

STANDARD PARALLELISM

Bryce Adelstein Lelbach

 @blelbach

 **NVIDIA.** HPC Programming Models Architect

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



Conventions

```
#include <C++>
```

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Conventions

```
namespace stdv = std::views;
```

```
namespace stdr = std::ranges;
```

```
namespace ex = std::execution;
```

```
namespace this_thread = std::this_thread;
```



Conventions

```
namespace stdv = std::views;  
namespace stdr = std::ranges;  
namespace ex = std::execution;  
namespace this_thread = std::this_thread;
```

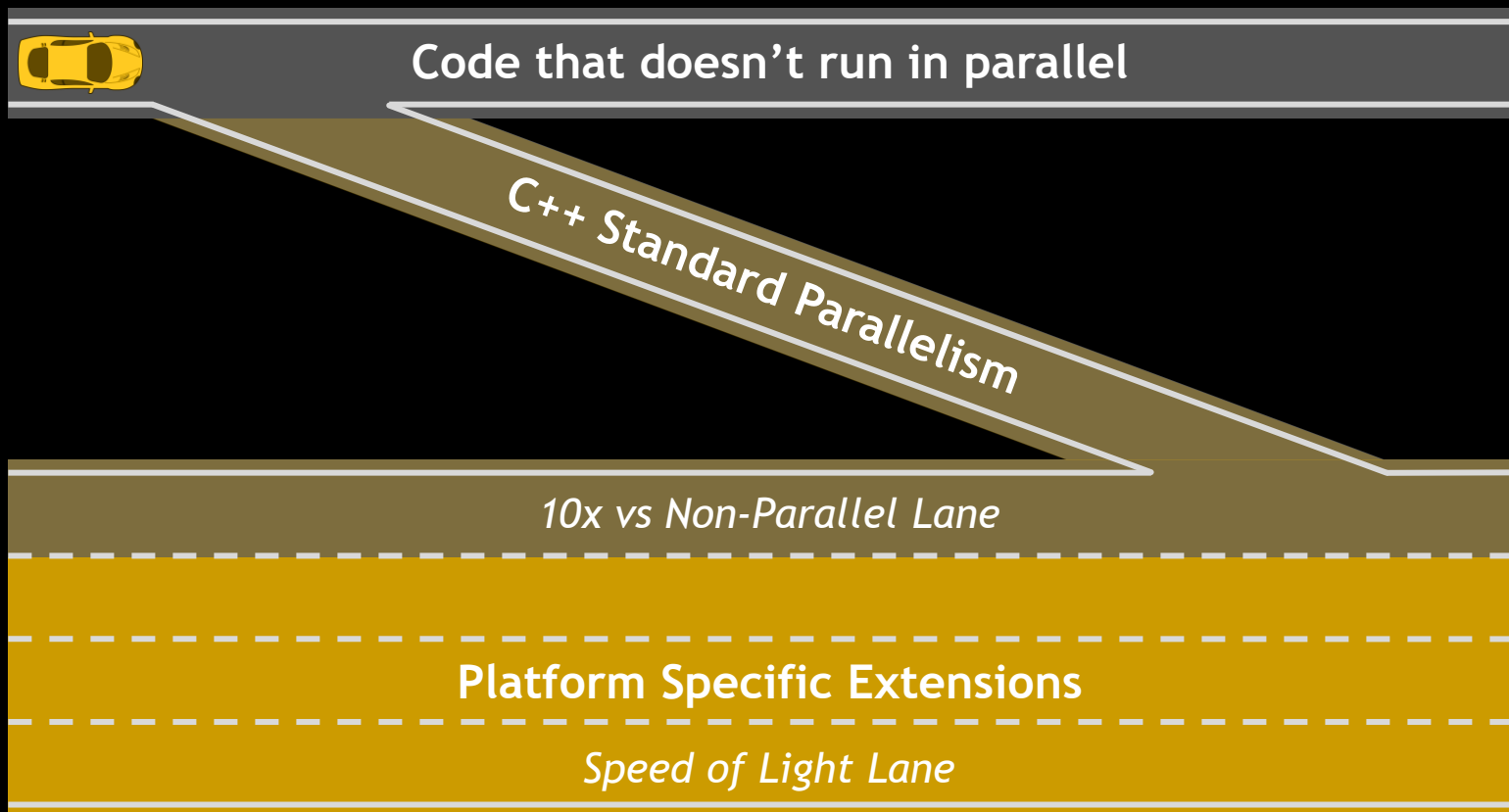
Class Template Argument Deduction (CTAD)

```
std::tuple t{3.14, 42}; → std::tuple<double, int>
```

```
std::array a{0, 1, 1, 0}; → std::array<int, 4>
```



We Need On-Ramps



What Makes Portable?

```
#include <C++>
```

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What Makes Portable?

Non-8-bit char

Noncommittal sizeof

Non-2's comp int

Non-IEEE float

Non-endian pointers

Aligned addressing

Segmented memory



What Makes Portable?

	Important in the 20 th century?
Non-8-bit char	<input checked="" type="checkbox"/>
Noncommittal sizeof	<input checked="" type="checkbox"/>
Non-2's comp int	<input checked="" type="checkbox"/>
Non-IEEE float	<input checked="" type="checkbox"/>
Non-endian pointers	<input checked="" type="checkbox"/>
Aligned addressing	<input checked="" type="checkbox"/>
Segmented memory	<input checked="" type="checkbox"/>



What Makes Portable?

	Important in the 20 th century?	Important in the 21 st century?
Non-8-bit char	✓	✗
Noncommittal sizeof	✓	✗
Non-2's comp int	✓	✗
Non-IEEE float	✓	✗
Non-endian pointers	✓	✗
Aligned addressing	✓	✓
Segmented memory	✓	✓



The New Portability Contract

- Memory Model
- Execution Model
- Forward Progress Guarantees
- Concurrency Primitives



The New Portability Contract

- Memory Model
- Execution Model
- Forward Progress Guarantees
- Concurrency Primitives
- *Parallelism Primitives*
- *Asynchrony Model*



The  Standard is
descriptive, not prescriptive.

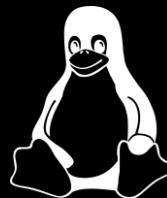
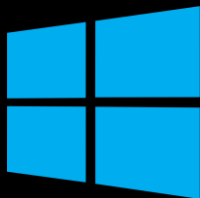


Domain A

Domain B

Domain C

The Standard specifies
enough to be portable and
consistent across platforms.



#include <C++>

Domain A

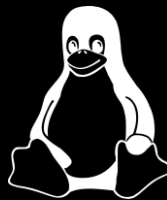
Domain B

Domain C

The Standard specifies
enough to be portable and
consistent across platforms.



The Standard grants enough
freedom for each platform
to choose the right design.



Implementation Freedom

Domain A

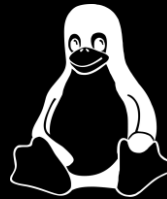
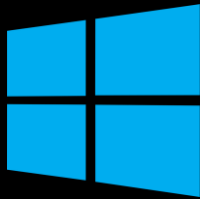
Domain B

Domain C

The Standard specifies enough to be portable and consistent across platforms.



The Standard grants enough freedom for each platform to choose the right design.



```
#include <C++>
```

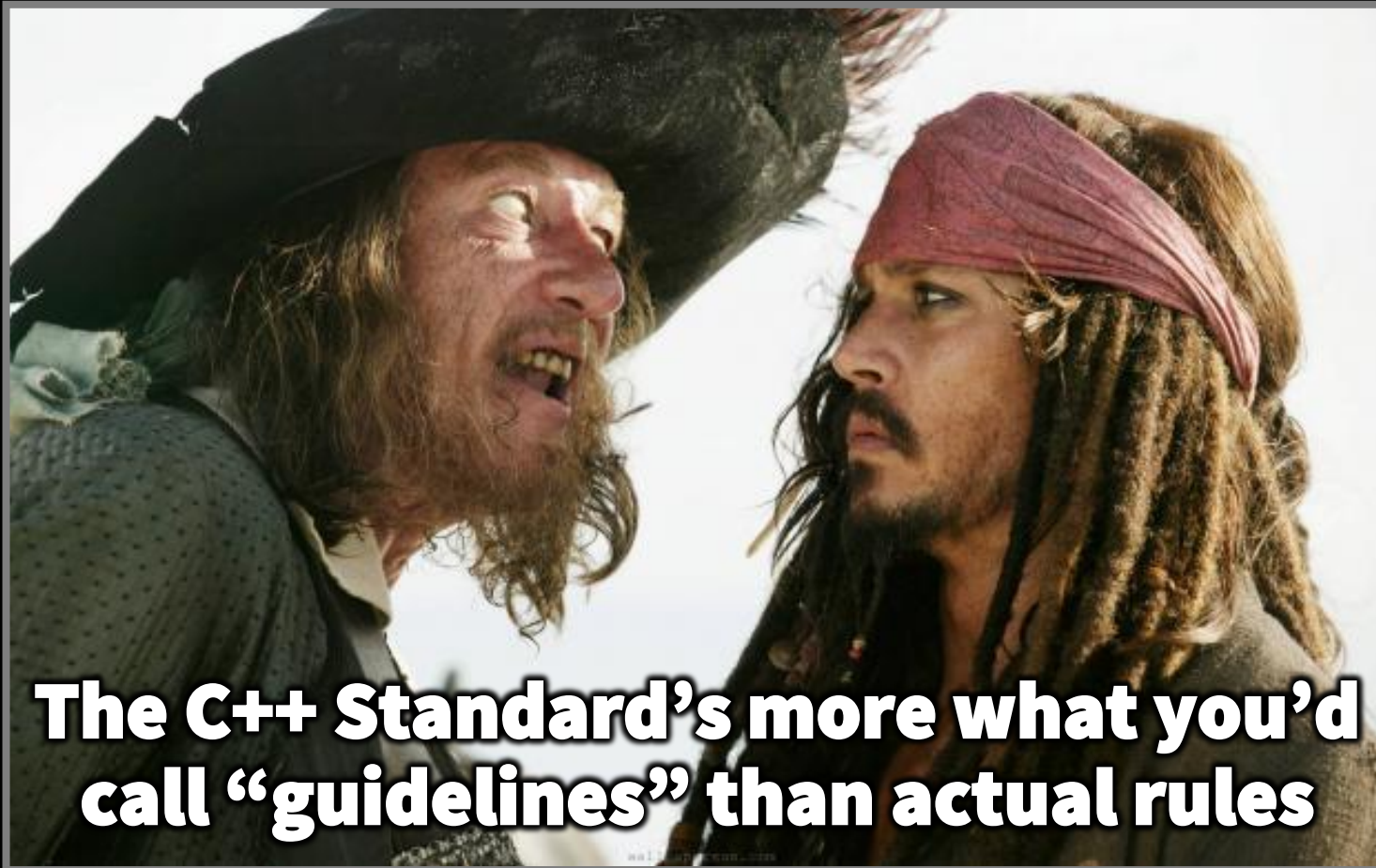
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Implementation-defined and undefined behavior are often a feature, not a bug.



