

Bryce Adelstein Lelbach

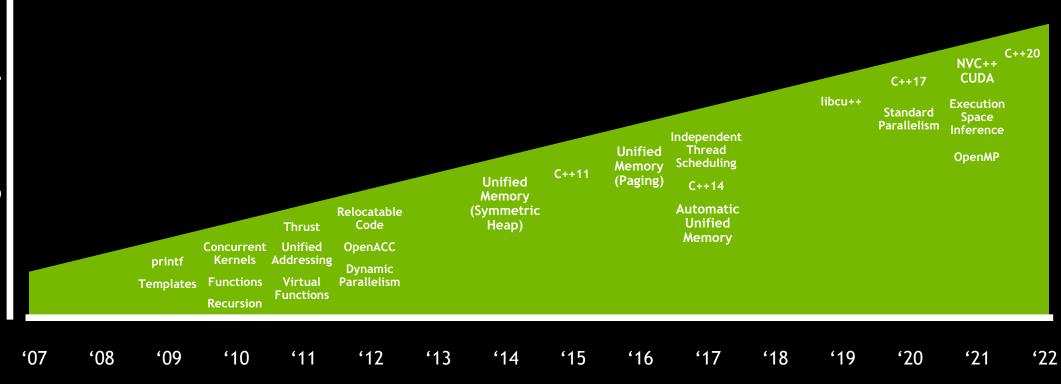
HPC Programming Models Architect

@blelbach

Standard C++ Library Evolution Chair, US Programming Languages Chair



Expanding GPUs Can Do

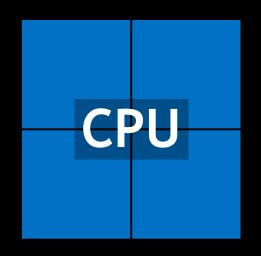


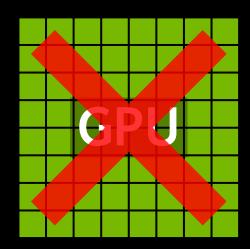


== Core Language + Standard Library

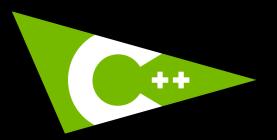
C++ without a Standard Library is severely diminished.

Other C++ Standard Library Implementations

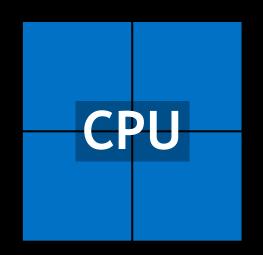


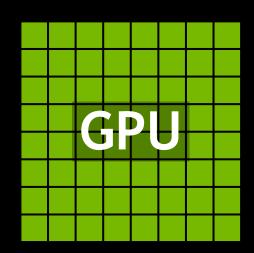


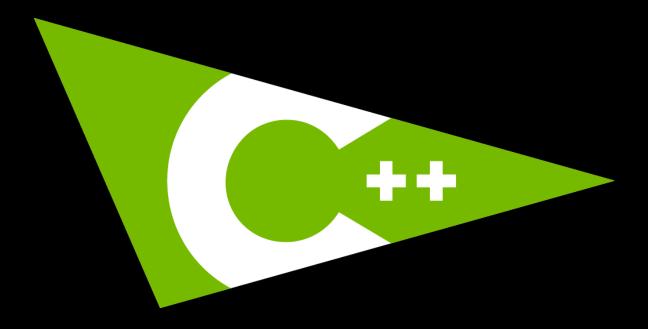




The C++ Standard Library for Your Entire System







The C++ Standard Library for Your Entire System

https://github.com/NVIDIA/libcudacxx



Host Compiler's Standard Library (GCC, MSVC, etc)

```
#include <...> ISO C++, __host__ only.
std:: Complete, strictly conforming to Standard C++.
```

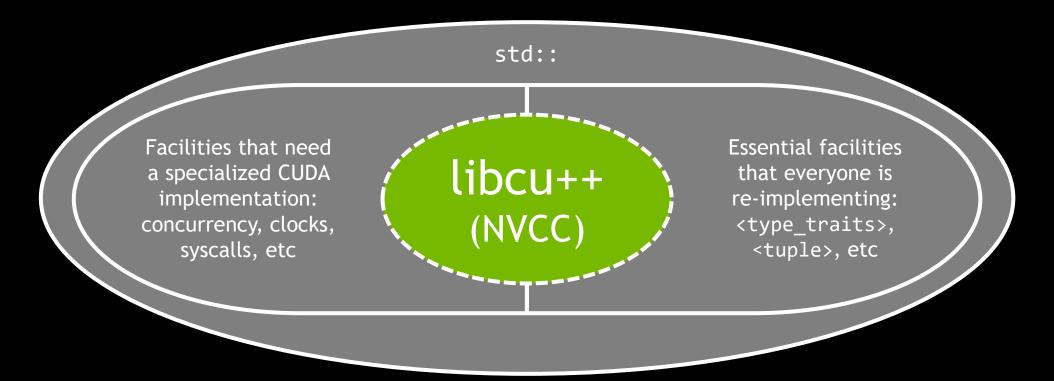
```
#include <cuda/std/...> CUDA C++, __host__ __device__.
cuda::std:: Subset, strictly conforming to Standard C++.

#include <cuda/...> CUDA C++, __host__ __device__.
cuda:: Conforming extensions to Standard C++.

libcu++ (NVCC)
```

libcu++ does not interfere with or replace your host Standard Library.





libcu++ is not a complete Standard Library today. Each release adds more features.



The NVIDIA HPC Compiler



CUDA

4 models





3 languages







1 Compiler for Your

Entire System

2 targets





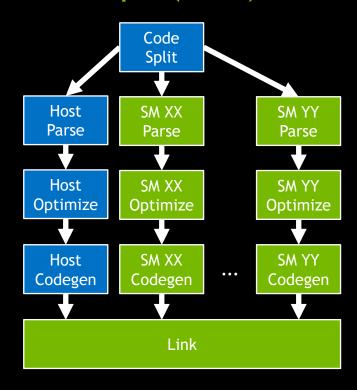
Learn More: Inside NVC++ and NVFORTRAN, Bryce Adelstein Lelbach [S31358]

CUDA C++ for NVC++ Coming soon!

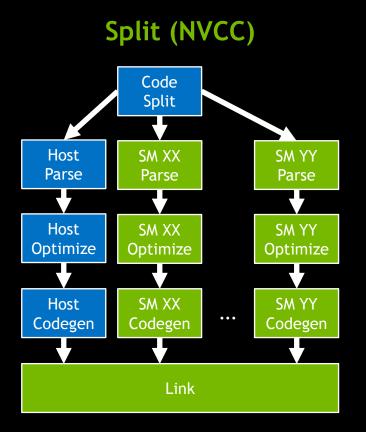
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Heterogeneous Compilation Models

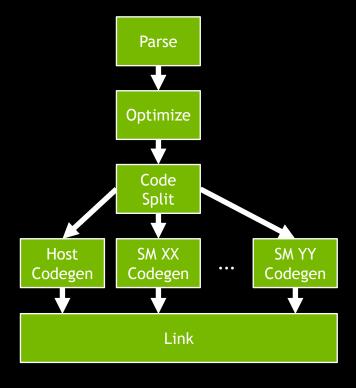
Split (NVCC)



Heterogeneous Compilation Models

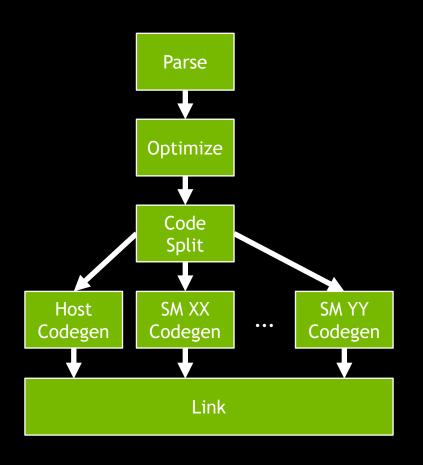


Unified (NVC++)





Why Unified Heterogeneous Compilation?



