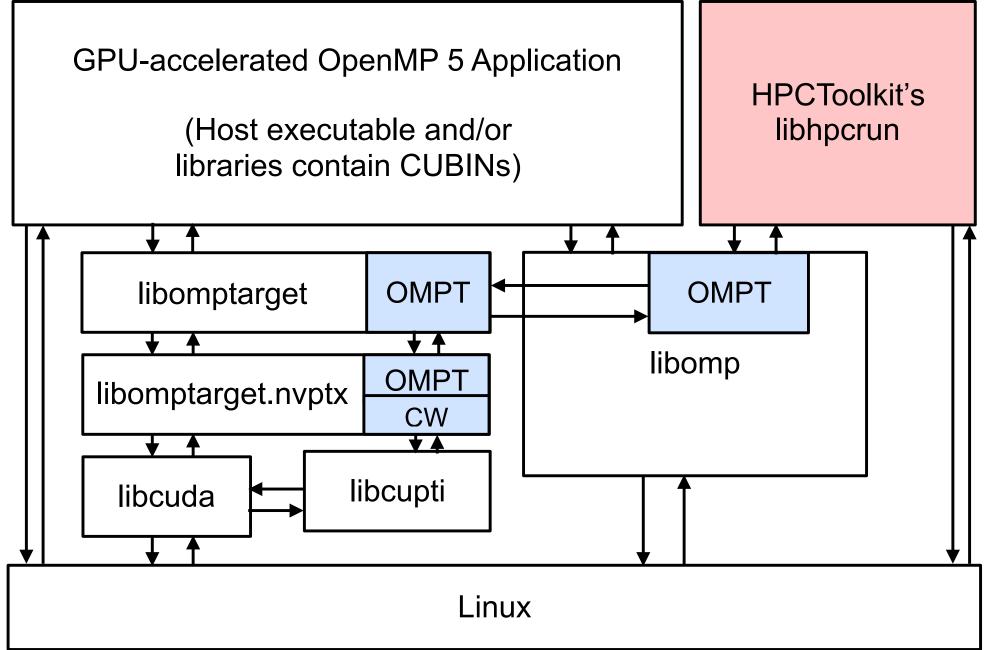
• Device-specific API for target devices

Entry Point String Name	Type Signature
"ompt_get_device_num_procs"	ompt_get_device_num_procs_t
"ompt_get_device_time"	<pre>ompt_get_device_time_t</pre>
"ompt_translate_time"	<pre>ompt_translate_time_t</pre>
"ompt_set_trace_ompt"	<pre>ompt_set_trace_ompt_t</pre>
"ompt_set_trace_native"	<pre>ompt_set_trace_native_t</pre>
"ompt_start_trace"	ompt_start_trace_t
"ompt_pause_trace"	ompt_pause_trace_t
"ompt_flush_trace"	ompt_flush_trace_t
"ompt_stop_trace"	ompt_stop_trace_t
"ompt_advance_buffer_cursor"	<pre>ompt_advance_buffer_cursor_t</pre>
"ompt_get_record_type"	ompt_get_record_type_t
"ompt_get_record_ompt"	ompt_get_record_ompt_t
"ompt_get_record_native"	<pre>ompt_get_record_native_t</pre>
"ompt_get_record_abstract"	<pre>ompt_get_record_abstract_t</pre>