Implementation Freedom



#include <C++>

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Standard Parallelism is in the Library



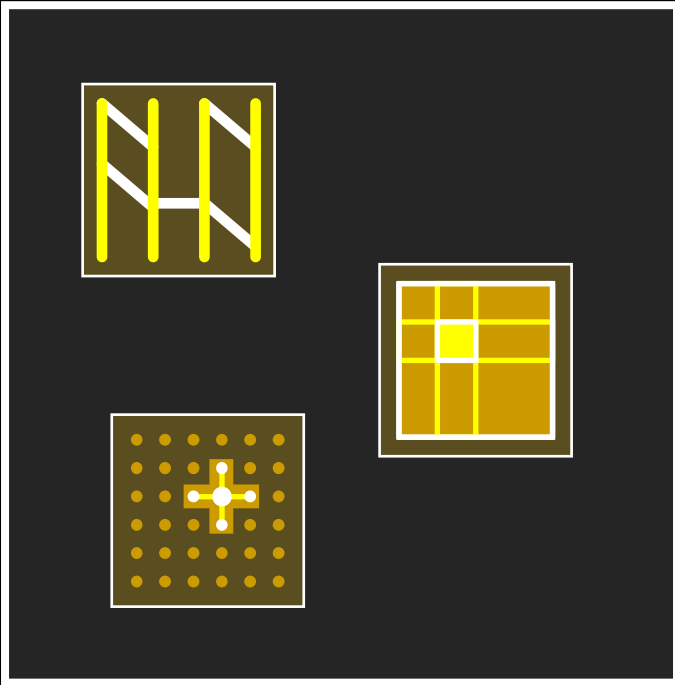


Standard Parallelism is in the Library



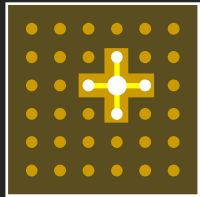
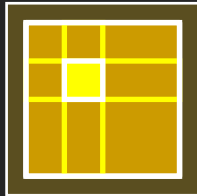
Pillars of Standard Parallelism

Common Algorithms that Dispatch to
Vendor-Optimized Parallel Libraries



Pillars of Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries



Tools to Write Your Own Parallel Algorithms that Run Anywhere

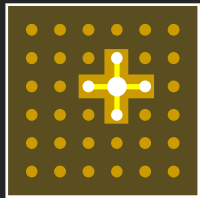
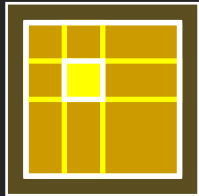


```
sender auto  
algorithm (sender auto s) {  
    return s | bulk(N,  
        [] (auto data) {  
            // ...  
        }  
    ) | bulk(N,  
        [] (auto data) {  
            // ...  
        }  
    );  
}
```



Pillars of Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries



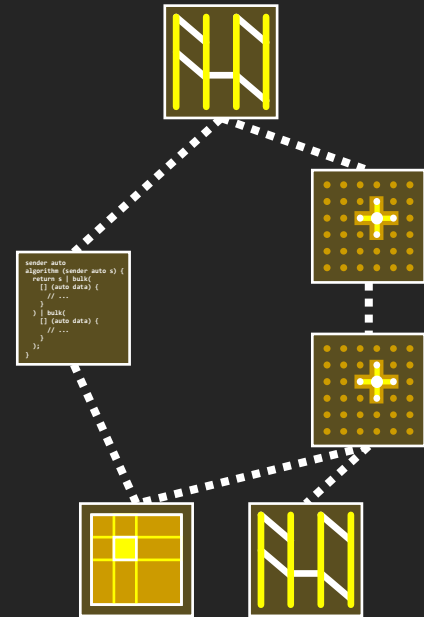
Tools to Write Your Own Parallel Algorithms that Run Anywhere



```
sender auto  
algorithm (sender auto s) {  
    return s | bulk(N,  
        [] (auto data) {  
            // ...  
        }) | bulk(N,  
        [] (auto data) {  
            // ...  
        });  
}
```



Mechanisms for Composing Parallel Invocations into Task Graphs





Standard Algorithms

Serial (C++98)

```
std::vector<T> x{...};  
  
std::for_each(  
    begin(x), end(x),  
    f);  
  
std::for_each(  
    begin(x), end(x),  
    g);  
  
std::for_each(  
    begin(x), end(x),  
    h);
```



```
std::vector<double> x{...}, y{...};  
double dot_product = std::transform_reduce(begin(x), end(x),  
                                           begin(y));
```

```
std::span<std::string_view> s{...};  
std::sort(begin(s), end(s));
```

```
std::unordered_map<std::string_view, int> db{...};  
std::vector<std::pair<std::string_view, int>> m{...};  
std::copy_if(begin(db), end(db), begin(m),  
             [] (auto e) { return e.second > 0; });
```





Standard Algorithms

adjacent_difference	is_sorted[_until]	rotate[_copy]
adjacent_find	lexicographical_compare	search[_n]
all_of	max_element	set_difference
any_of	merge	set_intersection
copy[_if _n]	min_element	set_symmetric_difference
count[_if]	minmax_element	set_union
equal	mismatch	sort
fill[_n]	move	stable_partition
find[_end _first_of _if _if_not]	none_of	stable_sort
for_each	nth_element	swap_ranges
generate[_n]	partial_sort[_copy]	transform
includes	partition[_copy]	uninitialized_copy[_n]
inplace_merge	remove[_copy _copy_if _if]	uninitialized_fill[_n]
is_heap[_until]	replace[_copy _copy_if _if]	unique
is_partitioned	reverse[_copy]	unique_copy



Standard Algorithms

Serial (C++98)

```
std::vector<T> x{...};

std::for_each(
    begin(x), end(x),
    f);

std::for_each(
    begin(x), end(x),
    g);

std::for_each(
    begin(x), end(x),
    h);
```

Parallel (C++17)

```
std::vector<T> x{...};

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    f);

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    g);

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    h);
```



```
std::vector<double> x{...}, y{...};  
double dot_product = std::transform_reduce(ex::par_unseq,  
                                              begin(x), end(x),  
                                              begin(y));
```

```
std::span<std::string_view> s{...};  
std::sort(ex::par_unseq, begin(s), end(s));
```

```
std::unordered_map<std::string_view, int> db{...};  
std::vector<std::pair<std::string_view, int>> m{...};  
std::copy_if(ex::par_unseq, begin(db), end(db), begin(m),  
            [] (auto e) { return e.second > 0; });
```



Execution Policy	Operations occur ...	Operations are ...
------------------	----------------------	--------------------



Execution Policy	Operations occur ...	Operations are ...
<code>std::execution::seq</code>	In the calling thread	Indeterminately sequenced



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<code>std::execution::seq</code>	In the calling thread	Indeterminately sequenced
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<code>std::execution::par</code>	Potentially in multiple threads	Indeterminately sequenced within each thread
<code>std::execution::par_unseq</code>	Potentially in multiple threads	Unsequenced




```
std::size_t word_count(std::string_view s) {  
    ...  
}
```

```
std::string_view frost = "Whose woods these are I think I know.\n"  
                        "His house is in the village though; \n"  
                        "He will not see me stopping here \n"  
                        "To watch his woods fill up with snow.\n";  
word_count(frost);
```



```
std::size_t word_count(std::string_view s) {  
    if (s.empty()) return 0;  
    return std::transform_reduce(ex::par_unseq, ...);  
}
```

```
std::string_view frost = "Whose woods these are I think I know.\n"  
                        "His house is in the village though; \n"  
                        "He will not see me stopping here \n"  
                        "To watch his woods fill up with snow.\n";  
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```
std::size_t word_count(std::string_view s) {  
    if (s.empty()) return 0;  
    return std::transform_reduce(ex::par_unseq,  
        begin(s), end(s) - 1, begin(s) + 1,  
        ...  
    );  
}
```

```
std::string_view frost = "Whose woods these are I think I know.\n"  
                        "His house is in the village though; \n"  
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    if (s.empty()) return 0;  
    return std::transform_reduce(ex::par_unseq,  
        begin(s), end(s) - 1, begin(s) + 1,  
        ...  
        [](char l, char r) { return std::isspace(l) && !std::isspace(r); }  
    );  
}
```

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std::string_view frost = "Whose woods these are I think I know.\n"  
                        "His house is in the village though; \n"  
                        "He will not see me stopping here \n"  
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    if (s.empty()) return 0;
    return std::transform_reduce(ex::par_unseq,
        begin(s), end(s) - 1, begin(s) + 1,
        ...

