Hewlett Packard Enterprise

CHAPEL 1.31/1.32 RELEASE NOTES: GPU SUPPORT

Chapel Team June 22, 2023 / September 28, 2023

GPU SUPPORT OUTLINE

- <u>Background</u>
- <u>Features</u>
- <u>Portability</u>
- <u>Performance</u>
- Next Steps

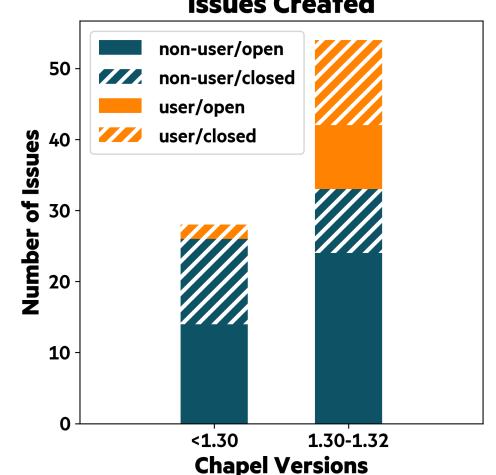
BACKGROUND

Background

- We are adding native GPU support to Chapel
 - A highly desired feature, given the potential to be a clean and portable way of programming GPUs
 - GPUs are more and more common in supercomputers
 - -Over 95% of the compute capability on Frontier (currently #1 on the top-500) comes from its GPUs
- In earlier releases, we've...
 - ...moved from an idea (**1.23**), to a demo (**1.24**), to a user-accessible feature on NVIDIA GPUs (**1.25**),to being able to drive multiple GPUs on one locale (**1.26**), and then multiple locales (**1.27**).
- We started to focus on performance and portability during ${\bf 1.29}$ / ${\bf 1.30}$
- **1.31** / **1.32**: continued push on performance and portability, responded to uptick in user requests
 - -Performance: optimizations impacting many benchmarks, ability to use Chapel tasks with GPUs
 - -**Portability:** AMD/NVIDIA parity, initial support for CUDA 12/ROCm 5, new cpu-as-device mode
 - -**Community:** new users trying out GPU support, significant increase in GitHub interactions
 - -Also new features for users and capabilities for developers

GitHub Activity Summary

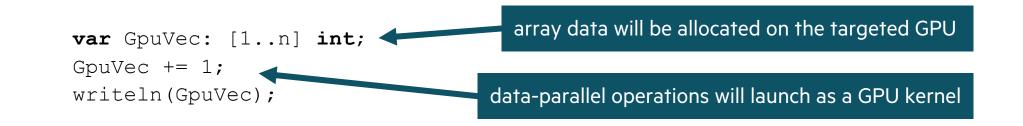
- GPU support has started to receive attention
- Before 1.30:
 - 2 user-reported issues were opened
- Between 1.30 and 1.32:
 - we had **21 user-reported issues**
- During 1.31/1.32, we prioritized resolving user issues
 - we closed **27 total issues**.
 - **14** of them were reported by users
- We also started to report issues publicly ourselves
 - ... while migrating internal discussions to the public repo



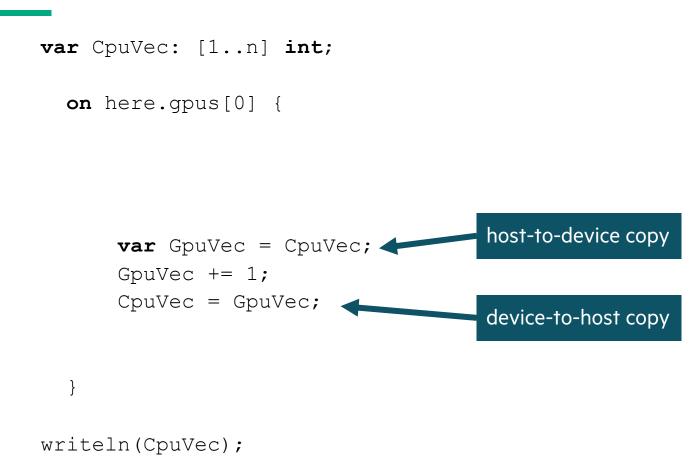
Issues Created

CRASH COURSE IN GPU PROGRAMMING USING CHAPEL

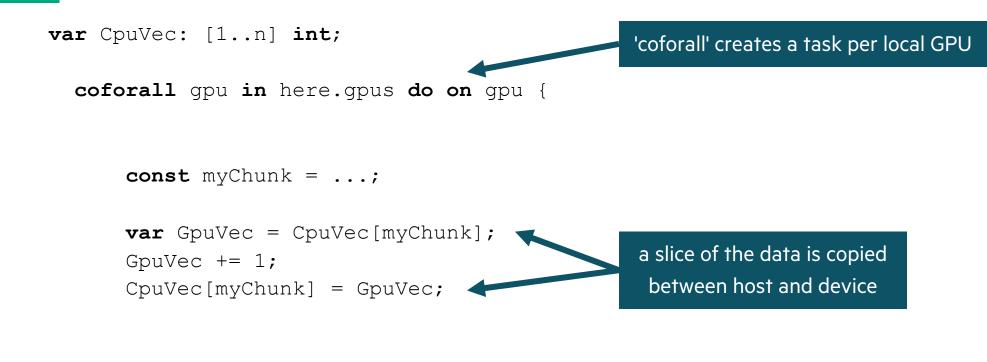
Vector Increment Example: Basics



Vector Increment Example: Data Offload via Bulk Array Assignment



Vector Increment Example: Multiple GPUs via 'coforall'