Greater efficiency: parse, analyze, and optimize once instead of multiple times.

A single canonical representation of code provides greater visibility, analysis, interoperability, and control across host and device code.

- Increased robustness.
- Better diagnostics.
- > Better language support.
- More heterogeneous features.



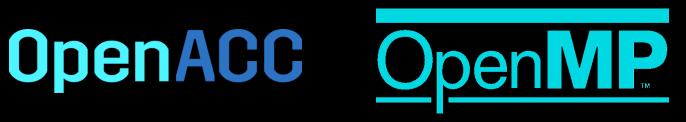




The C++ Standard Library for All Programming Models







Host Compiler's Standard Library (GCC, MSVC, etc)

```
#include <...> ISO C++, __host__ only.
std:: Complete, strictly conforming to Standard C++.
```

```
#include <cuda/std/...> CUDA C++, __host__ __device__.
cuda::std:: Subset, strictly conforming to Standard C++.

#include <cuda/...> CUDA C++, __host__ __device__.
cuda:: Conforming extensions to Standard C++.

libcu++ (NVCC)
```

libcu++ does not interfere with or replace your host Standard Library.

```
#include <...>
std::

#include <cuda/std/...>

#include <cuda/std/...>
CUDA C++, __host__ __device__.

cuda::std::

#include <cuda/...>
CUDA C++, __host__ __device__.

Cuda::std::

#include <cuda/...>
CUDA C++, __host__ __device__.

Cuda::

#include <cuda/...>
Cuda::

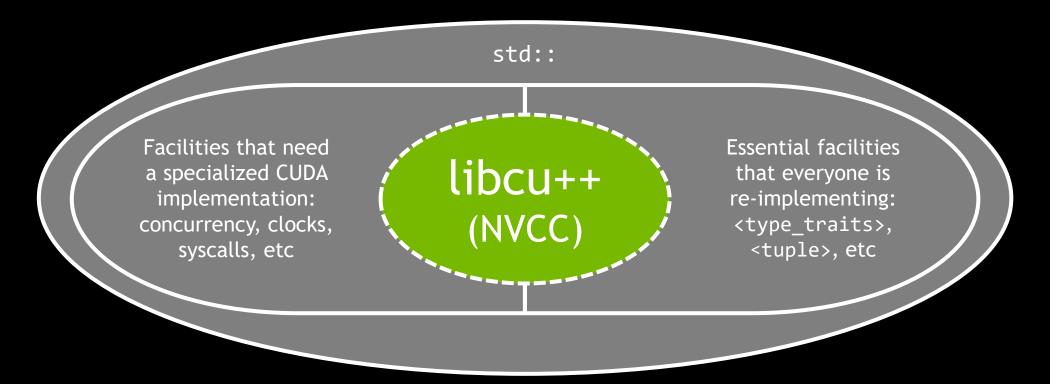
#include <cuda/...>
CUDA C++, __host__ __device__.

Cuda::

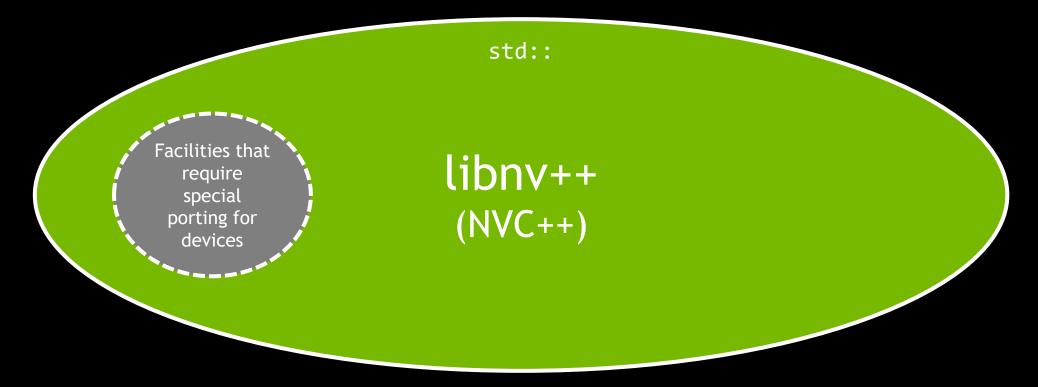
#include <cuda/...>
Cuda::

#include <cuda/.
```

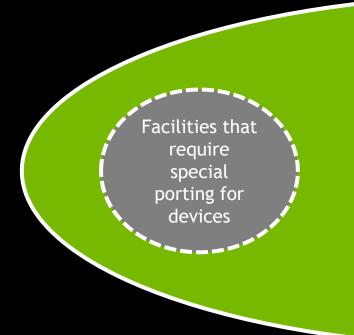
libnv++ is your Standard Library. There is no host Standard Library.



libcu++ is not a complete Standard Library today. Each release adds more.



libnv++ is a complete C++ Standard Library. Everything works on host; most things work on device.



std::

libnv++ (NVC++) It's easier for us to deliver heterogeneous Standard Library features in NVC++:

- We control the entire toolchain.
- We only have to support one compiler frontend.
- NVC++ execution space inference means we don't have to add __host__ and __device__ everywhere.

libnv++ is a complete C++ Standard Library. Everything works on host; most things work on device.

Learn More: Inside NVC++ and NVFORTRAN, Bryce Adelstein Lelbach [S31358]

	std::		cuda::[std::]	
	Host	Device	Host	Device
GCC, MSVC, etc		×	×	×

	std::		cuda::[std::]	
	Host	Device	Host	Device
GCC, MSVC, etc	$\overline{\checkmark}$	×	×	×
libcu++ (NVCC)	×	×		

	std::		cuda::[std::]	
	Host	Device	Host	Device
GCC, MSVC, etc		×	×	×
libcu++ (NVCC)	×	×		V
libnv++ (NVC++)				V

Two Standard Library Choices for NVC++

Coming soon!

std:: is host only.

ABI compatible with GCC.

std:: is heterogeneous.

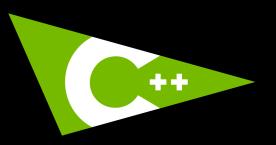
Not ABI compatible with GCC.







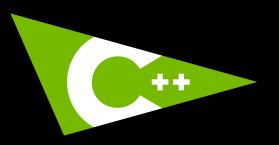
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1.0.0 (CUDA 10.2)

atomic<T> (SM60+)
Type Traits



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1.1.0 (CUDA 11.0)

atomic<T>::wait/notify (SM70+)
barrier (SM70+)
latch (SM70+)
*_semaphore (SM70+)
cuda::memcpy_async (SM70+)
chrono:: Clocks & Durations
ratio<Num, Denom>





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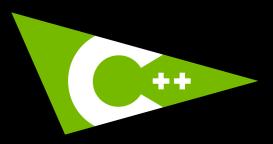
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cuda::pipeline (SM80+)





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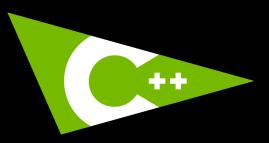
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1.3.0 (CUDA 11.2)

tuple<T0, T1, ...>



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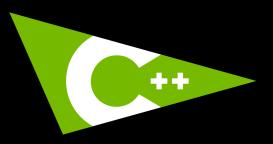
1.3.0 (CUDA 11.2)

tuple<T0, T1, ...>

1.4.1 (CUDA 11.3)

complex byte

chrono:: Dates & Calendars



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cuda::pipeline (SM80+)