    [](char l, char r) { return std::isspace(l) && !std::isspace(r); }
    );
}

```

```

std::size_t result      =  0000010000010000010001010000010100000
                           10001000001001001000100000001000000000
                           1001000010001000100100100000000100000000
                           10010000010001000001000010010000100000;

```



```

std::size_t word_count(std::string_view s) {
    if (s.empty()) return 0;
    return std::transform_reduce(ex::par_unseq,
        begin(s), end(s) - 1, begin(s) + 1,
        std::size_t(!std::isspace(s.front())) ? 1 : 0),
        ...
        [] (char l, char r) { return std::isspace(l) && !std::isspace(r); }
    );
}

```

```

std::size_t result      = 10000010000010000010001010000010100000
                          10001000001001001000100000001000000000
                          10010000100010001001000000001000000000
                          10010000010001000001000010010000100000;

```



```

std::size_t word_count(std::string_view s) {
    if (s.empty()) return 0;
    return std::transform_reduce(ex::par_unseq,
        begin(s), end(s) - 1, begin(s) + 1,
        std::size_t(!std::isspace(s.front())) ? 1 : 0),
        std::plus(),
        [] (char l, char r) { return std::isspace(l) && !std::isspace(r); }
    );
}

```

```

std::size_t result      = 1  + 1  + 1  + 1 + 1+1  + 1+1  +
                          1 + 1  + 1 +1 +1 + 1  + 1      +
                          1 +1  + 1 + 1 + 1 +1  + 1      +
                          1 +1  + 1 + 1  + 1  + 1 +1  + 1 ;

```




```
std::size_t word_count(std::string_view s) {  
    if (s.empty()) return 0;  
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        begin(s), end(s) - 1, begin(s) + 1,  
        std::size_t(!std::isspace(s.front())) ? 1 : 0),  
        std::plus(),  
        [] (char l, char r) { return std::isspace(l) && !std::isspace(r); }  
    );  
}
```

```
std::string_view frost = "Whose woods these are I think I know.\n"  
                        "His house is in the village though; \n"  
                        "He will not see me stopping here \n"  
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```



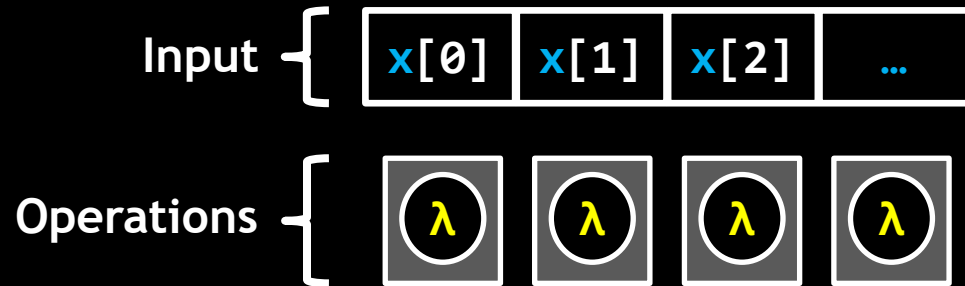
**In C++20, the Standard Library
introduced ranges.**

**Unlike iterators, ranges are
composable and can be lazy.**



```
std::vector x{...};
```

```
std::for_each(  
    ex::par_unseq,  
    begin(x), end(x),  
    [...] (auto& obj) { ... } );
```



```
auto v = stdv::iota(1, N);
```

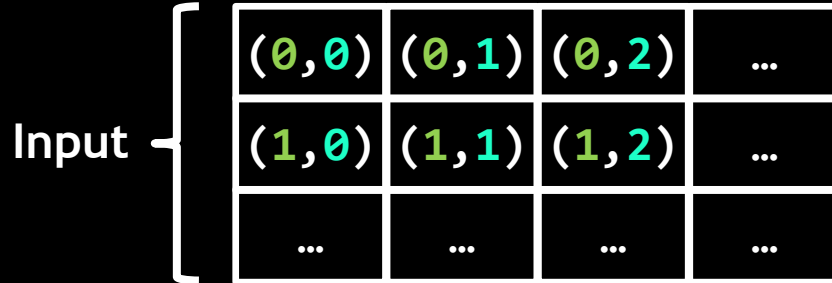
```
std::for_each(  
    ex::par_unseq,  
    begin(v), end(v),  
    [...] (auto idx) { ... });
```



```
std::span A{input, N * M};  
std::span B{output, M * N};  
  
auto v = stdv::cartesian_product(  
    stdv::iota(0, N),  
    stdv::iota(0, M));  
  
std::for_each(ex::par_unseq,  
    begin(v), end(v),  
    [=] (auto idx) {  
        auto [i, j] = idx;  
        B[i + j * N] = A[i * M + j];  
    });
```

```
std::span A{input, N * M};  
std::span B{output, M * N};
```

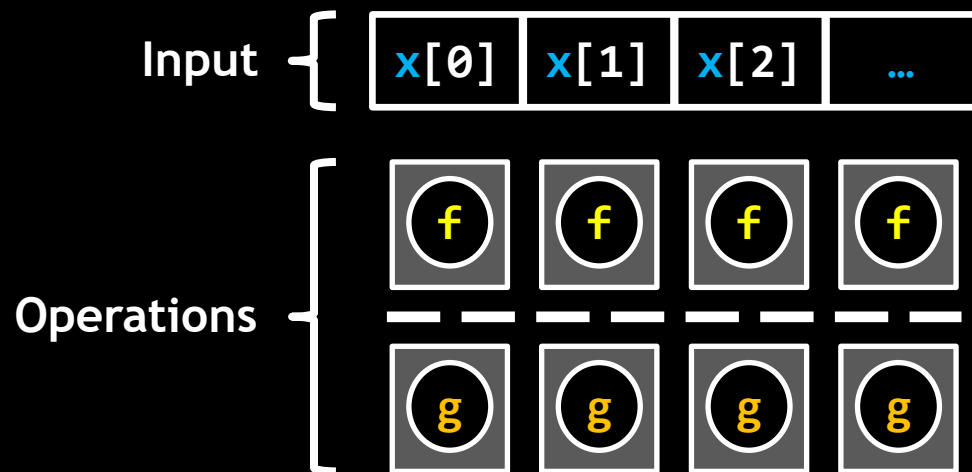
```
auto v = stdv::cartesian_product(  
    stdv::iota(0, N),  
    stdv::iota(0, M));
```



```
std::vector x{...};
```

```
std::for_each(ex::par unseq,  
             begin(x), end(x), f);
```

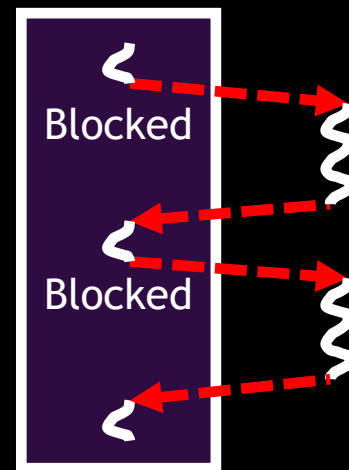
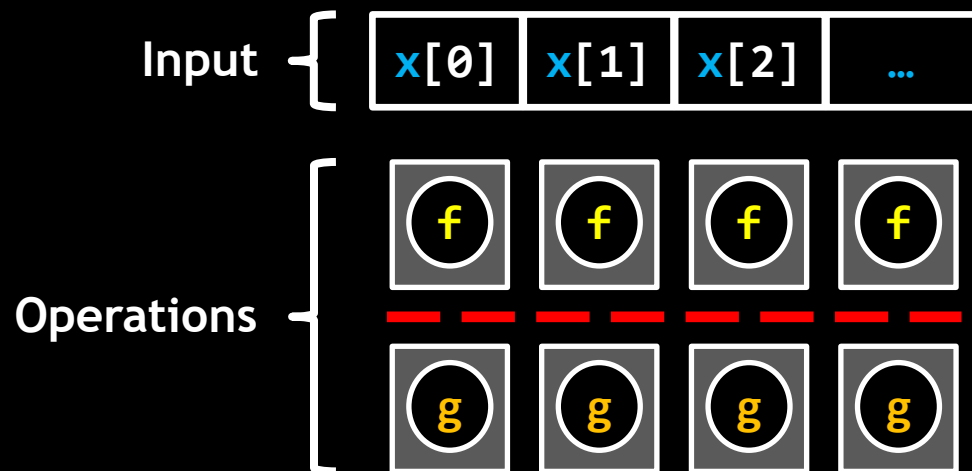
```
std::for_each(ex::par unseq,  
             begin(x), end(x), g);
```



```
std::vector x{...};
```

```
std::for_each(ex::par unseq,  
             begin(x), end(x), f);
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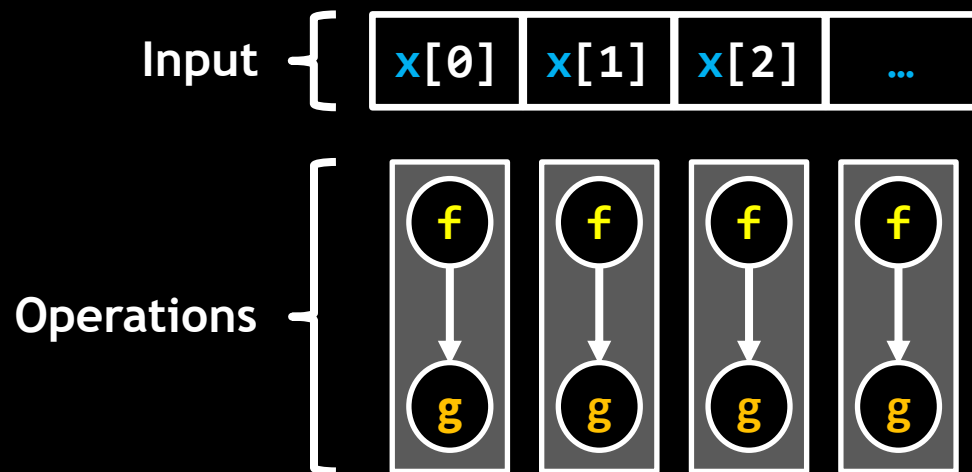
```
std::for_each(ex::par unseq,  
             begin(x), end(x), g);
```




```
std::vector x{...};
```

```
auto v = std::transform(x, f);
```

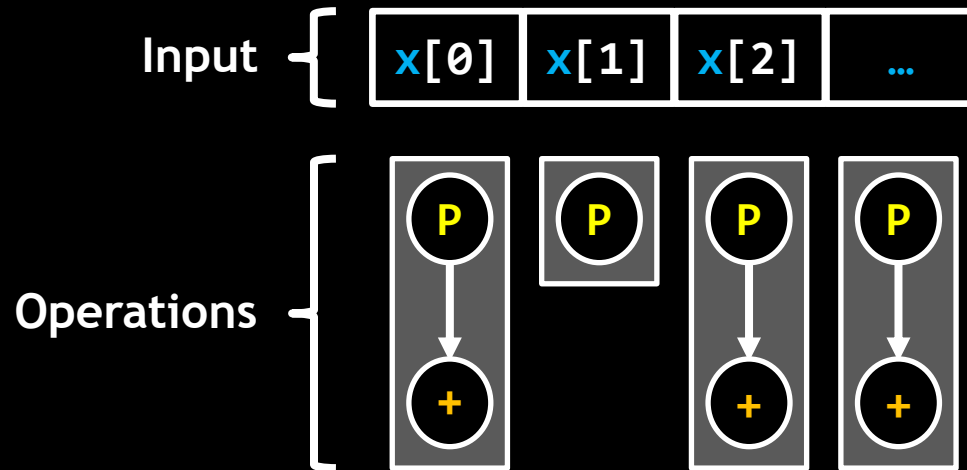
```
std::for_each(ex::par_unseq,  
             begin(v), end(v), g);
```