}

writeln(CpuVec);

Vector Increment Example: Multiple GPUs on Multiple Locales

```
var CpuVec: [1..n] int;
coforall loc in Locales do on loc {
    coforall gpu in here.gpus do on gpu {
```

```
const myChunk = ...;
```

```
var GpuVec = CpuVec[myChunk];
GpuVec += 1;
CpuVec[myChunk] = GpuVec;
```

```
}
}
writeln(CpuVec);
```

Vector Increment Example: Multiple GPUs using Multiple Tasks on Multiple Locales

```
var CpuVec: [1...n] int;
coforall loc in Locales do on loc {
  coforall gpu in here.gpus do on gpu {
                                                               'coforall' to create
    coforall workerId in 0..<numTasks {</pre>
                                                             multiple tasks per GPU
       const myChunk = ...;
      var GpuVec = CpuVec[myChunk];
      GpuVec += 1;
      CpuVec[myChunk] = GpuVec;
                                                         This pattern has significantly
                                                         improved performance in 1.32
                                                         See the "Performance" part of this deck.
writeln(CpuVec);
```

Overview of Changes in 1.31 and 1.32

Performance:

- Faster array access in kernels
- Faster Math library calls
- Faster multitasking on GPUs
- Turned the faster memory strategy on by default
- Peer-to-peer access features and exploration

Portability:

- CPU-as-Device mode
- AMD/NVIDIA feature and performance parity
- Initial Intel exploration
- CUDA 12/ROCm 5 support

New Features and Capabilities:

- Standalone atomic functions
- '--report-gpu' compiler flag
- Ability to compile for multiple NVIDIA architectures
- Improved debugging features:
 - Ability to inspect assembly for AMD GPUs
 - Improved auto-generated kernels' names
 - New loop attribute '@assertOnGpu'

FEATURES

- <u>Atomic Operations</u>
- <u>'--report-gpu' flag</u>
- Assembly Inspection
- <u>'@assertOnGpu' attribute</u>
- Multi-arch compilation
- Improved Kernel Naming

ATOMIC OPERATIONS ON GPU

Background: GPUs have support for atomic operations (add, compare-and-swap, etc.)

This Effort: Added the following procedures for atomic operations to the GPU module:

gpuAtomicAdd	gpuAtomicMin	gpuAtomicDec	gpuAtomicXor
gpuAtomicSub	gpuAtomicMax	gpuAtomicAnd	gpuAtomicCAS
gpuAtomicExch	gpuAtomicInc	gpuAtomicOr	

Status: Almost all operations are supported on NVIDIA and AMD GPUs

- Caveat: 64-bit, signed, atomic 'min' and 'max' operations do not work when compiling for AMD
 - These operations are not supported in HIP version < 5.7 (we currently support 4.0-5.4)
 - -We produce a compile-time error if these are used and 'CHPL_GPU=amd' is set

Next Steps:

- Allow using variables with Chapel's 'atomic' type and have them lower to these calls as appropriate (<u>#23619</u>)
- Enable atomic min and max on AMD GPUs once we support HIP versions >= 5.7

--REPORT-GPU FLAG

Background: Chapel generates kernels for all GPU-eligible loops

- Users may want to know what loops are and are not GPU-eligible
- 'assertOnGpu' does a compile-time eligibility check, but needs to be applied manually to all loops

This Effort: Added '--report-gpu' to chpl to dump loop eligibility information

• We report on all loops that are order-independent and not already in a GPU kernel

Impact: The following code produces the following output when compiled with '--report-gpu':

Next Steps: Consider increasing the verbosity for when we report GPU-ineligibility (<u>#23620</u>)

EMITTING GPU ASSEMBLY WITH --SAVEC FLAG

Background: -- savec dumps code that can help users gain performance insights

- When using the C backend, it saves C files
- When using LLVM, it saves various IIvm-related intermediate files –(the name "savec" needs to change, at least for LLVM, see <u>#18602</u>)
- When compiling for NVIDIA GPUs, it also stores a PTX assembly file
 - but previously we did not do this for AMD

This Effort: Ensured --savec outputs GPU-related assembly for NVIDIA and AMD

Impact:

- Regardless of GPU target, we output a 'chpl_gpu.s'
- In the generated assembly, kernels are named 'chpl_gpu_kernel_<fileName>_line_<num>'
- We now documented this in the technote and intend to support it going forward

ASSERT-ON-GPU ATTRIBUTE

Background:

- Ensuring that loops were GPU-eligible was handled by a special 'assertOnGpu()' function
- Calls to 'assertOnGpu()' were either compile-time or run-time depending on its position, which was unusual
 - If 'assertOnGpu()' was a top-level statement in an ineligible loop, compiler reported an error immediately

This Effort:

- Use recently-added loop attributes to introduce '@assertOnGpu', which always performs a compile-time check
- Precludes the need for differentiating function behavior *if it's at the top level*

```
@assertOnGpu
foreach a in A do a += 1;
```

Status:

- '@assertOnGpu' is the preferred way to check GPU eligibility
 - the standalone 'assertOnGpu' function is deprecated

Next Steps:

• Investigate if a runtime-only assertion (like 'assertOnGpu()' not-at-top-level) is necessary

MULTI-ARCHITECTURE GPU EXECUTABLES

Background:

- It's common for GPU-enabled programs to embed multiple GPU binaries for different architectures
 - Enables a compiled program to run on devices with different GPU hardware
 - e.g., a cluster with different GPU nodes, or a laptop with dedicated and integrated GPU

This Effort:

• Added prototypical support for multi-architecture executables to Chapel's GPU functionality

Status:

- Initial support for multi-architecture executables for NVIDIA
 - To access, pass comma-separated architectures to '--gpu-arch'
 - > chpl --gpu-arch sm_70,sm_80
- Current approach relies on using the lowest-common version of PTX for named architectures
 - with additional effort, could specialize PTX per architecture

Next Steps:

• Investigate additional specialization for architectures and multi-vendor support (<u>#22783</u>)

GPU KERNEL NAMING

Background:

- Chapel generates GPU kernels by translating loops into procedures (named 'chpl_gpu_kernel')
- If multiple kernels are present, the built-in mangling appended '_1', '_2', and more
- However, 'chpl_gpu_kernel_1' isn't very descriptive, and doesn't make for easy debugging

This Effort:

• Change the GPU kernel naming policy to include the filename and line number. e.g.,

```
chpl_gpu_kernel_fileName_line_13
chpl_gpu_kernel_fileName_line_37
```

Status:

• Kernel naming changes are available in 1.32

PORTABILITY

- <u>AMD/NVIDIA Parity</u>
- Intel Explorations
- <u>CPU-as-Device mode</u>
- <u>CUDA 12/ROCm 5 support</u>

GPU ARCHITECTURE FEATURE PARITY

Background: In 1.30, some Chapel code was not portable across AMD and NVIDIA GPUs

• Specifically, using the 64-bit versions of these functions caused compile-time failures when building for AMD:

acos	acosh	asin	asinh	atan	atan2
atanh	cbrt	cosh	erf	erfc	ldexp
lgamma	log1p	sinh	tan	tanh	tgamma

This Effort: Fixed a bug causing us to erroneously link to the wrong version of these math functions

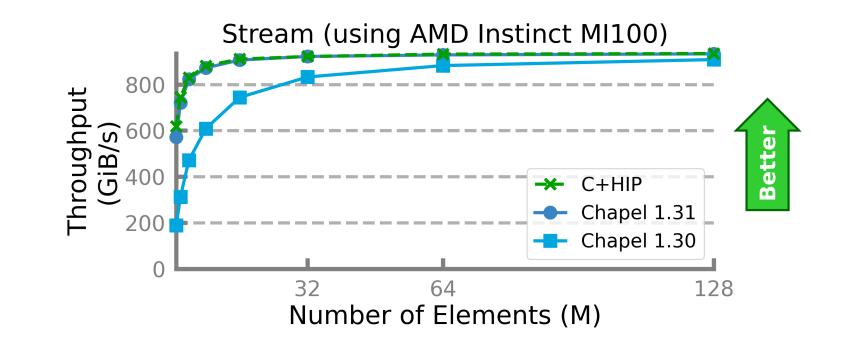
Status: We now support the same math functions for NVIDIA and AMD

GPU ARCHITECTURE PERFORMANCE PARITY

Background: In 1.30, HPCC-Stream was competitive with CUDA on NVIDIA but not with HIP on AMD

This Effort: Updated runtime to avoid calling a deprecated HIP API

Impact: Stream now performs competitively to C+HIP on AMD



TARGETING INTEL GPUS

Background:

- Chapel supports targeting NVIDIA and AMD GPUs; but Intel GPUs are not supported, yet
 - -LLVM does not support targeting Intel GPUs

This Effort:

- We investigated Intel's LLVM-based 'dpc++' compiler
 - Discovered that default builds may not be suitable for use as the system LLVM
 - Headers and some tools are missing

Next Steps:

- Allow Chapel to be built with Intel's LLVM as the system LLVM
 - -Create documentation for it for advanced users
- Implement a runtime layer for Intel GPUs based on oneAPI Level Zero

CPU-AS-DEVICE MODE Background and This Effort

Background:

- Chapel's GPU support required the runtime to be built with CUDA or HIP as a dependency – This meant that even simple development must be done on a system with actual GPUs
- Being able to start HPC-oriented development on a personal computer is an important part of productivity
 - e.g., Chapel also allows multilocale development on a personal computer