1.3.0 (CUDA 11.2)

tuple<T0, T1, ...>

1.4.1 (CUDA 11.3)

complex

byte

chrono:: Dates & Calendars



```
namespace cuda {
enum thread_scope {
  thread_scope_system,
  thread_scope_device,
  thread_scope_block,
  thread_scope_thread
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread_scope {
  thread_scope_system,
  thread_scope_device,
  thread_scope_block,
  thread_scope_thread
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread_scope {
  thread_scope_system,
  thread_scope_device,
  thread_scope_block,
  thread_scope_thread
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread_scope {
  thread_scope_system, // All threads.
  thread_scope_device,
  thread_scope_block,
  thread_scope_thread
};
template <typename T,</pre>
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread scope {
  thread_scope_system, // All threads.
  thread_scope_device, // All threads on the same processor.
  thread_scope_block,
  thread_scope_thread
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread scope {
  thread_scope_system, // All threads.
  thread_scope_device, // All threads on the same processor.
  thread_scope_block, // All threads in a block.
  thread scope thread
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
namespace cuda {
enum thread scope {
  thread_scope_system, // All threads.
  thread scope device, // All threads on the same processor.
  thread_scope_block, // All threads in a block.
  thread_scope_thread // A single thread.
};
template <typename T,
          thread_scope S = thread_scope_system>
struct atomic;
} // namespace cuda
```

```
// In NVCC and NVC++:
namespace cuda::std {
template <typename T>
using atomic = cuda::atomic<T, cuda::thread_scope_system>;
} // namespace cuda::std
// In NVC++ only:
namespace std {
template <typename T>
using atomic = cuda::atomic<T, cuda::thread_scope_system>;
} // namespace std
```

```
__host__ __device__ void
write_then_signal_flag(volatile int& flag, int& data, int v) {
    // ^^^ volatile was "notionally right" in legacy CUDA C++.
    data = v;

// vvv "Works" on some platforms but is UB (volatile != atomic).
    flag = 1;
}
```

```
__host__ __device__ void
write_then_signal_flag(volatile int& flag, int& data, int v) {
    // ^^^ volatile was "notionally right" in legacy CUDA C++.
    data = v;
    __threadfence_system(); // <- Should be fused on the flag store.
    // vvv "Works" on some platforms but is UB (volatile != atomic).
    flag = 1;
}</pre>
```

```
__host__ __device__ void
write_then_signal_flag(int& flag, int& data, int v) {
   data = v;
   __threadfence_system(); // <- Should be fused on the operation.
   atomicExch(&flag, 1); // <- Ideally we want an atomic store.
}</pre>
```

```
__host__ __device__ void
write_then_signal_better(atomic<bool>& flag, int& data, int v) {
   data = v;
   flag = true;
}
```

```
__host__ __device__ void
write_then_signal_even_better(atomic<bool>& flag, int& data, int v) {
   data = v;
   flag.store(true, memory_order_release);
}
```

```
__host__ __device__ void
write_then_signal_excellent(atomic<bool>& flag, int& data, int v) {
   data = v;
   flag.store(true, memory_order_release);
   flag.notify_all();
}
```

```
__host__ __device__ int
poll_then_read(volatile int& flag, int& data) {
    // ^^^ volatile was "notionally right" in legacy CUDA C++.
    // vvv "Works" but is UB (volatile != atomic).
    while (1 != flag)
      ; // <- Spinloop without backoff is bad under contention.
    return data;
}</pre>
```

```
__host__ __device__ int
poll_then_read(volatile int& flag, int& data) {
    // ^^^ volatile was "notionally right" in legacy CUDA C++.
    // vvv "Works" but is UB (volatile != atomic).
    while (1 != flag)
        ; // <- Spinloop without backoff is bad under contention.
        __threadfence_system(); // <- 9 out of 10 of you forget this one!
    return data;
}</pre>
```

```
__host__ __device__ int
poll_then_read(int& flag, int& data) {

while (1 != atomicAdd(flag, 0)) // <- Should be an atomic load.
    ; // <- Spinloop without backoff is bad under contention.
    __threadfence_system(); // <- 9 out of 10 of you forget this one!
    return data;
}</pre>
```

```
__host__ __device__ int
poll_then_read_better(atomic<bool>& flag, int& data) {
  while (!flag)
    ; // <- Spinloop without backoff is bad under contention.
  return data;
}</pre>
```

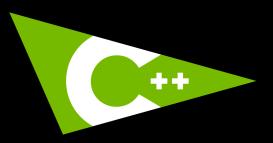
```
__host__ __device__ int
poll_then_read_even_better(atomic<bool>& flag, int& data) {
  while (!flag.load(memory_order_acquire))
    ; // <- Spinloop without backoff is bad under contention.
  return data;
}</pre>
```

```
__host__ __device__ int
poll_then_read_excellent(atomic<bool>& flag, int& data) {
   flag.wait(false, memory_order_acquire);
   // ^^^ Backoff to mitigate heavy contention.
   return data;
}
```

```
__host__ __device__ void increment(int& a) {
    #ifdef __CUDA_ARCH__
        atomicAdd(&a, 1);
    #else
        // What do I write here for all the CPUs & compilers I support?
    #endif
}
```

```
__host__ __device__ void increment_better(atomic<int>& a) {
   a.fetch_add(1, memory_order_relaxed);
}
```

```
// Called by many threads with different inputs and the same bins.
_host__ _device__ void
letter_histogram(string_view in, array<uint64_t, 256>& bins) {
  for (auto c : in)
    atomicAdd(bins[c], 1);
}
```



The NVIDIA C++ Standard Library

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1.0.0 (CUDA 10.2)

atomic<T> (SM60+) Type Traits

1.1.0 (CUDA 11.0)

atomic<T>::wait/notify (SM70+)
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1.2.0 (CUDA 11.1)

cuda::pipeline (SM80+)

1.3.0 (CUDA 11.2)

tuple<T0, T1, ...>

1.4.1 (CUDA 11.3)

complex
byte

chrono:: Dates & Calendars

2.0.0

atomic_ref<T> (SM60+)



std::atomic<T> holds a T.

std::atomic_ref<T> doesn't hold a T;
it holds a reference to a T.

```
template <struct T>
struct atomic {
private:
   T data; // exposition only
public:
   // ...
};
```

```
template <struct T>
struct atomic_ref {
private:
   T& ptr; // Exposition only.
public:
   explicit atomic_ref(T&);

// Same API as std::atomic.
};
```

Coming soon for C++11 and up in the NVIDIA C++ Standard Library.



```
// Called by many threads with different inputs and the same bins.
__host__ __device__ void
letter_histogram_better(string_view in, array<uint64_t, 256>& bins) {
  for (auto c : in)
    atomic_ref(bins[c]).fetch_add(1, memory_order_relaxed);
}
```

Coming soon for C++11 and up in the NVIDIA C++ Standard Library.



Coming soon for C++11 and up in the NVIDIA C++ Standard Library.



```
// In NVCC and NVC++:
namespace cuda::std {
template <typename T>
using atomic_ref = cuda::atomic_ref<T, cuda::thread_scope_system>;
} // namespace cuda::std
// In NVC++ only:
namespace std {
template <typename T>
using atomic_ref = cuda::atomic_ref<T, cuda::thread_scope_system>;
} // namespace std
 Coming soon for C++11 and up in the NVIDIA C++ Standard Library.
```

Stop Using Legacy CUDA Atomics (atomic[A-Z]*):

No direct sequential consistency & acquire/release semantics.

Device-only.

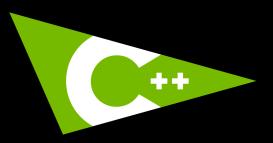
Memory scope is a property of operations, not objects.