```
std::vector x{...};
```

```
auto v = std::filter(x,  
    [] (auto e) { return e > 0; });
```

```
std::reduce(ex::par_unseq,  
    begin(v), end(v));
```



**The C++ parallel algorithms
introduced in C++17 are great,
but they're just the
start of the story.**



```
std::vector<std::string_view> s{...};  
  
std::sort(ex::par_unseq, begin(s), end(s));  
std::unique(ex::par_unseq, begin(s), end(s));
```

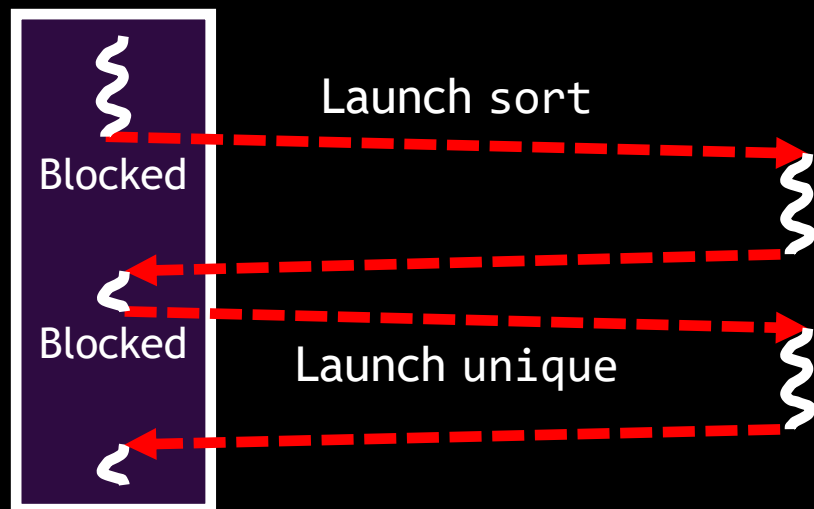


```
std::vector<std::string_view> s{...};
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std::sort(ex::par_unseq, begin(s), end(s));
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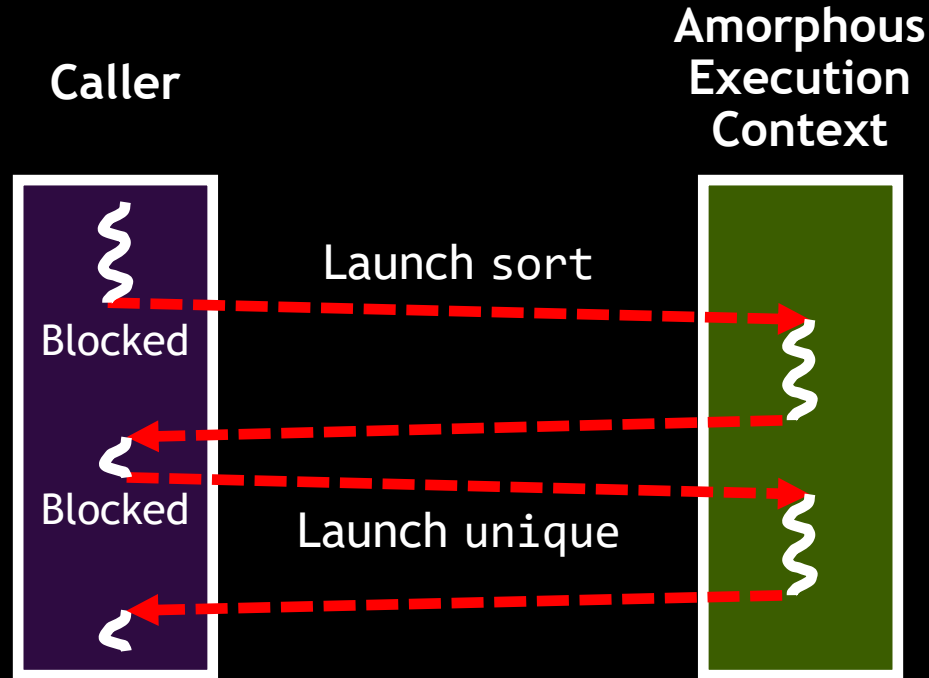
```
std::unique(ex::par_unseq, begin(s), end(s));
```

Caller



```
std::vector<std::string_view> s{...};
```

```
std::sort(ex::par_unseq, begin(s), end(s));  
std::unique(ex::par_unseq, begin(s), end(s));
```



Today, C++ has:

- No standard model for asynchrony.
- No standard way to express where things should execute.



Today, C++ has:

- No standard model for asynchrony.
- No standard way to express where things should execute.

The solution is coming soon:

Senders & Receivers




```
ex::scheduler auto sch = thread_pool.scheduler();  
  
ex::sender auto begin = ex::schedule(sch);  
ex::sender auto hi     = ex::then(begin, [] { return 13; });  
ex::sender auto add    = ex::then(hi, [] (int a) { return a + 42; });  
  
auto [i] = this_thread::sync_wait(add).value();
```



```
ex::scheduler auto sch = thread_pool.scheduler();
```

```
ex::sender auto begin = ex::schedule(sch);
```

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ex::sender auto hi      = ex::then(begin, [] { return 13; });
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ex::sender auto add     = ex::then(hi, [] (int a) { return a + 42; });
```