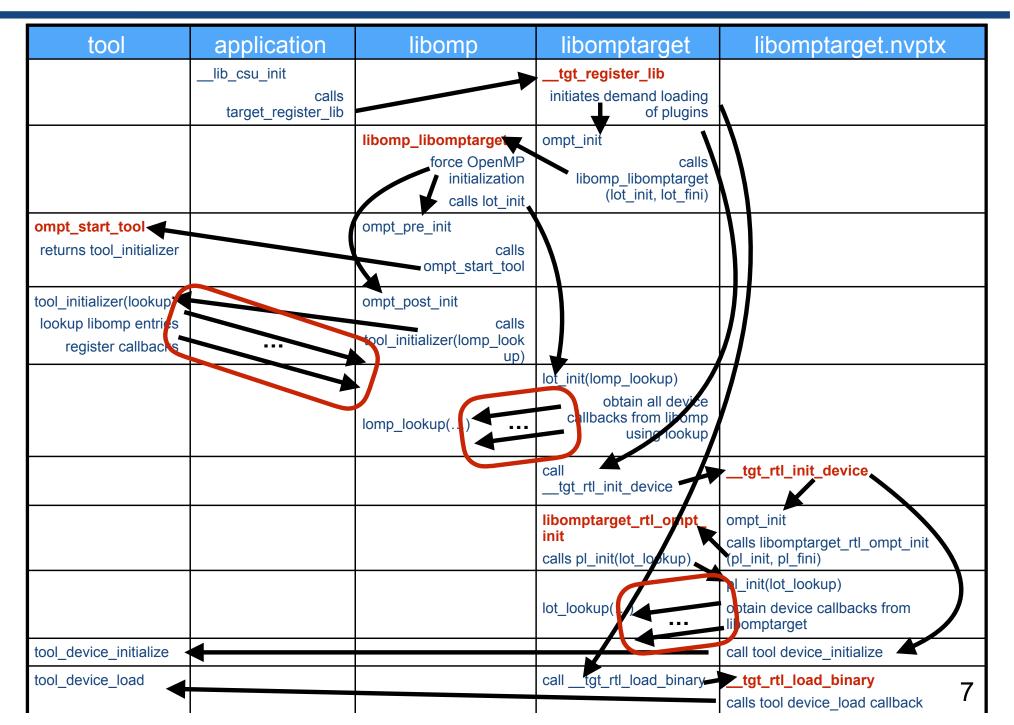
### **OpenMP 5 Implementation Requirements**

- Works with or without a tool that supports OMPT
- Works with tool support for OMPT
  - enabled
  - disabled
- OpenMP implementation strategies require demand-driven implementation
  - clang-generated heterogeneous binaries
    - constructor prior to main loads code onto device using libomptarget

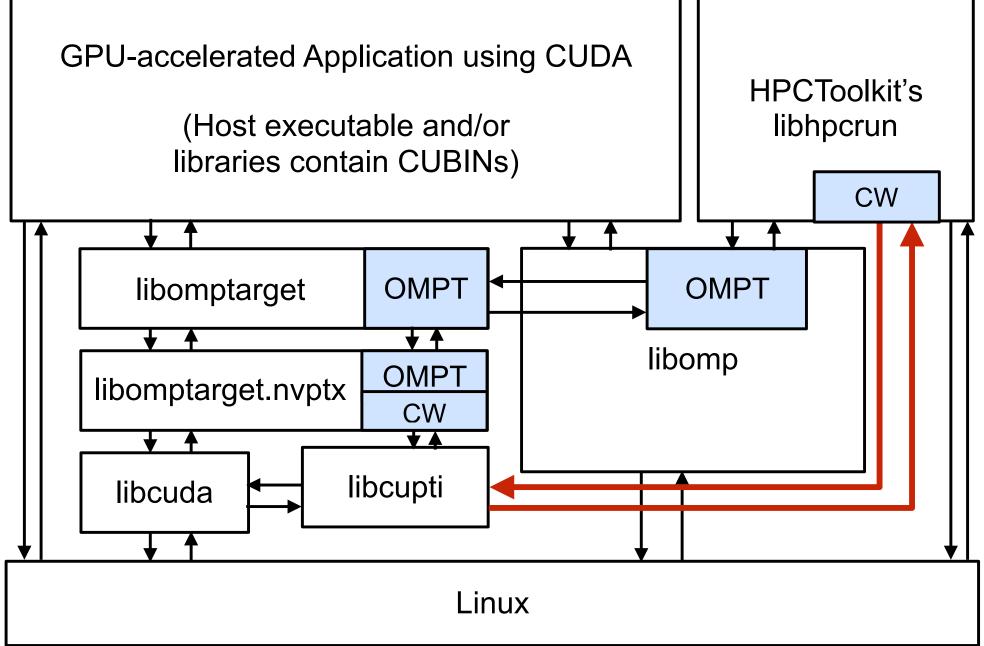
#### **LLVM OpenMP Software Ecosystem**



#### **OMPT Initialization for Accelerators**



#### **HPCToolkit Support for CUDA & OpenACC**



#### **HPCToolkit Measurement of GPUs**

- Registers for callbacks associated with target devices
  - device control
    - device\_initialize/finalize
    - device\_load/unload
  - target operations
    - target\_region, target\_submit, target\_data\_op
  - buffer\_request/complete
- Computes non-overlapping relocation of CUBIN functions
- Adds CUBINs to the load map
- Processes buffer of events delivered by CUPTI Activity API
  - PC samples: relocates PCs to facilitate source correlation
  - kernel invocations
  - explicit data copies
  - implicit data copies (page faults)
- Correlates with context using CUPTI external correlation ids<sub>q</sub>