Atomicity is a property of operations, not objects.

Stop Using volatile for synchronization:

volatile != atomicity.

volatile is a vague pact; atomic<T> has clear semantics.



The NVIDIA C++ Standard Library

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* semaphore (SM70+)

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chrono:: Clocks & Durations

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cuda::pipeline (SM80+)

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tuple<T0, T1, ...>

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complex byte

chrono:: Dates & Calendars

2.0.0

atomic_ref<T> (SM60+)



```
namespace cuda {
template <thread scope S = thread scope system,
          typename CompletionFunction = see below>
struct barrier {
  using arrival token = see below;
  static constexpr ptrdiff t max() noexcept;
  constexpr explicit barrier(ptrdiff_t expected,
                             CompletionFunction f = CompletionFunction());
  [[nodiscard]] arrival_token arrive(ptrdiff_t update = 1);
  void wait(arrival token&& arrival) const;
  void arrive and wait();
  void arrive and drop();
};
} // namespace cuda
```

```
namespace cuda {
template <thread scope S = thread scope system,
          typename CompletionFunction = see below>
struct barrier {
  using arrival token = see below;
  static constexpr ptrdiff t max() noexcept;
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  [[nodiscard]] arrival_token arrive(ptrdiff_t update = 1);
  void wait(arrival token&& arrival) const;
  void arrive and wait();
  void arrive and drop();
};
} // namespace cuda
```

```
__device__ void sync_block() {
    __syncthreads();
    // Only works in device code and only within blocks.
    // Synchronizes all threads in the block.

// What if I need multiple barriers?
    // What if I only want some threads to participate?
    // What if I want to synchronize across blocks?
    // What if I want to synchronize with the host?
}
```

```
__host__ __device__ void
better_sync_block(barrier<thread_scope_block>& b) {
    b.arrive_and_wait();
}
__host__ __device__ void
better_sync(barrier<thread_scope_system>& b) {
    b.arrive_and_wait();
}
```

```
__host__ __device__ void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
   // ...
}
```

```
__host__ __device__ void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
   // ...
}
```

```
__host__ __device__ void
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```
__host__ __device__ void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
   // ...
}
```

```
__host__ __device__ void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
   for (size_t t = 0; t < steps; ++t) {
        // Get points from neighbors.
        double left = global[i - 1]; // Load from slow memory.
        double right = global[j + 1]; // Load from slow memory.

        // ...
}</pre>
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
  for (size_t t = 0; t < steps; ++t) {
   // Get points from neighbors.
    double left = global[i - 1]; // Load from slow memory.
    double right = global[j + 1]; // Load from slow memory.
   // Solve interior region.
    for (size_t x = 0; x < ((j - i) - 1); ++x)
     local[x] = stencil(local[x - 1], local[x], local[x + 1]);
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
  for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
    double left = global[i - 1]; // Load from slow memory.
    double right = global[j + 1]; // Load from slow memory.
   // Solve interior region.
    for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   __syncthreads(); // Wait until everyone has read their neighbor points.
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   __syncthreads(); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   __syncthreads(); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
   __syncthreads(); // Make sure everyone sees the new boundary points.
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   __syncthreads(); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
    __syncthreads(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve(double* local, double* global, size_t i, size_t j, size_t steps) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   __syncthreads(); // Wait until everyone has read their neighbor points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
    __syncthreads(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_better(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_better(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_better(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_better(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left = global[i - 1]; // Load from slow memory.
   double right = global[j + 1]; // Load from slow memory.
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   global[j] = local[j - i]; // Store to slow memory.
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_excellent(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left, right;
   memcpy async(&left, global + (i - 1), sizeof(double), b);
   memcpy async(&right, global + (j + 1), sizeof(double), b);
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
    for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
    global[i] = local[0]; // Store to slow memory.
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
    global[j] = local[j - i]; // Store to slow memory.
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_excellent(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left, right;
   memcpy async(&left, global + (i - 1), sizeof(double), b);
   memcpy_async(&right, global + (j + 1), sizeof(double), b);
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
    for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
    local[0] = stencil(left, local[0], local[1]);
   memcpy async(global + i, local, sizeof(double), b);
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   memcpy async(global + j, local + (j - i), sizeof(double), b);
   b.arrive_and_wait(); // Make sure everyone sees the new neighbor points.
```

```
host device void
solve_excellent(double* local, double* global, size_t i, size_t j, size_t steps, barrier<>& b) {
 for (size t t = 0; t < steps; ++t) {
   // Get points from neighbors.
   double left, right;
   memcpy async(&left, global + (i - 1), sizeof(double), b);
   memcpy_async(&right, global + (j + 1), sizeof(double), b);
   auto tok = b.arrive(); // Signal that we've read our neighbor's points.
   // Solve interior region.
   for (size_t x = 0; x < ((j - i) - 1); ++x)
      local[x] = stencil(local[x - 1], local[x], local[x + 1]);
   b.wait(move(tok)); // Wait until everyone has read their neighbor points.
   // Solve boundary points and make them visible to neighbors.
   local[0] = stencil(left, local[0], local[1]);
   memcpy async(global + i, local, sizeof(double), b);
   local[j - i] = stencil(local[(j - i) - 1], local[j - i], right);
   memcpy_async(global + j, local + (j - i), sizeof(double), b);
   b.arrive and wait(); // Make sure everyone sees the new neighbor points.
     Learn More: Async GPU Programming in CUDA C++, Vishal Mehta and Gonzalo Brito [E31888]
```

Volta+ NVIDIA GPUs deliver and libcu++ exposes:

C++ Parallel Forward Progress Guarantees.

The C++ Memory Model.

Why does this matter?

Learn More: Designing (New) C++ Hardware, Olivier Giroux [CppCon 2017]

Volta+ NVIDIA GPUs deliver and libcu++ exposes:

C++ Parallel Forward Progress Guarantees.

The C++ Memory Model.

Why does this matter?

Volta+ NVIDIA GPUs and libcu++ enable a wide range of concurrent algorithms & data structures previously unavailable on GPUs.

Progress doesn't depend on scheduler

Progress depends on scheduler

Every thread makes progress

Wait-free

Obstruction-free

Starvation-free

Some thread makes progress

Lock-free

Clash-free

Deadlock-free

Non-Blocking

Blocking



Progress doesn't depend on scheduler

Progress depends on scheduler

Every thread makes progress

Some thread makes progress

Weakly Parallel Forward Progress

Pre Volta NVIDIA GPUs
Other GPUs

Non-Blocking

Starvation-free

Deadlock-free

Blocking



Progress doesn't depend on scheduler

Progress depends on scheduler

Every thread makes progress

Some thread makes progress

Weakly Parallel Forward Progress

Pre Volta NVIDIA GPUs
Other GPUs

Parallel Forward Progress

Only Volta+

Non-Blocking

Blocking



Why does this matter?

Volta+ NVIDIA GPUs and libcu++ enable a wide range of concurrent algorithms & data structures previously unavailable on GPUs.