```
auto [i] = this_thread::sync_wait(add).value();
```



Schedulers are handles to execution contexts.



Schedulers are handles to execution contexts.

Senders represent asynchronous work.



Schedulers are handles to execution contexts.

Senders represent asynchronous work.

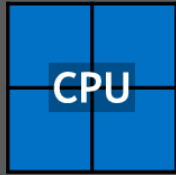
Receivers process asynchronous signals.



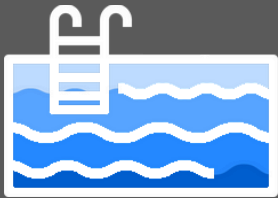
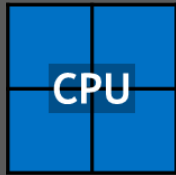
**Schedulers are handles to
execution contexts.**



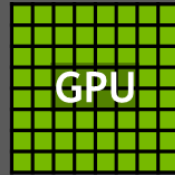
Execution Context: CPU Thread Pool



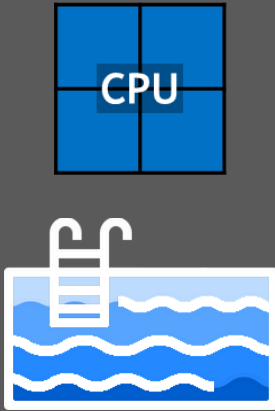
Execution Context:
CPU Thread Pool



Execution Context:
GPU Stream



Execution Context:
CPU Thread Pool

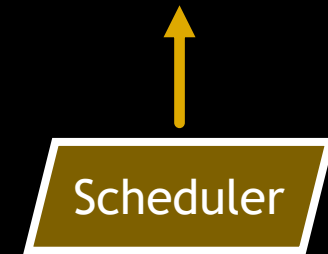