#### **HPCToolkit Attribution**

- HPCToolkit's hpcstruct performs binary analysis of heterogeneous binaries
  - host binary
- Analysis of CUBINs
  - relocates functions so that they are non-overlapping
  - recovers program structure
    - inlined code and line map for unoptimized binaries (with -G)
    - line map only for optimized binaries (with —generate-line-info)
  - associates structure with code addresses
    - handles both unoptimized and optimized CUBINs
- Produces program structure file
  - load module for host
  - load module for each cubin
  - each load module contains
    - files, functions, inlined functions, statements

#### **Code-Centric Attribution for OpenMP**

	1-hpcviewer: lu	Ilesh2.0			
lulesh.cc X					
002 {					
003					
	_teams(TEAMS) thread_limit(THREADS) if (US	E_GPU == 1)			
<pre># pragma omp distribute paral for(Index_t i2=0;i2<numelem;+-< pre=""></numelem;+-<></pre>					
$Real_t$ gamma[4][8];					
908					
$gamma[0][0] = Real_t(1.);$					
<pre>gamma[0][1] = Real_t( 1.); gamma[0][2] = Real_t(-1.);</pre>					
$gamma[0][3] = Real_t(-1.);$					
<pre>gamma[0][4] = Real_t(-1.);</pre>					
$gamma[0][5] = Real_t(-1.);$					
<pre>gamma[0][6] = Real_t( 1.); gamma[0][7] = Real_t( 1.);</pre>					
$gamma[1][0] = Real_t(1.);$					
Calling Context View 🛛 🔧 Callers View	/ 📴 Elat Viow				
			TL_EXC_DEP:Sum (I) ST		STL_SYNC:Sum (I)
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Experiment Aggregate Metrics <program root=""> ▼ ➡ 500: main ▼ ➡ 3225: LagrangeLeapFrog(Doma ▼ ➡ 3048: LagrangeNodal(Doma ▼ ➡ 1570: CalcForceForNodes ▼ ➡ 1371: CalcVolumeForc ▼ ➡ 1353: CalcHourglas ▼ ➡ 1279: CalcFBHou ▼ ➡ 904: <unknow ▶ ➡_omp_offlo ▼ ➡ \$_omp_out lulesh.cc: 90 lulesh.cc: 95</unknow </program>	ain&) in&) s(Domain&) seForElems(Domain&) ssControlForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, doubl	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 48.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.3% 3.88e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3%	3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 1.58e+07 51.9% 1.43e+07 47.1% 1.40e+07 46.2% 8.36e+06 14.1% 3.67e+06 12.1%
Experiment Aggregate Metrics <program root=""> ▼ ➡ 500: main ▼ ■ 3225: LagrangeLeapFrog(Domain ▼ ➡ 3048: LagrangeNodal(Domain) ▼ ➡ 3048: LagrangeNodal(Domain) ▼ ➡ 1570: CalcForceForNodes ▼ ➡ 1397: CalcVolumeForce ▼ ➡ 1353: CalcHourglass ▼ ➡ 1279: CalcFBHout ▼ ➡ 904: <unknown ■ ➡ _omp_offlo ▼ ➡ _s_omp_outt Iulesh.cc: 90 Iulesh.cc: 97</unknown </program>	ain&) in&) s(Domain&) seForElems(Domain&) ssControlForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*, doubl	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 48.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1% 9.41e+04 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.3% 3.88e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3% 5.94e+04 0.3%	3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 1.58e+07 51.9% 1.43e+07 47.1% 1.40e+07 46.2% 8.36e+06 14.1% 3.67e+06 12.1%
Experiment Aggregate Metrics <program root=""> ▼ ➡ 500: main ▼ ➡ 300p at lulesh.cc: 3231 ▼ ➡ 3225: LagrangeLeapFrog(Doma ▼ ➡ 3048: LagrangeNodal(Domai ▼ ➡ 1570: CalcForceForNodes ▼ ➡ 1379: CalcVolumeForc ▼ ➡ 1353: CalcHourglas: ▼ ➡ 1279: CalcFBHou ▼ ➡ 904: <unknow ▶ ➡ _omp_offlo ▼ ➡ _\$_omp_out lulesh.cc: 90 lulesh.cc: 97 lulesh.cc: 96</unknow </program>	ain&) in&) s(Domain&) reForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*, dou	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 48.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1% 9.41e+04 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.3% 3.88e+04 0.2% 3.82e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3% 5.94e+04 0.2% 4.73e+04 0.2%	3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 1.58e+07 51.9% 1.43e+07 47.1% 1.40e+07 46.2% 8.36e+06 14.1% 3.67e+06 12.1%