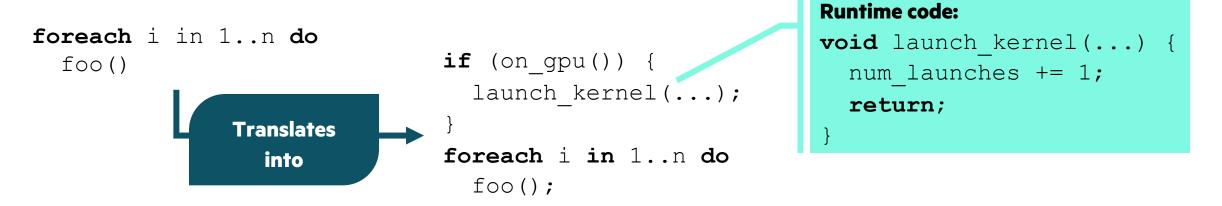
This Effort: Chapel now has a cpu-as-device mode for GPU programming without GPUs

- No CUDA/HIP dependencies, no need for actual GPUs
- To enable this mode:
 - > export CHPL_LOCALE_MODEL=gpu # required for GPU support in general
 - > export CHPL_GPU=cpu # mandatory to enable cpu-as-device mode. i.e., will never be set automatically

CPU-AS-DEVICE MODE

Status

- Compiler works similarly, but the original loop will always execute
- Runtime's calls bump up diagnostic counters as appropriate, redirect to other parts of the runtime
 - i.e., GpuDiagnostics can be used normally in most cases



- '@assertOnGpu' on a loop generates:
 - Compiler error: if the loop is not GPU-eligible
 - Runtime warning: if the loop is run on a non-GPU locale
 - The warning can be disabled by setting the 'CHPL_GPU_NO_CPU_MODE_WARNING' environment variable

CPU-AS-DEVICE MODE

Next Steps

- We plan to address some behavior differences we observed
 - Nested GPU-eligible loops cause GpuDiagnostics to register more kernel launches than expected
 - Argument passing and outer variable usage details are not captured in this mode – We were unable to reproduce some actual GPU bugs in this mode
 - The generated kernel is discarded while generating the final code
 - There's no generated kernel code that is very useful for advanced debugging during development

```
Runtime code:
foreach i in 1... do
                                                              void launch kernel(...) {
                                if (on gpu()) {
  foo()
                                                                num launches += 1;
                                  launch kernel(...);
                                                                for (int threadIdx...
              Will translate
                                                                   call kernel(kernel,
                                else { // need 'else' now
                  into
                                                                                threadIdx,
                                  foreach i in 1... do
                                                                                ...);
                                     foo();
                                                                return;
```

CUDA 12.X SUPPORT

Background:

- Chapel supported CUDA 11.x and 10.x with some limitations
- CUDA 12.x was not supported before
 - Main blocker: LLVM/Clang 15 (highest version Chapel supports) does not support CUDA 12.x
 - Noted by multiple users
- LLVM/Clang 16 supports CUDA 12

This Effort:

- We patched our bundled LLVM (version 15) to support CUDA 12
- Unsupported versions generate an error while building Chapel

Status:

• CUDA 12 is now supported only when using the bundled LLVM

Next Steps:

- Complete LLVM 16 upgrade to enable CUDA 12 support with system LLVM too
- Consider dropping CUDA 10.x support
 - Should be a documentation change only: we do not maintain any code to support 10.x specifically

ROCM 5.X SUPPORT

Background:

- Chapel supported ROCm 4.x
- ROCm 5.x was not tested before

Status:

- Unsupported versions generate an error while building Chapel
- 5.0, 5.1: Fully supported
- 5.2-5.4: Supported, but deprecation warnings from clang are expected
 - The way the compiler uses a clang tool to bundle device and host binaries is deprecated
 - We plan to fix this soon
- 5.5+: Not supported
 - These versions require LLVM 16
 - There may be a way to use LLVM 15, or patch it similarly to LLVM 16
 - For now, we are waiting on the LLVM 16 upgrade
- 5.7+: Not supported, but required for 64-bit, signed 'gpuAtomicMax' and 'gpuAtomicMin' support
- See <u>#23480</u> for the most up-to-date status of ROCm 5.x support



PERFORMANCE

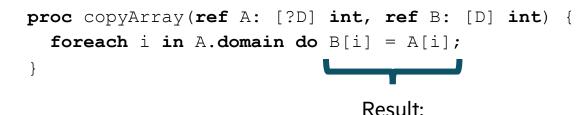
- Faster Array Access
- Peer-to-Peer Access
- <u>Array-On-Device</u>
- <u>Task Parallelism with GPUs</u>
- Faster Math Library Calls
- GPU Specialization

FASTER ARRAY ACCESS IN KERNELS

Background and This Effort

Background:

- Arrays have two layers of indirection to get to underlying data
- Loop Invariant Code Motion (LICM) is an optimization that moves code from inside to outside a loop – Helps avoid repetitive computations that always have the same value (e.g., 1+1).
 - Can be used to move array metadata access, too
- Chapel's LICM optimization is conservative; arrays passed by reference are not considered "constant"



4 metadata accesses per iteration!