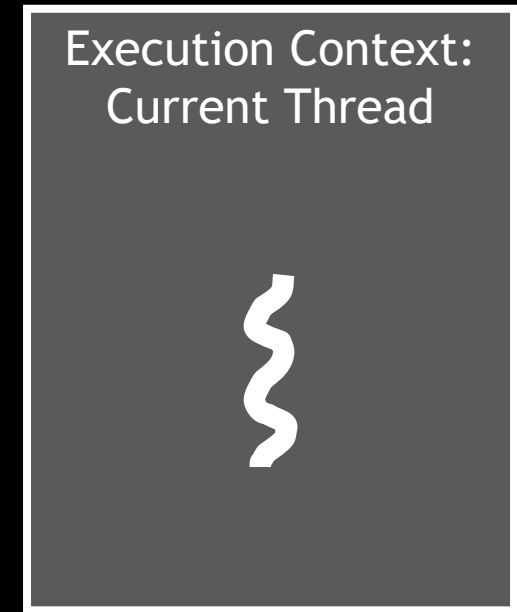
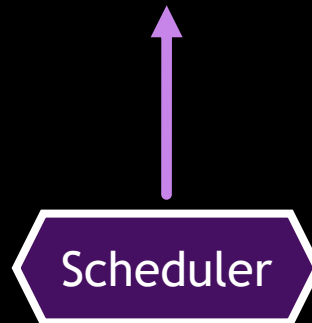
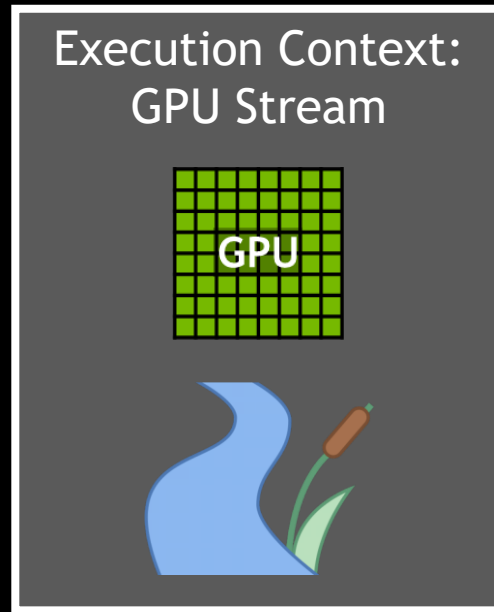
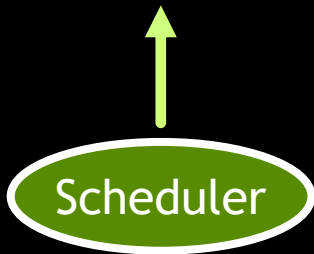
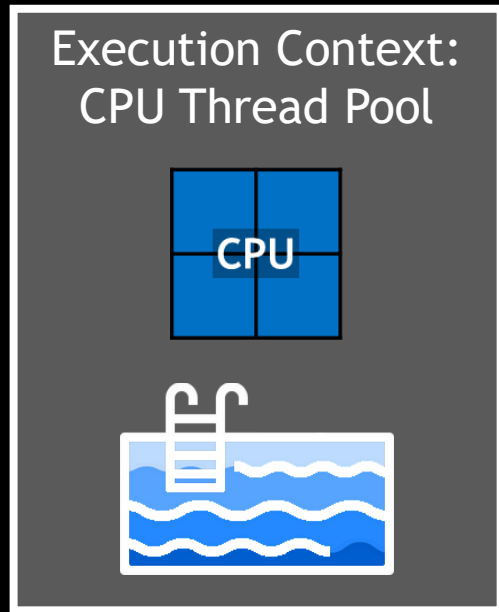


Execution Context:
GPU Stream



Execution Context:
Current Thread

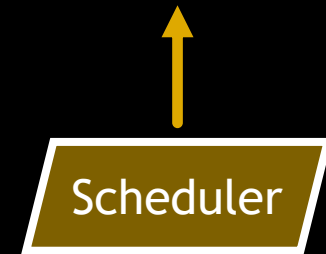
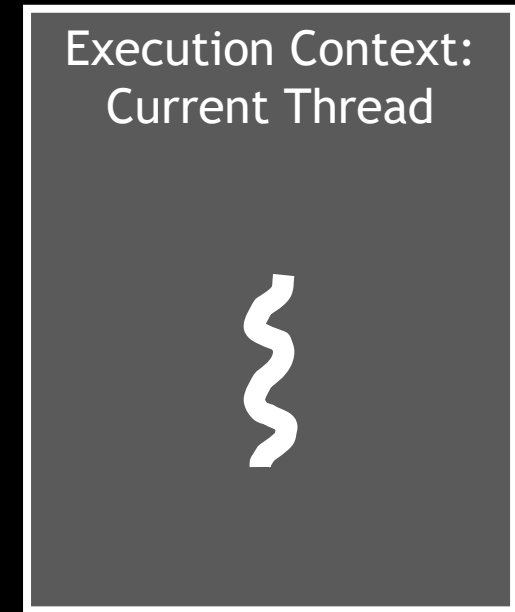
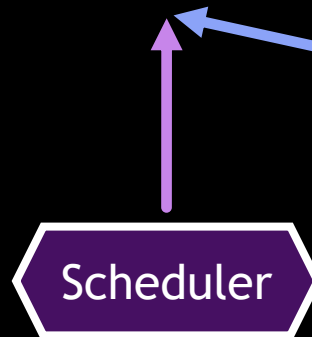
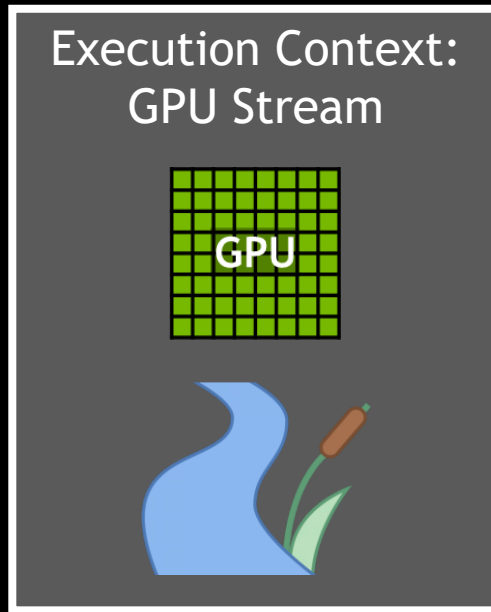
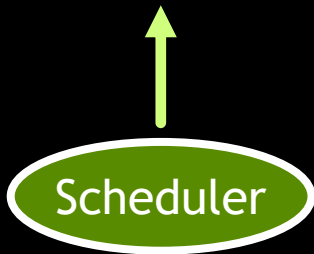
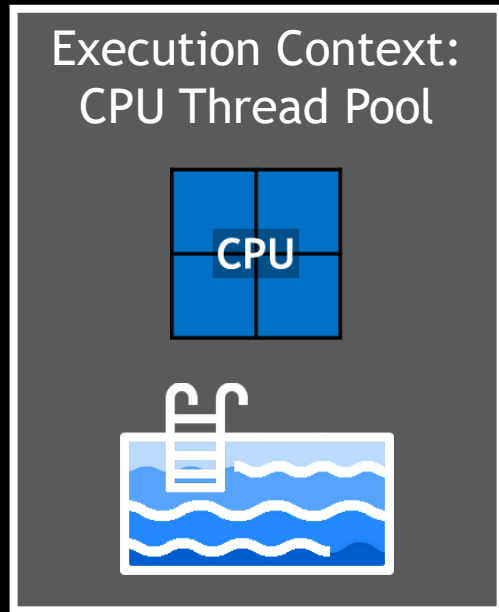




#include <C++>

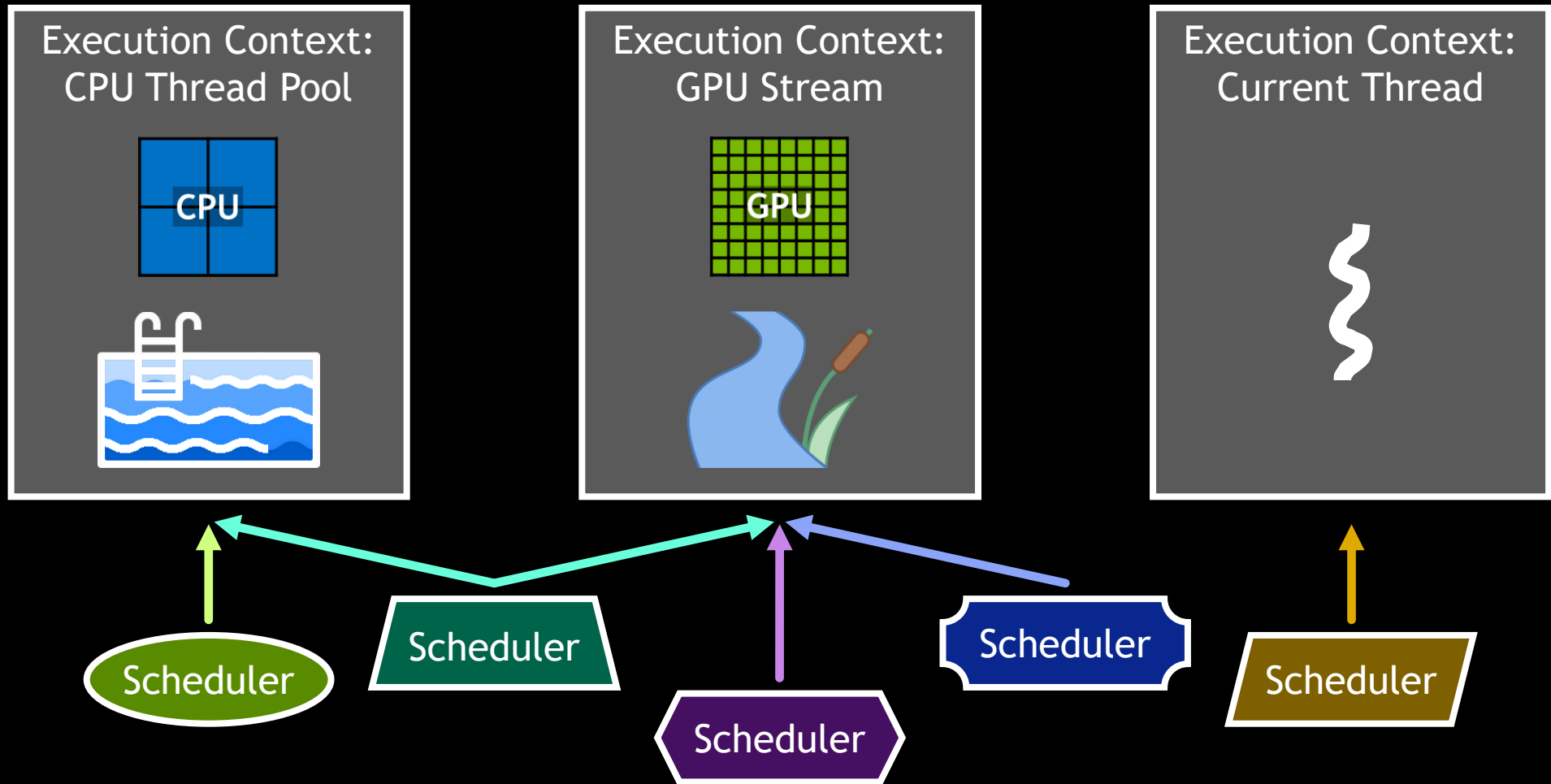
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`#include <C++>`





#include <C++>

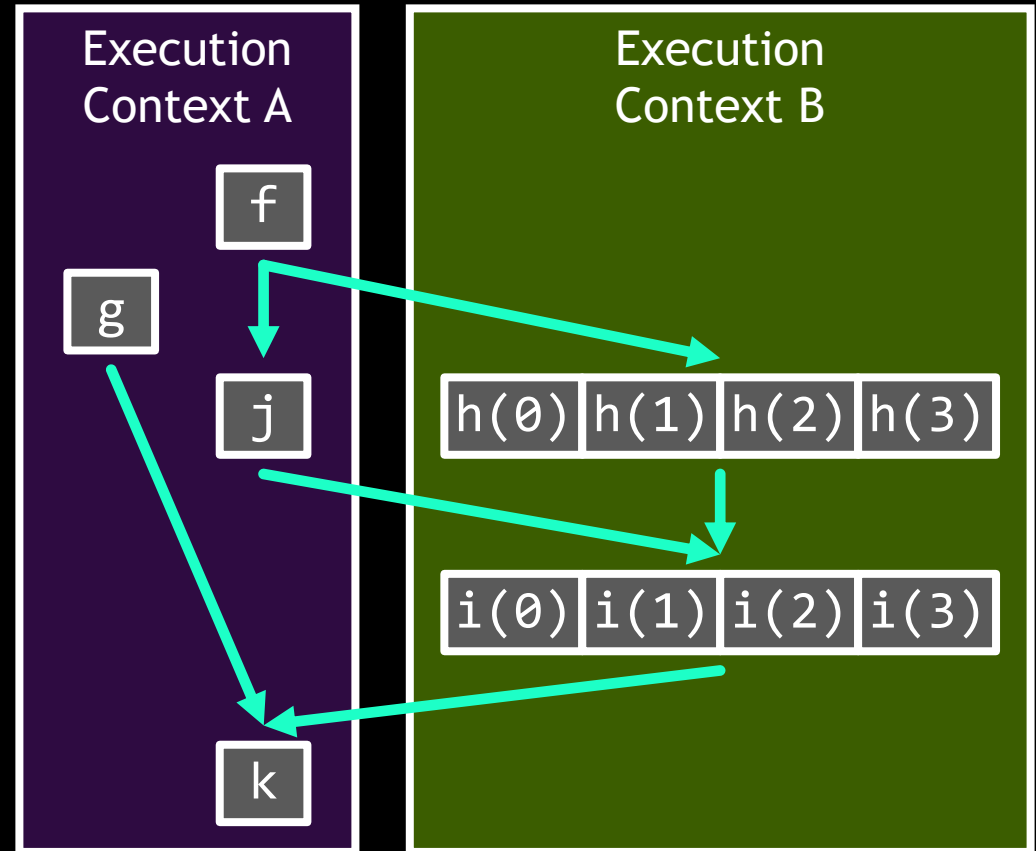
Schedulers produce senders.



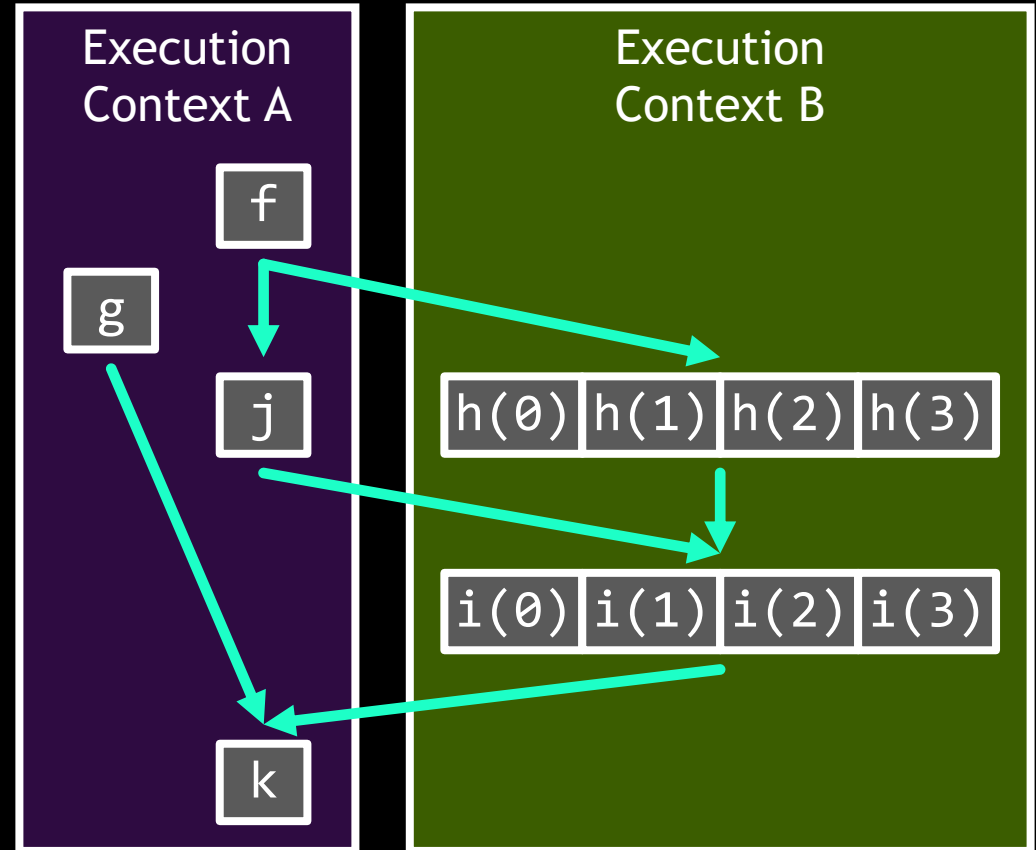