More concurrent algorithms & data structures means more code can run on modern NVIDIA GPUs!

```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
          typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state type { state empty, state reserved, state filled };
 // ...
 __host__ device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys ;
 Value*
                     values;
 atomic<state type>* states ;
 Hash
                     hash ;
 Equal
                     equal_;
};
```

```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
          typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state type { state empty, state reserved, state filled };
 // ...
 host ___device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys ;
 Value*
                     values;
 atomic<state type>* states ;
 Hash
                     hash ;
 Equal
                     equal_;
};
```

```
template <typename Key, typename Value,
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 // ...
 host ___device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys_;
               values_;
 Value*
 atomic<state type>* states ;
 Hash
                     hash ;
 Equal
                     equal_;
};
```

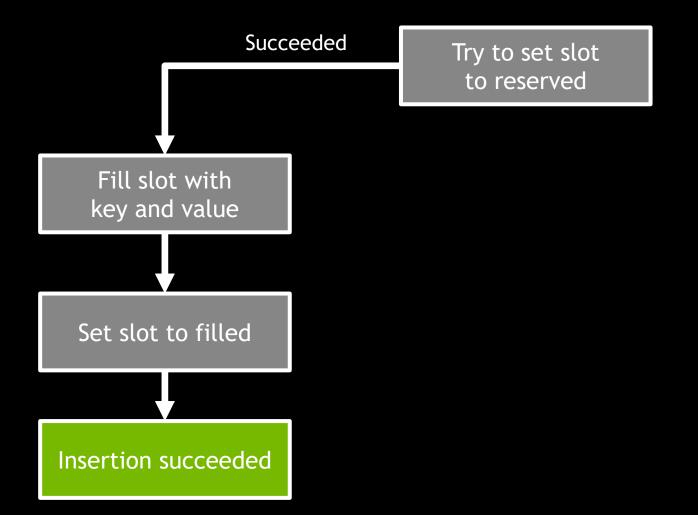
```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
         typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state type { state empty, state reserved, state filled };
 // ...
 __host__ device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys ;
                 values_;
 Value*
 atomic<state type>* states ;
 Hash
                     hash ;
 Equal
                     equal_;
};
```

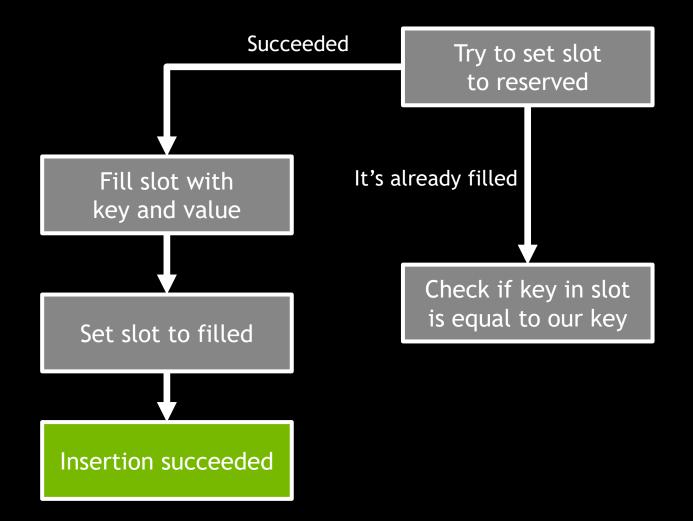
```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
         typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state_type { state_empty, state_reserved, state_filled };
 // ...
 host ___device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys ;
 Value*
               values ;
 atomic<state_type>* states_;
 Hash
                     hash;
 Equal
                     equal_;
};
```

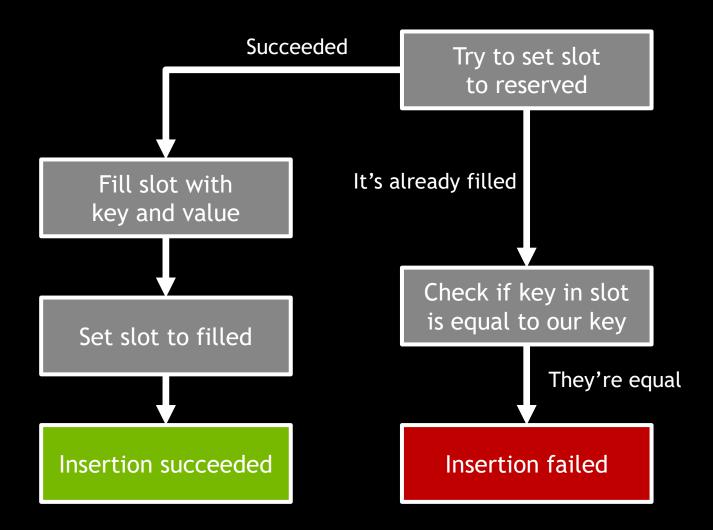
```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
         typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state type { state empty, state reserved, state filled };
 // ...
 host ___device__ Value* try_insert(Key const& key, Value const& value);
private:
 uint64 t
                capacity_;
 Key*
                     keys ;
 Value*
                     values;
 atomic<state type>* states ;
 Hash
                     hash;
 Equal
                     equal_;
};
```

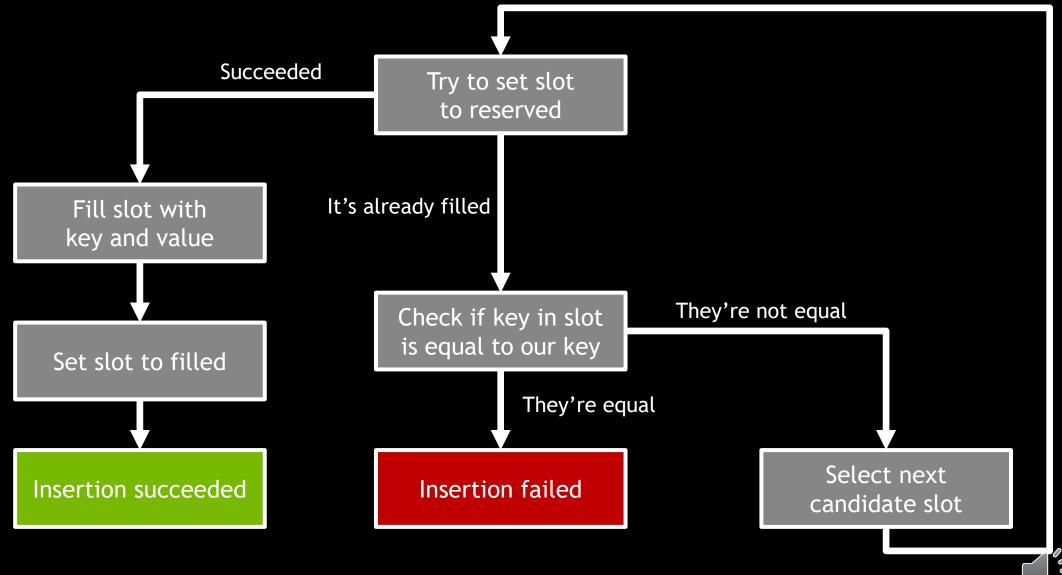
```
template <typename Key, typename Value,
         typename Hash = hash<Key>,
          typename Equal = equal to<Key>>
struct concurrent insert only map {
  enum state type { state empty, state reserved, state filled };
 // ...
 host device Value* try insert(Key const& key, Value const& value);
private:
 uint64 t
                     capacity_;
 Key*
                     keys ;
 Value*
                     values;
 atomic<state type>* states ;
 Hash
                     hash ;
 Equal
                     equal_;
};
```