This Effort:

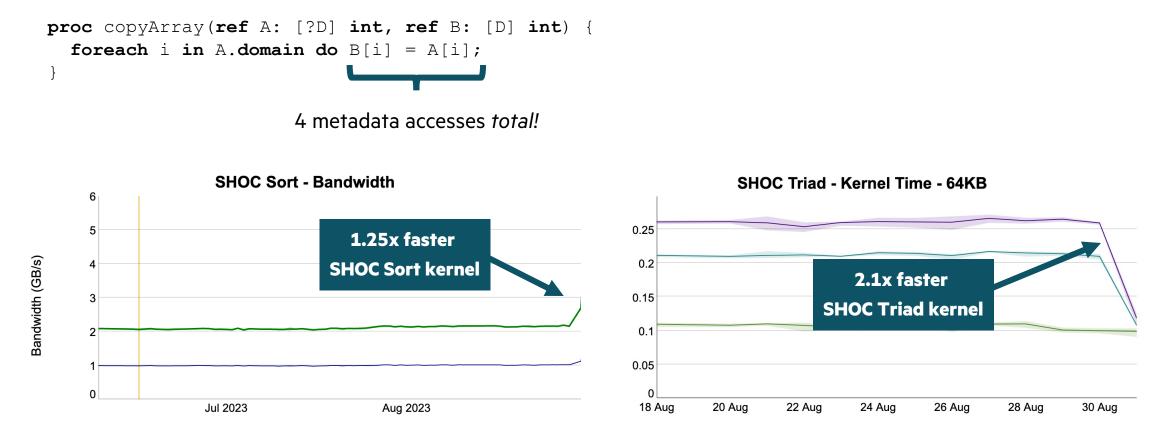
- Arrays passed by reference to GPU kernels won't be changed from outside
 - Relax LICM rules to match



FASTER ARRAY ACCESS IN KERNELS

Impact

• Performance improvements across multiple benchmarks



PEER-TO-PEER ACCESS

Background and This Effort

Background:

- GPUs can communicate directly with one other
 - Can be through PCIe or communication links such as NVLink or Infinity Fabric
- Previously, Chapel's GPU runtime would not enable peer-to-peer communication

This Effort: Create a way to enable peer-to-peer communication

- Added the 'enableGpuP2P' config constant to 'GPU' module
 - To use, run your Chapel program with '--enableGpuP2P=true'

PEER-TO-PEER ACCESS

Impact

Impact: On NVIDIA, we see close to 6x throughput improvement in GPU-to-GPU transfers

- Tables measure 8 GiB transfers on a system with 4 NVIDIA A100-SXM4 GPUs
- Row and column correspond to source and destination GPU
- Each transfer was performed individually

		ghput (eGpuP2F		
	0	1	2	3
0		13.2	11.9	13.3
1	13.2		13.4	13.5
2	13.2	13.3		13.5
3	13.2	13.2	13.4	

Throughput (GiB/s)					
enableGpuP2P=true					
	0	1	2	3	
0		86.2	86.3	86.3	
1	86.1		86.4	86.3	
2	86.6	86.5		86.1	
3	86.6	86.5	86.5		

PEER-TO-PEER ACCESS

Status and Next Steps

Status: While NVIDIA GPUs benefit from '--enableGpuP2P', AMD GPUs do not

- We have observed that AMD conducts peer-to-peer transfers by default
 - On Frontier we see ~10–47 GiB/s transfers in our benchmark regardless of how '--enableGpuP2P' is set
- With AMD, setting 'HSA_ENABLE_SDMA=0' adjusts GPU-to-GPU transfers for higher throughput
 - We observed up to 160 GiB/s transfer rates on Frontier with this setting

Next Steps:

- Find non-artificial benchmarks using peer-to-peer communication
- Further investigate peer-to-peer performance with AMD GPUs and Infinity Fabric
 - Determine if we want Chapel to adjust 'HSA_ENABLE_SDMA'
- Determine if we should allow turning on/off peer-to-peer access on an individual GPU level (<u>#23621</u>)
 - Or allow specifying peer-to-peer communication on an individual put/get basis

ARRAY-ON-DEVICE

Background:

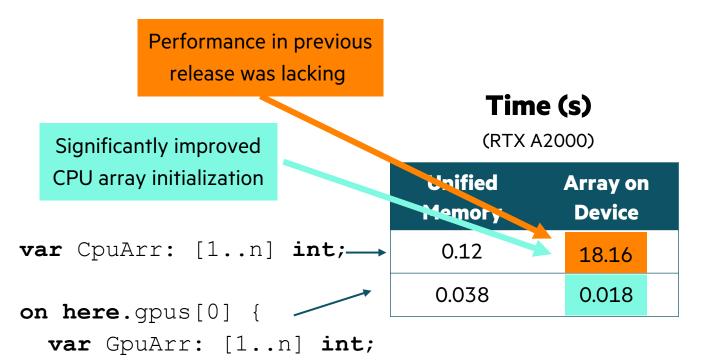
- 'array_on_device' is a memory strategy
 - Faster data transfers and GPU array initialization
 - However, CPU array initialization was sub-optimal