- Senders represent asynchronous work.



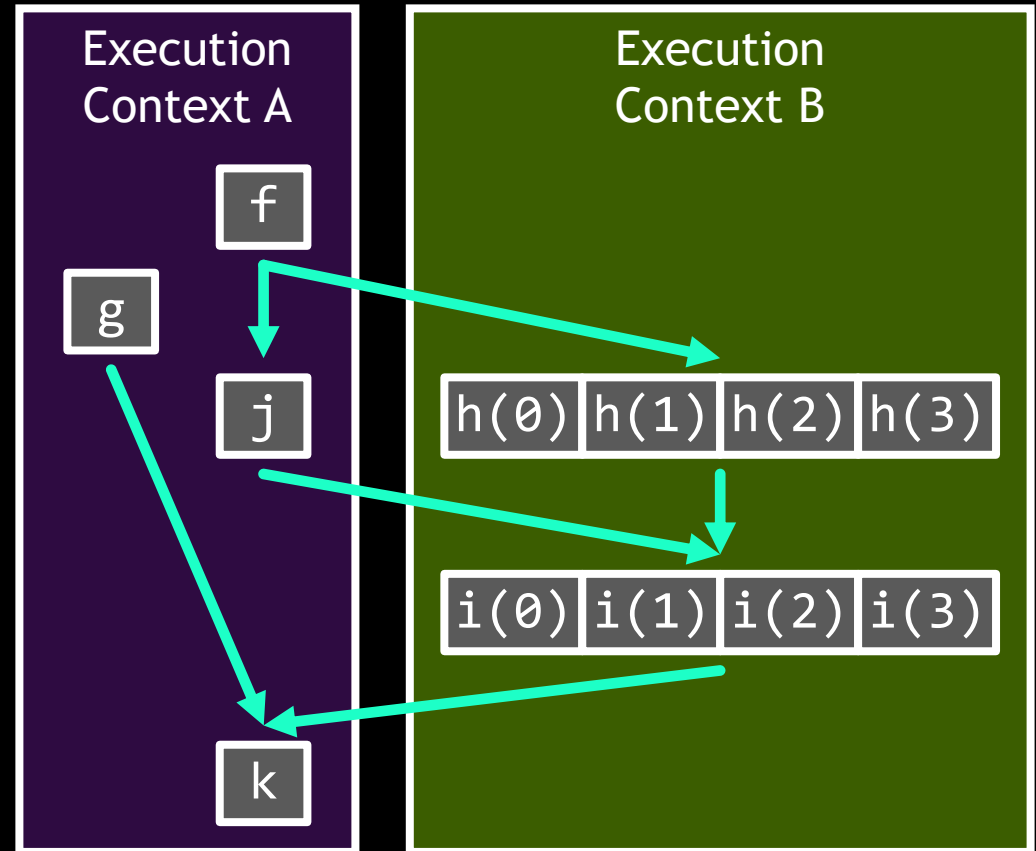
- Senders represent asynchronous work.
- Senders form the nodes of a task graph.



- Senders represent asynchronous work.
- Senders form the nodes of a task graph.
- Senders are lazy.



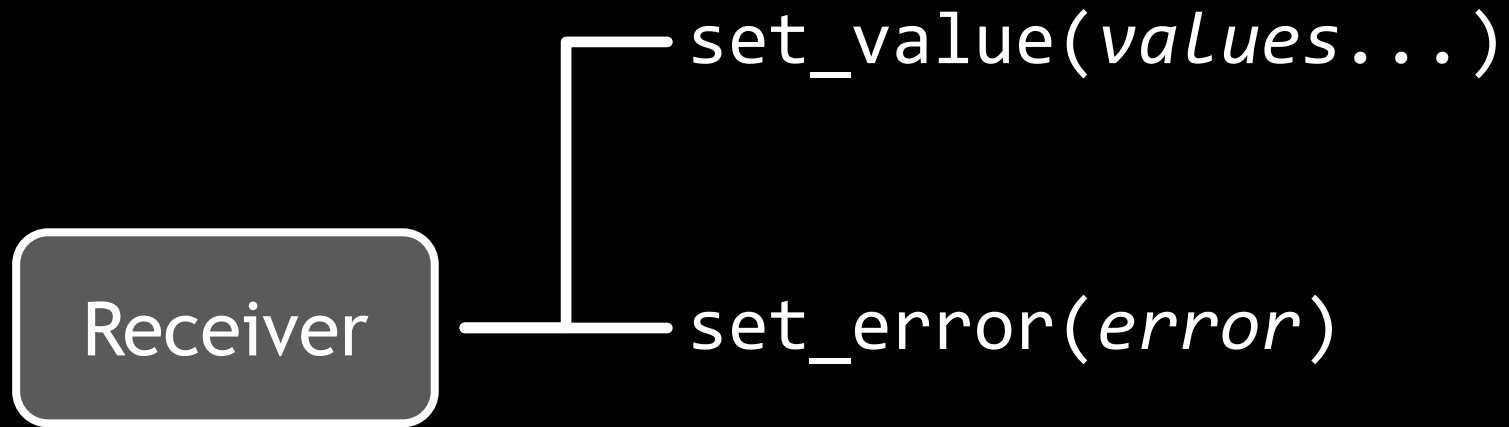
- Senders represent asynchronous work.
- Senders form the nodes of a task graph.
- Senders are lazy.
- When a sender's work completes, it sends a signal to the receivers attached to it.

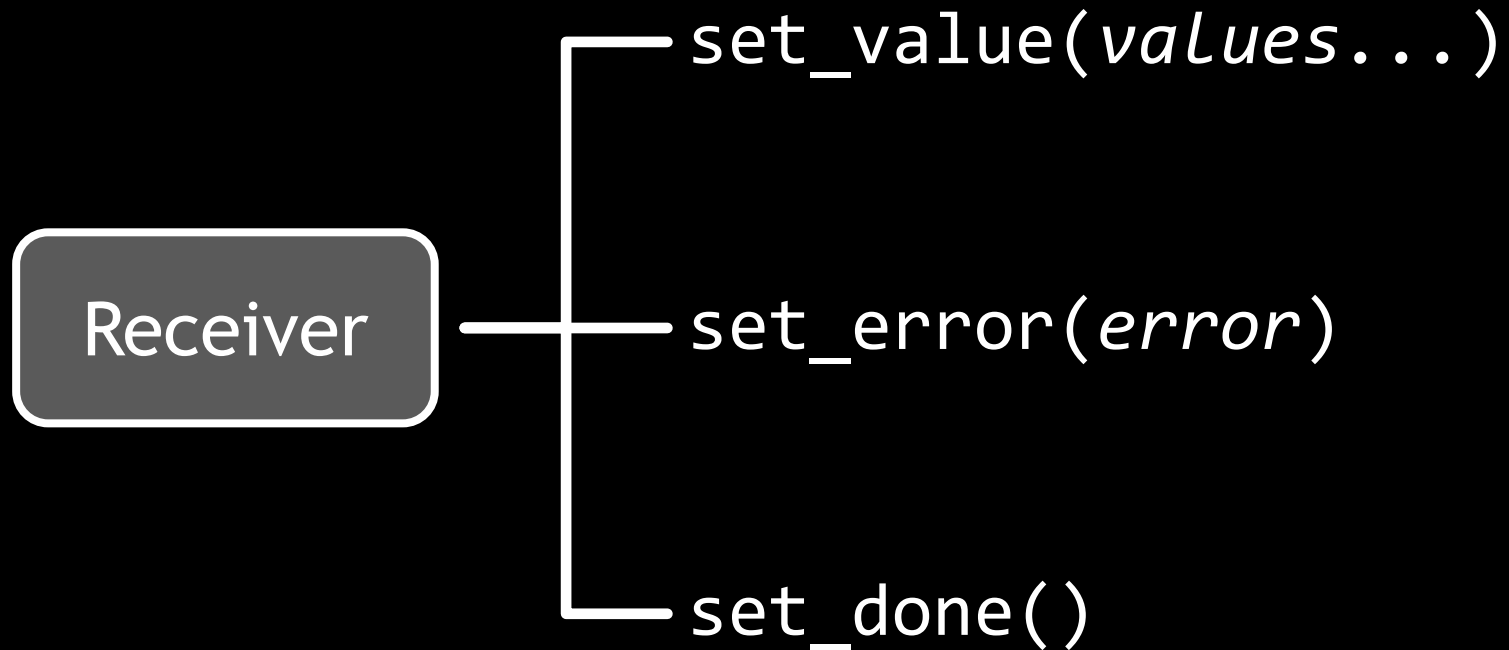


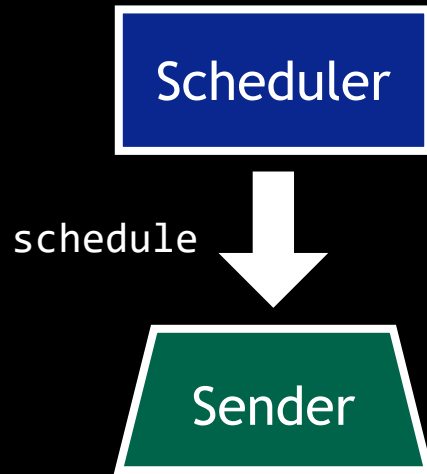
Receiver

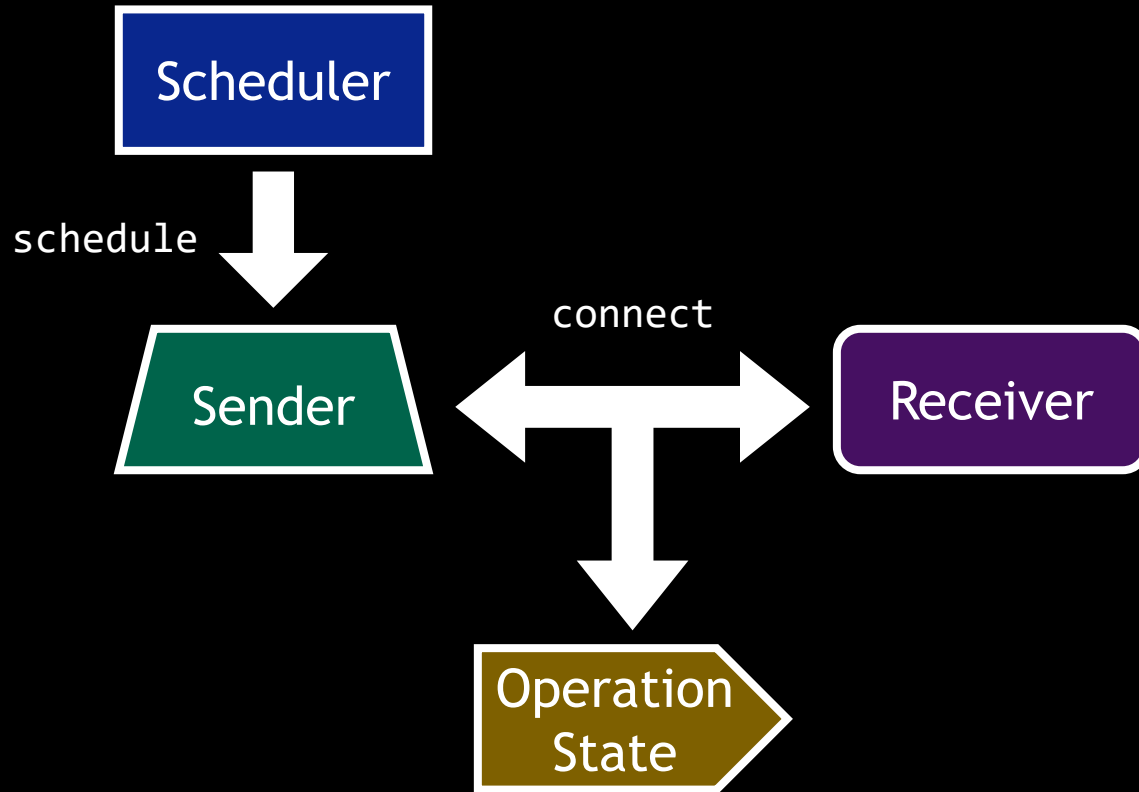


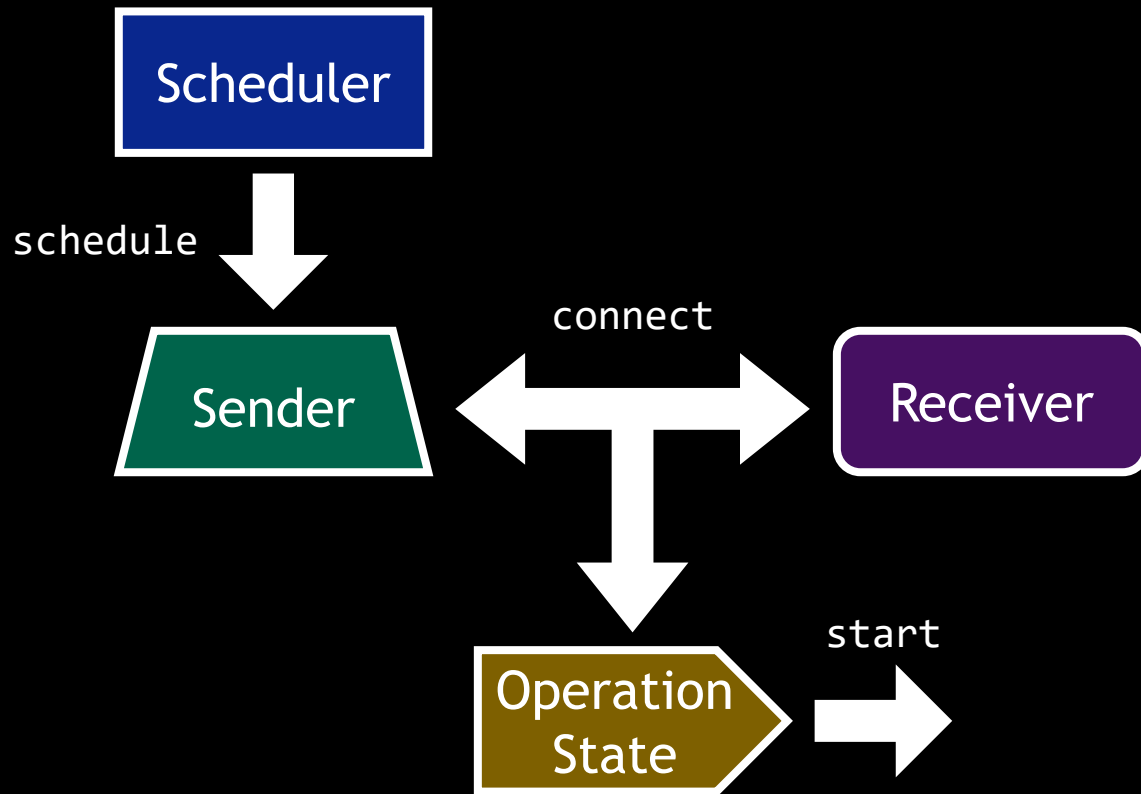


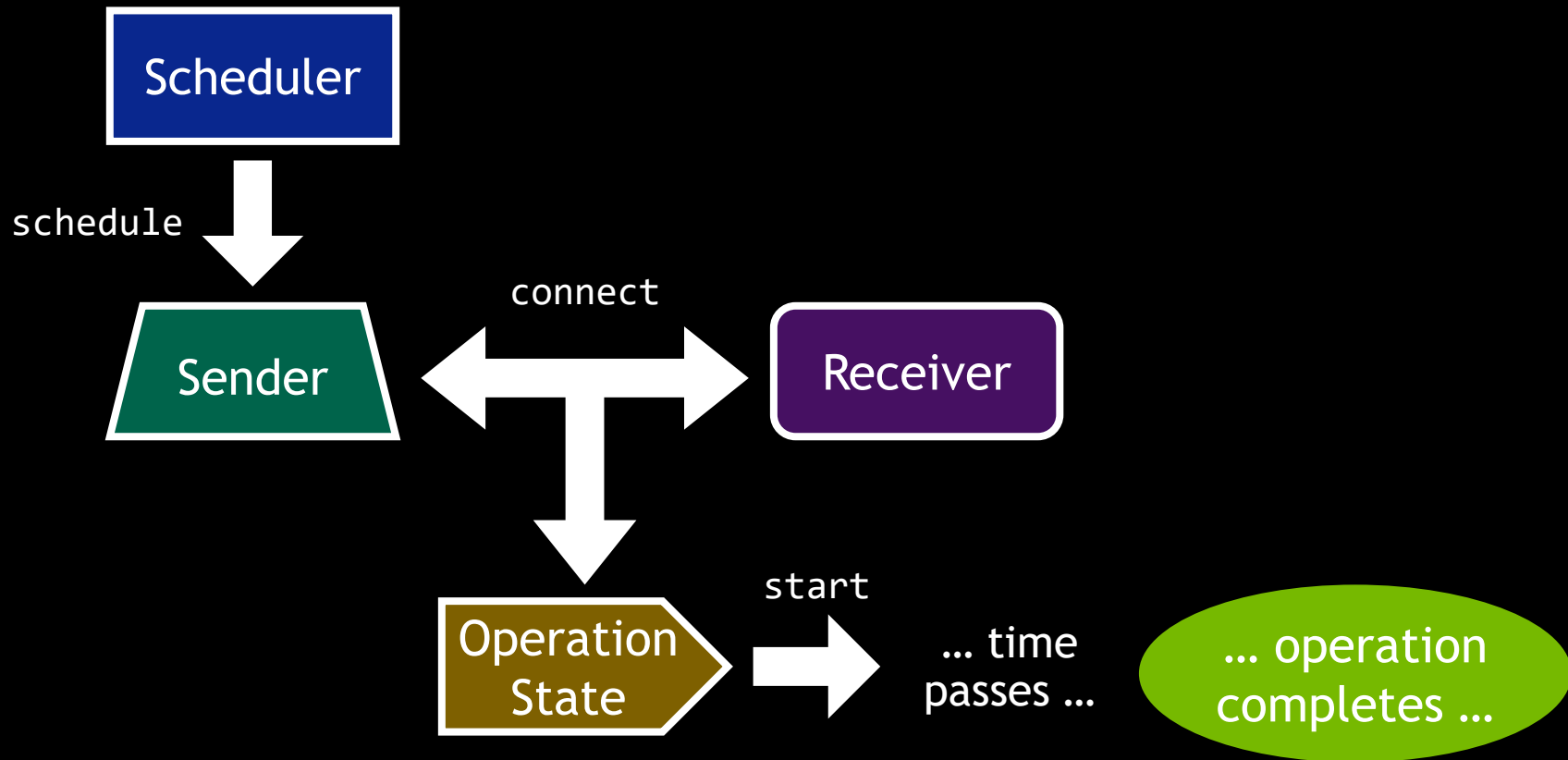


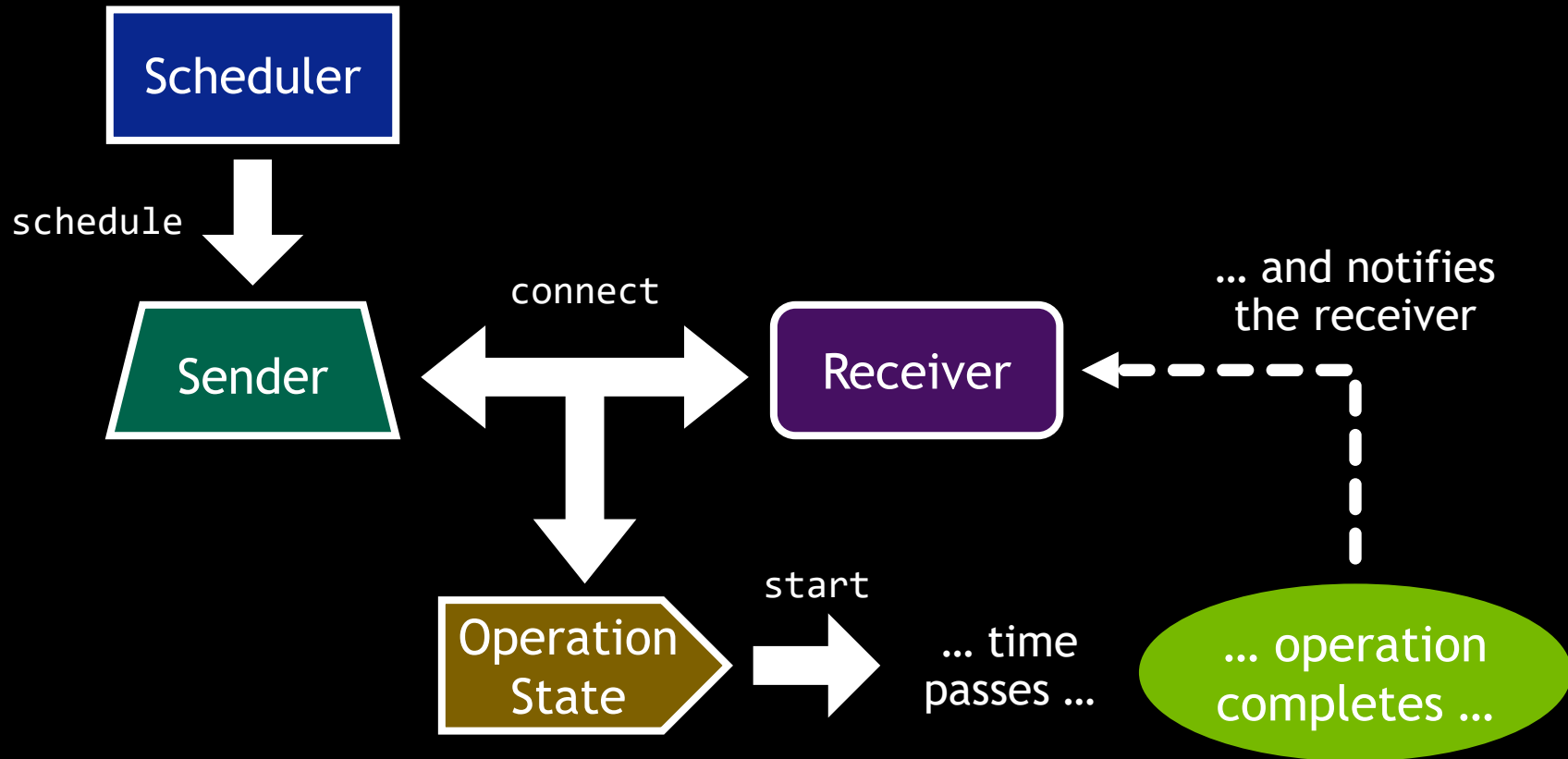