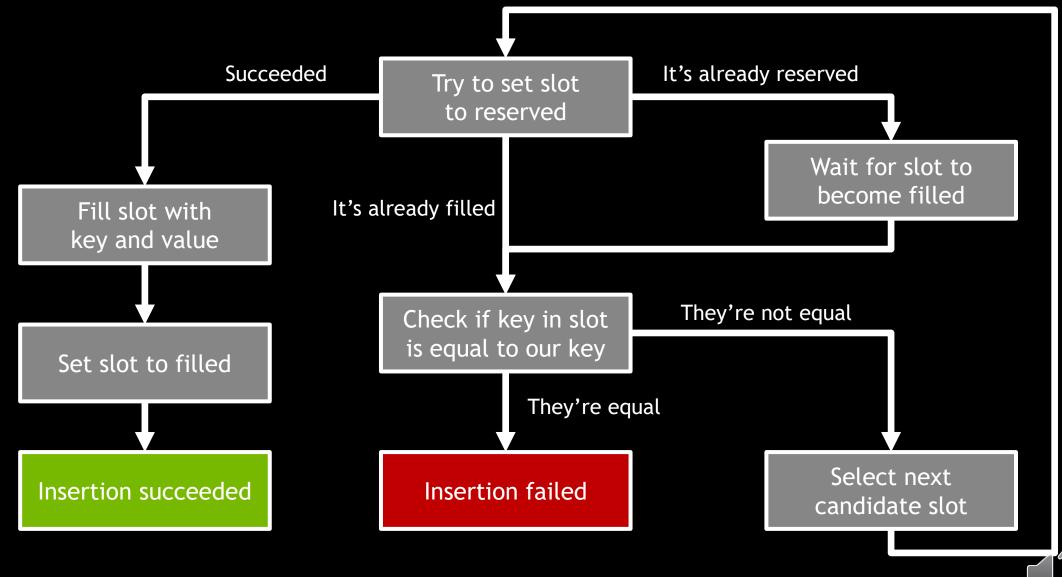
Try to set slot to reserved











```
struct concurrent_insert_only_map {
   __host__ __device__ Value* try_insert(Key const& key, Value const& value) {
        auto index(hash_(key) % capacity_);
        // ...
    }
};
```

```
struct concurrent_insert_only_map {
    _host__ _device__ Value* try_insert(Key const& key, Value const& value) {
    auto index(hash_(key) % capacity_);
    for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
        // ...
    }
    return nullptr; // If we are here, the container is full.
}
</pre>
```

```
struct concurrent_insert_only_map {
    _host__ _device__ Value* try_insert(Key const& key, Value const& value) {
    auto index(hash_(key) % capacity_);
    for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
        // ...
    }
    return nullptr; // If we are here, the container is full.
}
</pre>
```

```
struct concurrent_insert_only_map {
   host __device__ Value* try_insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
      state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
       if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
     state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
       if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
         return values + index;
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
     state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
       if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state filled, memory order release); // Unlock the slot.
         return values + index;
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
     state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
       if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
          states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
     state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
       if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
          states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
      state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
        if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
         states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
      } // If we didn't fill the slot, wait for it to be filled and check if it matches.
     while (state filled != states [index].load(memory order acquire))
     // ...
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
      state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
        if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
         states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
      } // If we didn't fill the slot, wait for it to be filled and check if it matches.
     states_[index].wait(state_reserved, memory_order_acquire);
     // ...
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
      state type old = states [index].load(memory order acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
        if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
         states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
      } // If we didn't fill the slot, wait for it to be filled and check if it matches.
     states [index].wait(state_reserved, memory_order_acquire);
     if (equal_(keys_[index], key)) return values_ + index; // Someone else inserted.
     // ...
   return nullptr; // If we are here, the container is full.
};
```

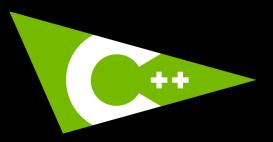
```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
   auto index(hash_(key) % capacity_);
   for (uint64_t i = 0; i < capacity_; ++i) { // Linearly probe up to `capacity_` times.
      state type old = states [index].load(memory_order_acquire);
     while (old == state_empty) { // As long as the slot is empty, try to lock it.
        if (states [index].compare exchange weak(old, state reserved, memory order acq rel)) {
         // We locked it by setting the state to `state reserved`; now insert the key & value.
         new (keys + index) Key(key);
         new (values + index) Value(value);
         states [index].store(state_filled, memory_order_release); // Unlock the slot.
         states_[index].notify_all(); // Wake up anyone who was waiting for us to fill the slot.
         return values + index;
      } // If we didn't fill the slot, wait for it to be filled and check if it matches.
     states [index].wait(state_reserved, memory order_acquire);
     if (equal (keys [index], key)) return values + index; // Someone else inserted.
      index = (index + 1) % capacity ; // Collision: keys didn't match. Try the next slot.
   return nullptr; // If we are here, the container is full.
};
```

```
struct concurrent_insert_only_map {
   host device Value* try insert(Key const& key, Value const& value) {
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     states [index].wait(state_reserved, memory order_acquire);
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      index = (index + 1) % capacity ; // Collision: keys didn't match. Try the next slot.
   return nullptr; // If we are here, the container is full.
};
```

There's a whole new world of algorithms and data structures that can be accelerated with Volta+ NVIDIA GPUs using the NVIDIA C++ Standard Library.

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Learn More: https://github.com/NVIDIA/cuCollections



The NVIDIA C++ Standard Library

https://github.com/NVIDIA/libcudacxx

1.0.0 (CUDA 10.2)

atomic<T> (SM60+) Type Traits

1.1.0 (CUDA 11.0)

atomic<T>::wait/notify (SM70+)
barrier (SM70+)
latch (SM70+)
*_semaphore (SM70+)
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chrono:: Clocks & Durations
ratio<Num, Denom>

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tuple<T0, T1, ...>

1.4.1 (CUDA 11.3)

complex
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chrono:: Dates & Calendars

2.0.0

atomic_ref<T> (SM60+)
Memory Resources & Allocators



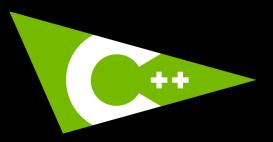
```
namespace cuda {
enum class memory kind {
 memory kind host // Memory accessible only from host.
 memory kind device, // Memory accessible only from device.
 memory kind unified, // Memory accessible from host & device.
 memory kind pinned, // Memory accessible from host & device, but page-locked to host.
};
template <memory kind Kind>
class memory_resource; // Type agnostic allocation. Owns state.
template <typename T, memory kind Kind>
class allocator; // Typed allocation. Handle to a memory resource.
template <memory kind Kind>
class stream_ordered_memory_resource; // Asynchronous allocation (cudaMallocAsync).
template <typename T, memory kind Kind>
class stream ordered allocator; // Asynchronous allocation (cudaMallocAsync).
  // namespace cuda
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template <typename T, memory kind Kind>
class stream ordered allocator; // Asynchronous allocation (cudaMallocAsync).
  // namespace cuda
```

```
namespace cuda {
enum class memory kind {
 memory kind host // Memory accessible only from host.
 memory kind_device, // Memory accessible only from device.
 memory_kind_unified, // Memory accessible from host & device.
 memory kind pinned, // Memory accessible from host & device, but page-locked to host.
};
template <memory kind Kind>
class memory_resource; // Type agnostic allocation. Owns state.
template <typename T, memory kind Kind>
class allocator; // Typed allocation. Handle to a memory resource.
template <memory kind Kind>
class stream_ordered_memory_resource; // Asynchronous allocation (cudaMallocAsync).
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 memory kind host // Memory accessible only from host.
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class stream_ordered_allocator; // Asynchronous allocation (cudaMallocAsync).
  // namespace cuda
```



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tuple<T0, T1, ...>

1.4.1 (CUDA 11.3)

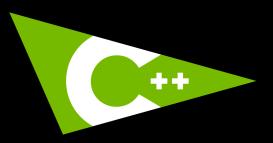
complex
byte
chrono:: Dates & Calendars

2.0.0

atomic_ref<T> (SM60+)
Memory Resources & Allocators
cuda::stream view



```
namespace cuda {
// Non-owning wrapper of a cudaStream t.
struct stream view {
  constexpr stream_view(cudaStream_t stream) : __stream{stream} {}
  stream view(int) = delete;  // Disallow construction from 0 or
  stream_view(std::nullptr_t) = delete; // nullptr to prevent ambiguity.
  constexpr cudaStream_t get() const noexcept { return __stream; }
private:
  cudaStream_t __stream{0};
};
} // namespace cuda
```