Experiment Aggregate Metrics <program root=""> ▼ ➡ 500: main ▼ loop at lulesh.cc: 3231 ▼ ➡ 3225: LagrangeLeapFrog(Domain ▼ ➡ 3048: LagrangeNodal(Domain ▼ ➡ 1570: CalcForceForNodes ▼ ➡ 1397: CalcVolumeForce ▼ ➡ 1353: CalcHourglass ▼ ➡ 1279: CalcFBHout ■ 12790: CalcFBHout ■ 1279</program>	ain&) in&) s(Domain&) reForElems(Domain&) ssControlForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*,	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 48.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1% 9.41e+04 0.1% 8.97e+04 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.3% 3.88e+04 0.2% 3.86e+04 0.2% 3.86e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3% 5.94e+04 0.2% 4.73e+04 0.2%	3.04e+07       100       %         1.58e+07       51.9%         1.43e+07       47.1%         1.40e+07       46.2%         8.36e+06       27.5%         4.30e+06       14.1%         3.67e+06       12.1%
Experiment Aggregate Metrics <program root=""> ▼ ➡ 500: main ▼ loop at lulesh.cc: 3231 ▼ ➡ 3225: LagrangeLeapFrog(Domain ▼ ➡ 3048: LagrangeNodal(Domain ▼ ➡ 1570: CalcForceForNodes ▼ ➡ 1397: CalcVolumeForce ▼ ➡ 1353: CalcHourglass ▼ ➡ 1279: CalcFBHout ■ 12790: CalcFBHout ■ 1279</program>	ain&) in&) s(Domain&) seForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, double*, d urglassForceForElems(Domain&, double*, dou	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 49.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1% 9.41e+04 0.1% 8.897e+04 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.2% 3.88e+04 0.2% 3.86e+04 0.2% 3.80e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3% 5.94e+04 0.2% 4.73e+04 0.2% 4.32e+04 0.2%	3.04e+07       100 %         1.58e+07       51.9%         1.43e+07       47.1%         1.40e+07       46.2%         8.36e+06       27.5%         4.30e+06       14.1%         3.67e+06       12.1%
<ul> <li>▼loop at lulesh.cc: 3231</li> <li>▼ ➡ 3225: LagrangeLeapFrog(Doma</li> <li>▼ ➡ 3048: LagrangeNodal(Domai</li> <li>▼ ➡ 1570: CalcForceForNodes</li> <li>▼ ➡ 1397: CalcVolumeForce</li> <li>▼ ➡ 1353: CalcHourglas:</li> <li>▼ ➡ 1279: CalcFBHou</li> <li>▼ ➡ 904: <unknow< li=""> <li>▶ _omp_offlo</li> <li>▼ ➡ _s_omp_out</li> <li>Lulesh.cc: 96</li> <li>Lulesh.cc: 97</li> <li>Lulesh.cc: 97</li> <li>Lulesh.cc: 97</li> <li>Lulesh.cc: 97</li> <li>Lulesh.cc: 97</li> </unknow<></li></ul>	ain&) in&) s(Domain&) seForElems(Domain&, double*, double) urglassForceForElems(Domain&, double*, double*, d urglassForceForElems(Domain&, double*, double*, d on procedure> bading_35_3a52475_ZL28CalcFBHourglassForceFort tlined_\$_debug\$_5 D6 58 75 54 79 70 91	7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 7.45e+07 100 % 4.13e+07 55.5% 3.71e+07 49.8% 3.64e+07 48.8% 2.16e+07 29.0% 1.13e+07 15.2% 9.53e+06 12.8% 2.91e+06 3.9% 2.82e+06 3.8% 1.30e+05 0.2% 1.02e+05 0.1% 9.41e+04 0.1% 8.97e+04 0.1%	1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 1.68e+07 100 % 8.51e+06 50.8% 7.70e+06 45.9% 7.55e+06 45.0% 4.64e+06 27.7% 2.66e+06 15.9% 2.24e+06 13.4% 3.79e+04 0.2% 1.23e+06 7.4% 5.48e+04 0.3% 3.88e+04 0.2% 3.86e+04 0.2% 3.86e+04 0.2%	2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 2.32e+07 100 % 1.46e+07 63.2% 1.33e+07 57.4% 1.31e+07 56.6% 7.70e+06 33.2% 3.83e+06 16.5% 3.24e+06 14.0% 4.02e+05 1.7% 1.45e+06 6.3% 6.30e+04 0.3% 5.94e+04 0.2% 4.73e+04 0.2%	3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 3.04e+07 100 % 1.58e+07 51.9% 1.43e+07 47.1%