This Effort:

- Significantly improved performance
 - Implemented GPU-aware GET/PUT calls
 - This will also help GPU-driven communication

Status:

- 'array_on_device' performs better
 - -1.2x 14x improvements in nightly testing
- It is the default memory strategy as of 1.32



	Unified Memory	Array on Device
GpuArr = CpuArr;	0.25	0.033
CpuArr = GpuArr;	0.14	0.034

AVOIDING TASK STARVATION

Background

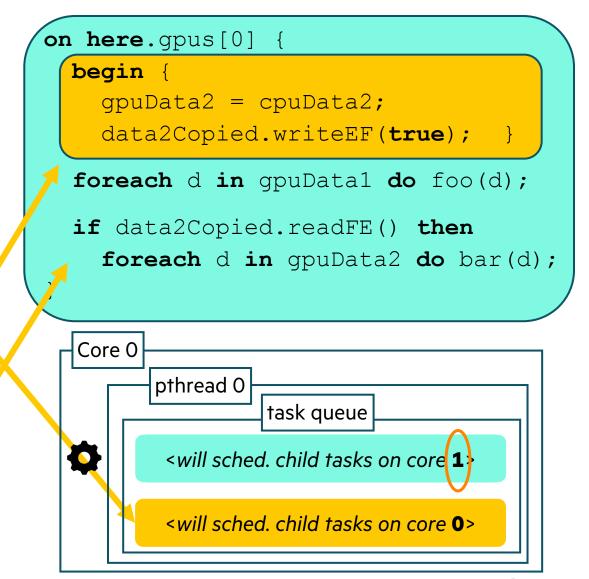
- Communication and computation overlap is:
 - An optimization to make use of different HW units
 - An important technique in GPU programming
- Chapel tasks are a natural way to achieve overlap
 - However, before 1.32 task starvation prevented that

This copy in 'begin' must wait b/c:

- it got scheduled behind the parent task
- current scheduler does not allow task stealing

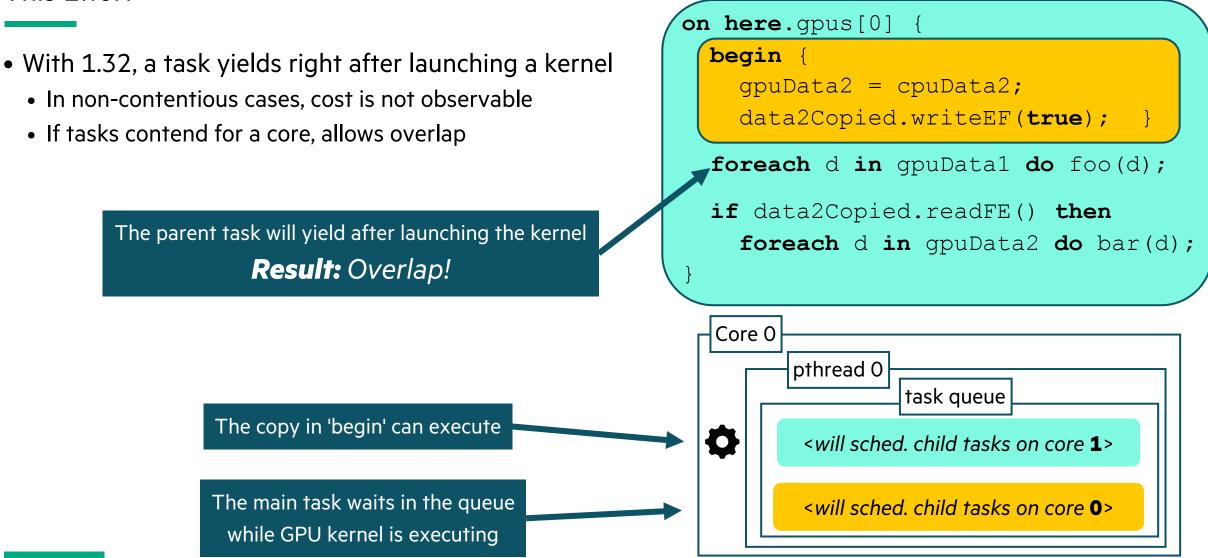
... which will happen only when it hits sync variable read **Result:** No Overlap

Task-private counter determines the core on which child tasks will be scheduled



AVOIDING TASK STARVATION

This Effort



TASK-PARALLEL GPU OPERATIONS

Background

- To overlap communication/computation on a GPU:
 - Data can be split into chunks
 - Multiple CUDA/HIP streams do copy+kernel launch
 - GPU driver can interleave copies with launches – But they must come from different GPU streams
- One way of doing that in Chapel is:
 - Create multiple worker tasks per GPU
 - Have each of them run a loop
 - While picking the next chunk dynamically
 - Until all the chunks are processed
- Before 1.32, this would perform worse
 - Non-overlapped version is faster
 - Regardless of per-task size and/or number of tasks

on here.gpus	[0] {		
coforall wo	rker in ()#numWorker	s {
var DevIn,	DevOut:	[0#tSize]	<pre>real;</pre>

while true {
 // dynamically pick the next chunk
 const myChunkId = curChunk.fetchAdd(1);
 if myChunkId >= numChunks then break;