The NVIDIA C++ Standard Library

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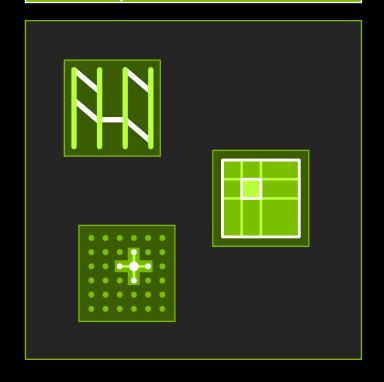
Future

Executors
Range Factories & Adaptors
Parallel Range Algorithms
Parallel Linear Algebra Algorithms
mdspan<T, ...>



Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries

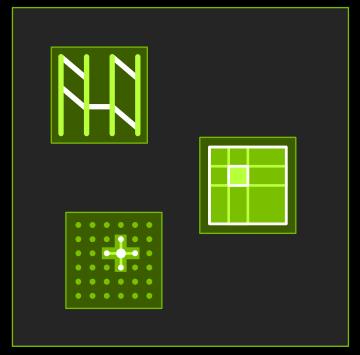




Standard Parallelism

Common Algorithms that Dispatch to **Vendor-Optimized Parallel Libraries**

Tools to Write Your Own Parallel Algorithms that Run Anywhere



```
sender auto
algorithm (sender auto s) {
  return s | bulk(N,
   [] (auto data) {
      // ...
    | bulk(N,
    [] (auto d: ____) {
```

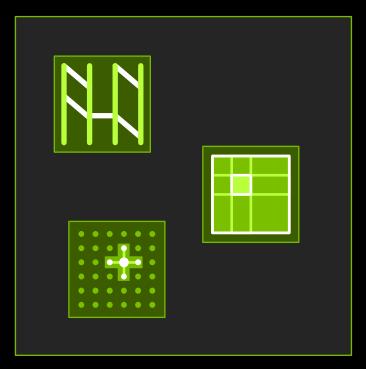


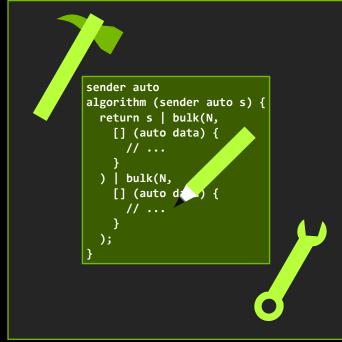
Standard Parallelism

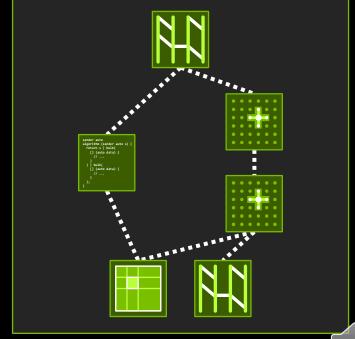
Common Algorithms that Dispatch to **Vendor-Optimized Parallel Libraries**

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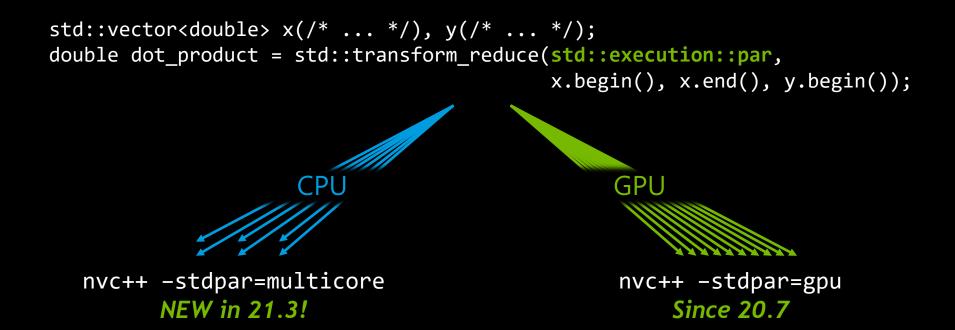
Mechanisms for Composing Parallel **Invocations into Task Graphs**







Standard Parallel Algorithms



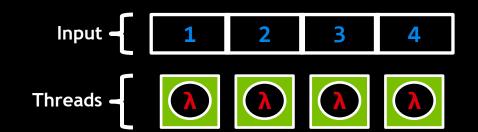
Learn More: Inside NVC++ and NVFORTRAN, Bryce Adelstein Lelbach [S31358]



Iterating Indices

CUDA C++

```
thrust::counting_iterator b(1);
thrust::counting iterator e(N);
thrust::for_each(b, e,
  [] (auto idx) { /* ... */ });
```







Iterating Indices

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thrust::counting_iterator_b(1);
thrust::counting iterator e(N);
thrust::for each(b, e,
  [] (auto idx) { /* ... */ });
```

Standard C++20

```
auto v = std::views:iota(1, N);
std::for each(
  std::execution::par,
  begin(v), end(v),
  [] (auto idx) { /* ... */ });
```















Iterating Indices

CUDA C++

Standard C++ (With Parallel Ranges)

```
thrust::counting_iterator_b(1);
thrust::counting iterator e(N);
thrust::for each(b, e,
                                                 std::ranges::for each(
  [] (auto idx) { /* ... */ });
                                                   std::execution::par,
                                                   std::views::iota(1, N),
                                                   [] (auto idx) { /* ... */ });
                     Threads - \(\lambda\) \(\lambda\) \(\lambda\)
```

On the C++2x and NVIDIA C++ Standard Library roadmap!





Iterating Multi-Dimensional Indices With C++23

```
std::span A(/*...*/);
std::span B(/*...*/);
auto v = std::views::cartesian product(
  std::views::iota(0, N),
  std::views::iota(0, M));
std::for each(std::execution::par,
  begin(v), end(v),
  [=] (auto idx) {
    auto [i, j] = idx;
   B[i * M + j] = A[j * N + i];
  });
```

On the C++23 and NVIDIA C++ Standard Library roadmap!





Composition and Asynchrony

CUDA C++

Standard C++20

```
thrust::transform_iterator b(begin(x), f);
thrust::transform_iterator e(begin(x), f);
                                              auto v = std::views::transform(x, f);
thrust::for each(std::execution::par,
                                              std::for each(std::execution::par,
                                                            begin(v), end(v), g);
                b, e, g);
                              x[0] x[1] x[2] x[3]
                    Threads -
```





Composition and Asynchrony

CUDA C++

```
template <typename U, typename C>
__global__ transform(U* u, size_t N, C c) {
  auto i = blockIdx.x*blockDim.x+threadIdx.x;
 if (i < N) u[i] = c(u[i]);
transform <<<((N-1)/128)+1, 128>>>(u, N, f);
transform <<<((N-1)/128)+1, 128>>>(u, N, g);
transform <<<((N-1)/128)+1, 128>>>(u, N, h);
cudaError t err = cudaDeviceSynchronize();
assert(err == cudaSuccess);
```

Standard C++20

```
std::span u(/*...*/);
auto v = u
          std::views::transform(f)
std::views::transform(g);
std::for_each(std::execution::par,
                 begin(v), end(v), h);
```



Standard Linear Algebra

```
std::mdspan A(/* ... */, N, M);
std::mdspan x(/* ... */, M);
std::mdspan y(/* ... */, N);
// y = 3.0 * A * x + 2.0 * y
std::matrix_vector_product(
  std::execution::par,
  std::scaled view(3.0, A), x,
  std::scaled_view(2.0, y), y);
```

A modern Standard C++ abstraction based on the BLAS.

Portable interface to both sequential and parallel linear algebra libraries on whatever platform you are on. On NVIDIA platforms, accelerated by cuBLAS, cuTENSOR and **NVIDIA Tensor Cores.**

std::mdspan: non-owning multidimensional span type.

On the C++2x and NVIDIA C++ Standard Library roadmap!