#### **Code-Centric Attribution for CUDA**

$\bullet \bullet \bullet$				hpcviewer: raja-perf-nolibs.exe	
🞅 DOT.cpp	launcher.h ⊠	🞅 reduce.h	🞅 cupti-api.c		
97 void _ 98 _kerne 99 { 100 exte	5,	nds(Agent::p _2 x2, _3 x3, _ em[];	tx_plan::BLOCK_TH _4 x4, _5 x5)	_3, class _4, class _5> READS, Agent::ptx_plan::MIN_BLOCKS)	0
102 } 103 templo 104 void	ate <class agent,="" class<="" td=""><td>_0, class _1, nds(Agent::p</td><td>class _2, class _ tx_plan::BLOCK_TH</td><td>_3, class _4, class _5, class _6&gt; READS, Agent::ptx_plan::MIN_BLOCKS) x6)</td><td></td></class>	_0, class _1, nds(Agent::p	class _2, class _ tx_plan::BLOCK_TH	_3, class _4, class _5, class _6> READS, Agent::ptx_plan::MIN_BLOCKS) x6)	
褖 Calling Cont	ext View 🛛 🔧 Callers Vi	ew 拝 Flat View	,		

ope	STL_NONE.[0,0] (I) ~	STL_NONE.[0,0] (E)	STL_MEM_DEP.[0,0] (	STL_MEM_DEP.[0,0] (I	STL_S
Experiment Aggregate Metrics	1.19e+08 100 %	1.19e+08 100 %	1.08e+09 100 %	1.08e+09 100 %	1.9
<program root=""></program>	1.19e+08 100 %		1.08e+09 100 %		1.9
▼ 🛱 500: main	1.19e+08 100 %		1.08e+09 100 %		1.9
▼ 🖶 34: rajaperf::Executor::runSuite()	1.19e+08 100 %		1.08e+09 100 %		1.9
🔻 🖶 372: rajaperf::KernelBase::execute(rajaperf::VariantID)	1.19e+08 100 %		1.08e+09 100 %		1.9
🔻 🖶 72: rajaperf::stream::DOT::runKernel(rajaperf::VariantID)	5.29e+07 44.5%		2.20e+08 20.4%		1.5
🔻 🖶 165: rajaperf::stream::DOT::runCudaVariant(rajaperf::VariantID)	3.34e+07 28.1%		5.48e+07 5.1%		1.2
I111: double thrust::inner_product <thrust::detail::normal_iterator<thrust::device_ptr<double>&gt;</thrust::detail::normal_iterator<thrust::device_ptr<double>	3.34e+07 28.1%		5.48e+07 5.1%		1.2
🔻 🖶 84: double thrust::inner_product <thrust::cuda_cub::tag, td="" thrust::detail::normal_iterator<thrusi<=""><td>3.34e+07 28.1%</td><td></td><td>5.48e+07 5.1%</td><td></td><td>1.3</td></thrust::cuda_cub::tag,>	3.34e+07 28.1%		5.48e+07 5.1%		1.3
🔻 🖶 46: double thrust::cuda_cub::inner_product <thrust::cuda_cub::tag, td="" thrust::detail::normal_i<=""><td>t 3.34e+07 28.1%</td><td></td><td>5.48e+07 5.1%</td><td></td><td>1.3</td></thrust::cuda_cub::tag,>	t 3.34e+07 28.1%		5.48e+07 5.1%		1.3
🔻 🖶 81: double thrust::cuda_cub::inner_product <thrust::cuda_cub::tag, td="" thrust::detail::norma<=""><td>3.34e+07 28.1%</td><td></td><td>5.48e+07 5.1%</td><td></td><td>1.</td></thrust::cuda_cub::tag,>	3.34e+07 28.1%		5.48e+07 5.1%		1.
🔻 🖶 63: doit_step <thrust::cuda_cub::transform_pair_of_input_iterators_t<double, td="" thrust::<=""><td>3.34e+07 28.1%</td><td></td><td>5.48e+07 5.1%</td><td></td><td>1.</td></thrust::cuda_cub::transform_pair_of_input_iterators_t<double,>	3.34e+07 28.1%		5.48e+07 5.1%		1.