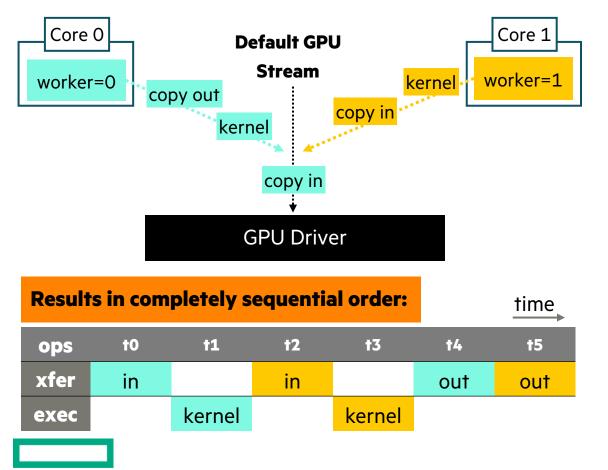
const myChunk = myChunkId*tSize..#tSize;

<pre>DevIn = HostIn[myChunk];</pre>	// copy in
<pre>kernel(DevIn, DevOut);</pre>	// kernel
<pre>HostOut[myChunk] = DevOut;</pre>	// copy out
}	

TASK-PARALLEL GPU OPERATIONS

Background

- Previously, Chapel used the default GPU stream
 - i.e., GPU operations from parallel tasks got serialized



```
on here.gpus[0] {
  coforall worker in 0..#numWorkers {
   var DevIn, DevOut: [0..#tSize] real;
```

while true {

// dynamically pick the next chunk
const myChunkId = curChunk.fetchAdd(1);
if myChunkId >= numChunks then break;

```
const myChunk = myChunkId*tSize..#tSize;
```

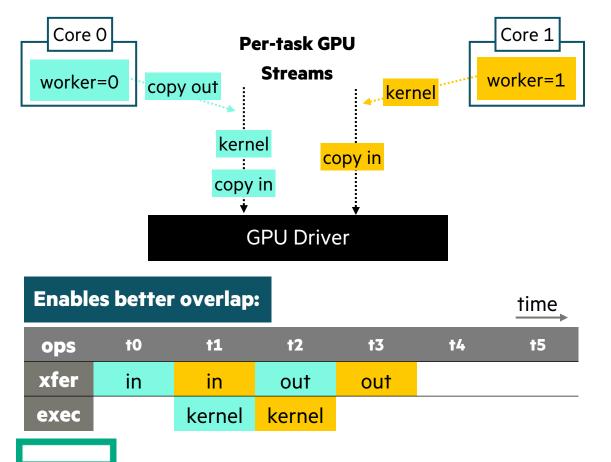
<pre>DevIn = HostIn[myChunk];</pre>	// copy in
<pre>kernel(DevIn, DevOut);</pre>	// kernel
<pre>HostOut[myChunk] = DevOut;</pre>	// copy out

TASK-PARALLEL GPU OPERATIONS

This Effort and Impact

This Effort: Per-task, per-device streams

• Each worker task will have its own GPU stream



```
on here.gpus[0] {
  coforall worker in 0..#numWorkers {
    var DevIn, DevOut: [0..#tSize] real;
```

while true {

// dynamically pick the next chunk
const myChunkId = curChunk.fetchAdd(1);
if myChunkId >= numChunks then break;

```
const myChunk = myChunkId*tSize..#tSize;
```

<pre>DevIn = HostIn[myChunk];</pre>	// copy in
<pre>kernel(DevIn, DevOut);</pre>	// kernel
<pre>HostOut[myChunk] = DevOut;</pre>	// copy out

FASTER MATH LIBRARY CALLS IN KERNELS

Background: Math library calls like 'sqrt' were unexpectedly slower compared to CUDA/HIP

• Reported by a user (<u>#22112</u>)

This Effort: The performance issue is fixed in 1.32

- The compiler was generating calls that were wrapped in some helper functions that should have been inlined
- The root issue was the ordering of device library linkage w.r.t. the LLVM optimization pipeline