```
std::span v(/* ... */);
std::sender auto s = std::schedule(cuda::executor)
        std::bulk(N,
           [](auto idx)
           { if (idx > 0) v[idx] += v[idx - 1]; })
        std::bulk(N,
           [](auto idx)
           { v[idx] *= v[idx]; });
```

std::sync wait(s);

Executors are a portable abstraction for composing and managing tasks.

They support both lazy and eager execution.

They provide a way to author kernels in Standard C++ that can run on any system.

On the C++2x and NVIDIA C++ Standard Library roadmap!



```
Executors parameterize execution
std::span v(/* ... */);
                                 resources, allowing us to write
                                 code that can run anywhere.
std::sender auto s = std::schedule(cuda::executor)
         std::bulk(N,
            [](auto idx)
            { if (idx > 0) v[idx] += v[idx - 1]; })
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std::sync wait(s);
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Executors are a portable abstraction for composing and managing tasks.

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Senders represent asynchronous work that will be ready later (generalization of std::future). Executors parameterize execution resources, allowing us to write code that can run anywhere.

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std::sender auto s = std::schedule(cuda::executor)
        std::bulk(N,
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[](auto idx)

{ v[idx] *= v[idx]; });

Executors parameterize execution resources, allowing us to write code that can run anywhere.

Executors are a portable abstraction for composing and

```
std::sender auto s = std::schedule(cuda::executor)
        std::bulk(N,
                                                     Sender Factories and Adaptors
             [](auto idx)
                                           sender schedule(executor e);
                                                                     Start a chain of work on
                                                                                         lnd
             { if (idx > 0) v[idx] +=
                                                                     executor e (factory).
                                                                 cager execution.
        std::bulk(N,
```

std::sync wait(s);

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       std::bulk(N,
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```

std::bulk(N,

[](auto idx)

{ v[idx] *= v[idx]; });

Sender Factories and Adaptors sender schedule(executor e); Start a chain of work on lnd executor e (factory). sender bulk(sender last, Spawn n tasks that call f after last has completed shape n, lithor invocable f); (adaptor).

> kernels in Standard C++ that can run on any system.

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   [](auto idx)
   { if (idx > 0) v[idx] +=
std::bulk(N,
   [](auto idx)
   { v[idx] *= v[idx]; });
```

```
std::sync wait(s);
```

Sender Factories and Adaptors		
sender schedule(executor e);	Start a chain of work on executor e (factory).	nd
sender bulk(sender last, shape n, invocable f);	Spawn n tasks that call f after last has completed (adaptor).	utho
sender just(T t);	Pass the value t to the next work item (factory).	that





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std::sender auto s = std::schedule(cuda::executor)

```
| std::bulk(N,
      [](auto idx)
      { if (idx > 0) v[idx] +=
| std::bulk(N,
      [](auto idx)
      { v[idx] *= v[idx]; });
```

```
std::sync_wait(s);
```

Sender Factories and Adaptors		
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sender bulk(sender last, shape n, invocable f);	Spawn n tasks that call f after last has completed (adaptor).	uthor
<pre>sender just(T t);</pre>	Pass the value t to the next work item (factory).	that
sender then(sender last, invocable f);	Call f with after last has completed (adaptor).	



Senders represent asynchronous work that will be ready later (generalization of std::future).

std::sync wait(s);

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sender bulk(sender last, shape n, invocable f);	().	uth
sender just(T t);	Pass the value t to the next work item (factory).	tha
sender then(sender last, invocable f);	Call f with after last has completed (adaptor).	
sender on(sender last, executor e);	Switch to executor e for the next work item (adaptor).	



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  { if (idx > 0) v[idx] +=
std::bulk(N,
  [](auto idx)
  { v[idx] *= v[idx]; });
```

operator creates a sender dependent on another sender. h = h(g(f()))

Sender Factories and Adaptors		
<pre>sender schedule(executor e);</pre>	Start a chain of work on executor e (factory).	nd
sender bulk(sender last, shape n, invocable f);		uthor
<pre>sender just(T t);</pre>	Pass the value t to the next work item (factory).	that
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sender on(sender last, executor e);	Switch to executor e for the next work item (adaptor).	

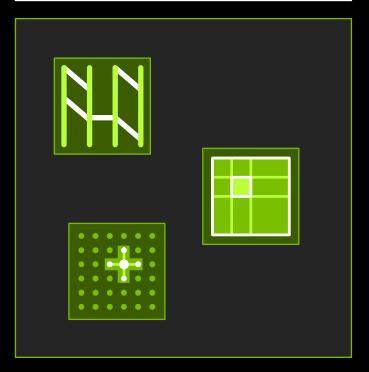


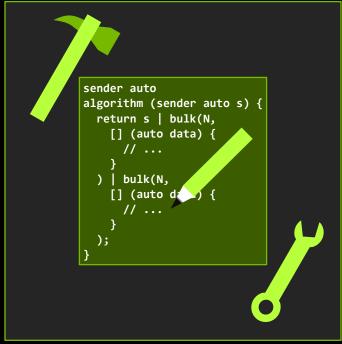
Standard Parallelism

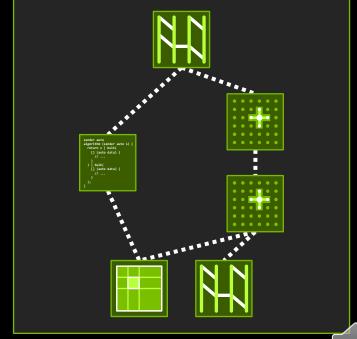
Common Algorithms that Dispatch to **Vendor-Optimized Parallel Libraries**

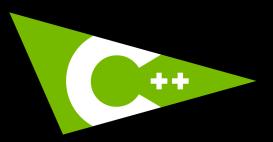
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Memory Resources & Allocators
cuda::stream_view

Future

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Range Factories & Adaptors
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Parallel Linear Algebra Algorithms
mdspan<T, ...>
...



Learn More

Inside NVC++ and NVFORTRAN, Bryce Adelstein Lelbach [S31358]

A Deep Dive into the Latest HPC Software, Tim Costa [S31286]

CUDA: New Features and Beyond, Stephen Jones [S31857]

Thrust, CUB, and libcu++ User's Forum [CWES1801]

Thrust and the C++ Standard Algorithms, Conor Hoekstra [S31532]

Asynchronous GPU Programming in CUDA C++, Vishal Mehta and Gonzalo Brito [E31888]

Present and Future of Accelerated Computing Programming Approaches [S31146]

Future of Standard and CUDA C++ [CWES1802]

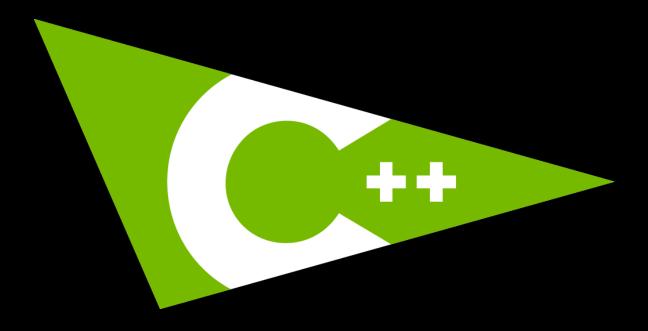
Controlling Data Movement to Boost Performance on NVIDIA Ampere [Blog Post]

Designing (New) C++ Hardware, Olivier Giroux [CppCon 2017]

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https://github.com/NVIDIA/cuCollections





The C++ Standard Library for Your Entire System

https://github.com/NVIDIA/libcudacxx