🔻 🖶 821: void thrust::cuda_cub::core::AgentLauncher <thrust::cuda_cub::reduce::re< td=""><td>3.30e+07 27.7%</td><td></td><td>5.38e+07 5.0%</td><td></td><td>1.</td></thrust::cuda_cub::reduce::re<>	3.30e+07 27.7%		5.38e+07 5.0%		1.
🔻 🖶 1105: doit <void (*)="" (thrust::cuda_cub::transform_pair_of_input_iterators_t<doul<="" td=""><td>3.30e+07 27.7%</td><td></td><td>5.38e+07 5.0%</td><td></td><td>1.</td></void>	3.30e+07 27.7%		5.38e+07 5.0%		1.
🔻 🖶 892: cudaError thrust::cuda_cub::launcher::triple_chevron::doit_host <void (<="" td=""><td>* 3.30e+07 27.7%</td><td></td><td>5.38e+07 5.0%</td><td></td><td>1.</td></void>	* 3.30e+07 27.7%		5.38e+07 5.0%		1.
I06: void thrust::cuda_cub::core::_kernel_agent <thrust::cuda_cub::red< p=""></thrust::cuda_cub::red<>	3.30e+07 27.7%		5.38e+07 5.0%		1.
▼ 🖶 321: void thrust::cuda_cub::core::_wrapper_device_stub_kernel_age	a.30e+07 27.7%		5.38e+07 5.0%		1.
🔻 💕 64:device_stubZN6thrust8cuda_cub4core13_kernel_agentINS	3.30e+07 27.7%		5.38e+07 5.0%		1.
▼ 💕 60: cudaError cudaLaunch <char>(char*)</char>	3.30e+07 27.7%		5.38e+07 5.0%		1.
B) 1879: cudaLaunch	3.30e+07 27.7%		5.38e+07 5.0%		1.
Epiceptical State Sta	3.30e+07 27.7%		5.38e+07 5.0%		1.
▼ 🖶 301: thrust::cuda_cub::core::_kernel_agent <thrust::cuda< td=""><td>8.92e+06 7.5%</td><td>6.87e+05 0.6%</td><td>2.89e+07 2.7%</td><td>7.17e+05 0.1%</td><td></td></thrust::cuda<>	8.92e+06 7.5%	6.87e+05 0.6%	2.89e+07 2.7%	7.17e+05 0.1%	
▼ 🖶 101: [i] thrust::cuda_cub::reduce::ReduceAgent <th< td=""><td>N 8.23e+06 6.9%</td><td>2.96e+05 0.2%</td><td>2.82e+07 2.6%</td><td>1.11e+06 0.1%</td><td></td></th<>	N 8.23e+06 6.9%	2.96e+05 0.2%	2.82e+07 2.6%	1.11e+06 0.1%	

#### **Unexpected Challenges - I**

- Challenge: extra threads
  - CUDA helper thread
  - CUPTI helper threads
    - CUPTI spawns a pthread every time it launches a kernel coordinate measurement of asynchronous operations?
- Approach
  - modify HPCToolkit's libmonitor to record return address associated with pthread\_create call
  - ignore a thread spawned by any of NVIDIA's libraries
    - recognize libraries by an API function they supply rather than by name

#### **Unexpected Challenges - II**

- Large overhead for PC Sampling with CUPTI
- Assessing the situation
  - Test case: LLNL's rajaperfsuite
    - uses RAJA portability layer to offload kernels to a GPU
  - Observe overhead for turning on the CUPTI Activity API to measure GPU performance using PC Sampling