Impact: Math library functions perform on-par with CUDA/HIP

• Two mini-applications benefitted from this optimization

	Speedup	
	NVIDIA A100	AMD MI250X
coral	1.80x	1.25x
miniBUDE*	1.82x	1.92x

* https://github.com/xianghao-wang/miniBUDE/tree/benchmark

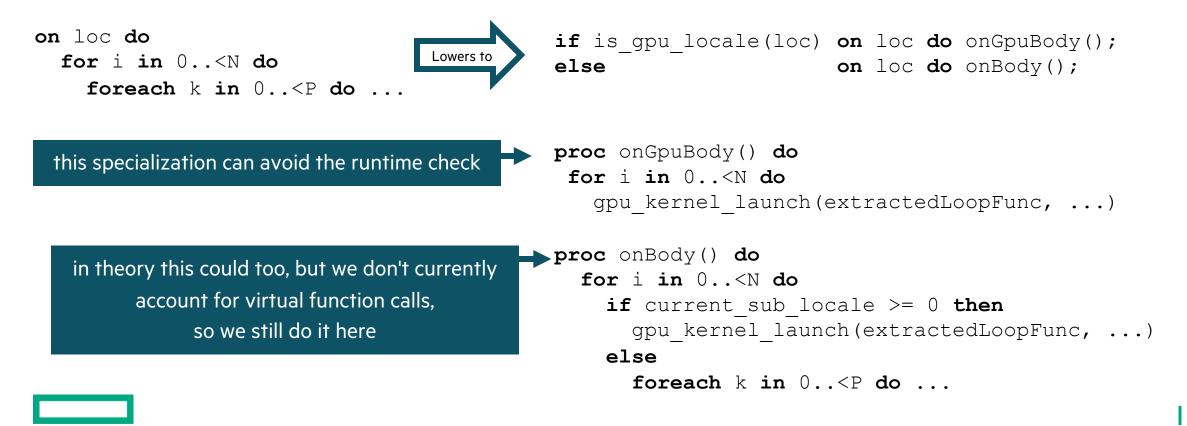
Background

- GPU-eligible loops exhibit different behavior depending on if you are on a GPU locale or not
 - Namely, if we are on a GPU locale then we do a kernel launch
- Checking to see if we are on a GPU adds overhead at every eligible loop
 - Note the repeated execution of the 'if' statement in this example:

<u>Original code:</u>	The compiler "lowers" this to:
on loc do for i in 0 <n do<="" td=""><td>on loc do onBody()</td></n>	on loc do onBody()
foreach k in $0 < P$ do	proc onBody() do
body of 'on' statement is outlined into a function	for i in 0 <n do<="" td=""></n>
since the 'foreach' loop is GPU-eligible, we insert a runtime check to see if we are on a GPU locale. If so, launch it as a kernel.	<pre>if is_gpu_locale(here) then gpu_kernel_launch(extractedLoopFunc,) else foreach k in 0<p do<="" pre=""></p></pre>

This Effort

- Clone functions reachable from 'on' statements into "GPU-specialized" and "non-GPU-specialized" copies
 - Rewrite calls in GPU-specialized functions to call other specialized functions
 - Perform a runtime check to see if you are on a GPU in the 'on' statement; if so, call the cloned function



Impact and Status

Impact: Current limitations prevent us from improving performance

- In an unsafe version, we see a 3x performance improvement
 - Unsafe because it does not rewrite virtual function calls in GPU-specialized functions to call GPU-specialized clones
- In our current safe version of the transform, we do not see a performance improvement
 - Safe because we do not remove 'if' statements from non-GPU-specialized functions
- Adding extra functions also increases compile time (~30% longer in some cases)

Status: The transform is considered experimental and may be beneficial in the future

- It can optionally be turned on by passing '--gpu-specialization' to 'chpl'
- Aside from removing a per-eligible-loop runtime check, the transform may prove useful for other optimizations:
 - specializing reductions on GPU locales
 - less aggressive wide pointer usage

Next Steps

- Study more benchmarks, examining overhead from using the GPU locale model on non-GPU bound code
- Make the transform cognizant of virtual function calls
- Avoid overspecialization when unnecessary
- Explore other kinds of specialization that may not add as much compile-time overhead

SUMMARY & NEXT STEPS

GPU SUPPORT

Summary: Highlights from 1.31 and 1.32

Performance:

- Faster default memory strategy: 1.2x 14x improvement on several benchmarks
- Faster array access in kernels: 1.1x 2x improvement on several benchmarks
- Faster Math library calls: 1.3x 1.9x improvement on two applications
- Can reach peak peer-to-peer bandwidth on Frontier

Portability:

- Feature and performance parity between NVIDIA and AMD targets
- CPU-as-Device mode

Features:

- Atomic operations
- Ability to compile for multiple NVIDIA architectures
- Increased introspection through: '--report-gpu', '--savec' on AMD and improved kernel naming



GPU SUPPORT

Proposed Next Steps for 1.33 and 1.34

Features:

- Foreach intents and better shadowing
- Warp-/wavefront-level functions
 - -warp-synchronization
 - data shuffle
- Initial support for basic whole-array reductions
- Prototype syntax for advanced forall features

Performance:

- Continue investigating low-performance cases
- Investigate non-GPU execution performance
- Outer-loop vectorization for CPU

Portability:

- Improve cpu-as-device behavior parity
- Improve CUDA 12/ROCm 5 support with LLVM 16

Explorations:

- Try using dpc++ as the system LLVM for Intel GPUs
- Start working on GPU-driven communication
- Investigate launching multidimensional grids
- Start improving CPU/GPU portability

OTHER GPU IMPROVEMENTS

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For a more complete list of GPU support changes and improvements in the 1.31 and 1.32 releases, refer to the following sections in the <u>CHANGES.md</u> file:

- 'GPU Computing'
- 'Bug Fixes for GPU Computing'

THANK YOU

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