#### **CUPTI User Space Overhead for PC Sampling**

 memset added to CUDA launch to support PC Sampling with CUPTI accounts for 28% of total execution time

	hpcviewer: raja-perf-nolibs.exe	
MULADDSUB-Cuda.cpp 🛛		- [
<pre>58 deallocCudaDeviceData(in2); 59 60global void muladdsub(Real_ptr out)</pre>	, Real_ptr in2, end)	
<pre>65 if (i &lt; iend) { 66 MULADDSUB_BODY; 67 } 68 } 69 70</pre>		
<pre>71 void MULADDSUB::runCudaVariant(Variant 72 { 73  const Index_type run_reps = getRunRe 74  const Index type ibegin = 0.</pre>		
😪 Calling Context View 🔕 Callers View 🛱 👬	-lat View	
1 🕂 🗄 🕼 🕅 📰 🗚 🛌		
Scope		cycles:Sum (I) 🛛 cycles:Sum (E) 🗸
Experiment Aggregate Metrics		1.90e+12 100 % 1.90e+12 100 %
memset_sse2		5.47e+11 28.8% 5.44e+11 28.6%
🔻 📹 <unknown procedure=""> 0x2dd91e [libcuda</unknown>	so.384.81]	5.47e+11 28.8% 5.44e+11 28.6%
🔻 🗐 zunknown procedures 0x2ea220 [libci	da so 384 811	5 47e+11 28 88 5 44e+11 28 68

▼ 📹 <unknown procedure=""> 0x2dd91e [libcuda.so.384.81]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
🔻 🐖 <unknown procedure=""> 0x2ea220 [libcuda.so.384.81]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
🔻 <u <ul=""> <li><u <li="" <u="">unknown procedure&gt; 0x32af82 [libcuda.so.384.81]</u></li> </u>	5.47e+11 28.8%	5.44e+11 28.6%
🔻 < unknown procedure> 0x186f90 [libcupti.so.9.0.176]	5.47e+11 28.8%	5.44e+11 28.6%
▼ 📹 <unknown procedure=""> 0x171e69 [libcupti.so.9.0.176]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
«	5.47e+11 28.8%	5.44e+11 28.6%
🔻 🔚 <unknown procedure=""> 0x1cb788 [libcuda.so.384.81]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
Ibcuda.so.384.81	5.47e+11 28.8%	5.44e+11 28.6%
▼ 4 <unknown procedure=""> 0xe4ab5 [libcuda.so.384.81]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
▼ 4 <unknown procedure=""> 0xe4ce2 [libcuda.so.384.81]</unknown>	5.47e+11 28.8%	5.44e+11 28.6%
Ilibcuda.so.384.81	5.47e+11 28.8%	5.44e+11 28.6%
🔻 🐗 cudart::cudaApiLaunchCommon	5.47e+11 28.8%	5.44e+11 28.6%
v 🗐 cudaLaunch	5.47e+11 28.8%	5.44e+11 28.6%
▼ ا 1879: cudaLaunch <char></char>	5.47e+11 28.8%	5.44e+11 28.6%
417:device_stub_ZN4RAJA6policy4cuda4impl18forall_cuda_kernellLm256ENS_9Iterators16numeric_iteratorllIPIEE	2.74e+11 14.4%	2.73e+11 14.4%
device_stub_ZN8rajaperf5basic9muladdsubEPdS1_S1_S1_S1_I	2.72e+11 14.3%	2.71e+11 14.3%
▶ 🔁 63: rajaperf::basic::muladdsub	2.72e+11 14.3%	2.71e+11 14.3%

#### **CUPTI Kernel Overhead for PC Sampling**

# • nv\_alloc\_system\_pages added to CUDA launch to support PC Sampling with CUPTI accounts for 42% of total execution time

MULADDSUB-Cuda.cpp ☆ deallocCudaDeviceData(in2); generations and the set of the set o	
<pre>59 60global void muladdsub(Real_ptr out1, Real_ptr out2, Real_ptr out3, 61</pre>	
62 Index_type iend) 63 <mark>{</mark>	
Index type i = blockIdx x * blockDim x + threadIdx x:	
<pre>index_type i = biocklux.x = biockbtm.x + chreadiux.x, if (i &lt; iend) { MULADDSUB_BODY; } 58 } 59</pre>	
Calling Context View 🗞 Callers View 🕱 🏗 Flat View	
1 🕂 🗄 😥 🕅 💹 At 🛌	
	(I) cvcles:Sum (E) ~
	.1% 2.32e+11 12.2%
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	.1% 2.32e+11 12.2
	.1% 2.32e+11 12.2
	.1% 2.32e+11 12.2
	.1% 2.32e+11 12.2
	.1% 2.32e+11 12.2
	.0% 1.16e+11 6.1
	.0% 1.16e+11 6.1
I 17:device_stub_ZN4RAJA6policy4cuda4impl18forall_cuda_kernellLm256ENS_9lterators16num 4.00e+11 21	

16

### **CUPTI Kernel Overhead for PC Sampling**

cycles:Sum (I)	
cycles:Sum (I)	
cvcles:Sum (I) v	
	cycles:Sum (E)
1.89e+12 99.5%	
1.89e+12 99.5%	
1.89e+12 99.3%	
1.89e+12 99.3%	
1.89e+12 99.3%	6.03e+09 0.
1.86e+12 98.0%	
.6% 1.60e+09	0.19
.0% 1.16e+11	6.19
.5% 9.14e+08	0.01
.4% 1.95e+09	0.19
.2% 3.29e+09	0.29
.1% 2.12e+11	11.19
.7% 2.33e+10	
15 Z. 330TIU	
p	1.89e+12 99.3% 1.89e+12 99.3% 1.89e+12 99.3% 1.89e+12 99.3% 1.89e+12 99.3% 1.89e+12 99.3% 1.89e+12 99.3% 1.86e+12 98.0% 9.39e+11 49.4% 9.39e+11 49.4% per_t<_nv_d 9.39e+11 49.4% per_t<_nv_d 9.39e+11 49.4% 0% 1.16e+111 .5% 9.14e+08 .4% 1.95e+09 .2% 3.29e+09 .1% 2.12e+111 .1% 2.12e+111

mv_alloc_pages [nvidia]	4.11e+11 21.6% 1.60e+09 0.1%
multiplestim mu	4.00e+11 21.0% 1.16e+11 6.1%
Jet_free_pages	2.75e+11 14.5% 9.14e+08 0.0%
alloc_pages_current	2.73e+11 14.4% 1.95e+09 0.1%
Image: Contemporary Contempo	2.70e+11 14.2% 3.29e+09 0.2%
Elear_page_c_e	2.12e+11 11.1% 2.12e+11 11.1%
<unknown file=""> [<vmlinux>]: 0</vmlinux></unknown>	2.12e+11 11.1% 2.12e+11 11.1%
get_page_from_freelist	5.16e+10 2.7% 2.33e+10 1.2%
<unknown file=""> [<vmlinux>1: 0</vmlinux></unknown>	3.29e+09 0.2% 3.29e+09 0.2%

## **Remaining Work: HPCToolkit**

#### • hpcrun

- upgrade OMPT support from TR4 to OpenMP 5 standard
  - asynchronous assembly of calling contexts mediated by wait-free operations on data structures
- integrate GPU support to allow both CUDA and OpenMP 5 in the same execution
- add support for sample-based tracing of GPU activity
- complete support for sparse metric sets
  - many GPU metrics
  - few nodes in CCT have GPU metrics
  - goal: avoid space cost of empty GPU metrics almost everywhere
- test support for OpenACC
- hpcstruct
  - integrate support for parsing dot CFGs for NVIDIA CUBINs
    - enable us to attribute GPU kernel performance at the loop level
  - compute approximate call tree on GPUs
    - when there is a single call to a function, know its calling context
    - when there are multiple calls, proportionally attribute cost to callers
- hpcviewer
  - needs top-down support for analyzing GPU metrics
- hpctraceviewer
  - needs support for displaying traces of GPU kernel executions

#### **Remaining Work: libomptarget**

- Refine OMPT support for use of libomptarget without OpenMP
- Upstream changes to libomptarget
- Hand off OMPT GPU support to IBM for direct integration into LOMP

#### **Unmet Needs from NVIDIA**

- API for unpacking .nv\_fatbin segments
  - NVIDIA has refused to provide header file or API
  - complicates binary analysis of heterogeneous binaries constructed with NVIDIA nvcc
    - CUDA and OpenACC
- API for computing control flow graphs for CUBINs — currently, execute nvdisasm and parse its output
- CUPTI Activity API for PC sampling has significant overhead
  - long time spent initializing memory (profile buffers?) in both user space and the kernel when PC sampling is enabled

NVIDIA has committed to working on this one for Volta