```
sender auto f(sender auto p, ...);
```



```
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```

➤ Takes one or more senders.




```
sender auto f(sender auto p, ...);
```

- Takes one or more senders.
- Return a sender.



```
sender auto f(sender auto p, ...);
```

- Takes one or more senders.
- Return a sender.
- Pipeable (think *nix shells):

```
snd | f | g
```

is equivalent to

```
g(f(snd))
```



```
std::vector<std::string_view> v{...};

ex::sender auto s = for_each_async(
    ex::transfer(
        unique_async(
            sort_async(
                ex::transfer_just(gpu_stream_scheduler{}, v)
            )
        ),
        thread_pool.scheduler()
    ),
    [] (std::string_view e)
    { std::print(file, "{}\n", e); }
);

this_thread::sync_wait(s);
```



```
std::vector<std::string_view> v{...};

ex::sender auto s0 = ex::transfer_just(gpu_stream_scheduler{}, v);
ex::sender auto s1 = sort_async(s0);
ex::sender auto s2 = unique_async(s1);
ex::sender auto s3 = ex::transfer(s2, thread_pool.scheduler());
ex::sender auto s4 = for_each_async(s3, [] (std::string_view e)
                                   { std::print(file, "{}\n", e); });

this_thread::sync_wait(s);
```



```
std::vector<std::string_view> v{...};

ex::sender auto s = ex::transfer_just(gpu_stream_scheduler{}, v)
    | sort_async
    | unique_async
    | ex::transfer(thread_pool.scheduler())
    | for_each_async([] (std::string_view e)
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Sender Adaptor	Semantics Of Returned Sender
<u>then</u> (sender auto last, invocable auto f)	Call f with the value sent by last.



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<u>then</u> (sender auto last, invocable auto f)	Call f with the value sent by last.
<u>bulk</u> (sender auto last, shape auto n, invocable auto body)	Call body for every index in n with the value sent by last.



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<u>split</u> (sender auto last)	Can be connected to multiple receivers.



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Sender Factories	Semantics Of Returned Sender
------------------	------------------------------



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Sender Factories	Semantics Of Returned Sender
<u>schedule</u> (scheduler auto sch)	Completes on sch.
<u>just</u> (T&&... ts)	Send the values ts.



Sender Adaptor	Semantics Of Returned Sender
<u>then</u> (sender auto last, invocable auto f)	Call f with the value sent by last.
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Sender Factories	Semantics Of Returned Sender
<u>schedule</u> (scheduler auto sch)	Completes on sch.
<u>just</u> (T&&... ts)	Send the values ts.

Sender Consumers	Semantics
------------------	-----------



Sender Adaptor	Semantics Of Returned Sender
<u>then</u> (sender auto last, invocable auto f)	Call f with the value sent by last.
<u>bulk</u> (sender auto last, shape auto n, invocable auto body)	Call body for every index in n with the value sent by last.
<u>transfer</u> (sender auto last, scheduler auto sch)	Transition to sch for the next sender.
<u>split</u> (sender auto last)	Can be connected multiple times.
<u>when all</u> (sender auto... inputs)	Combines multiple senders into an aggregate.
<u>ensure started</u> (sender auto last)	Connects and starts last.

Sender Factories	Semantics Of Returned Sender
<u>schedule</u> (scheduler auto sch)	Completes on sch.
<u>just</u> (T&&... ts)	Send the values ts.

Sender Consumers	Semantics
<u>sync wait</u> (sender auto snd) -> <i>values-sent-by-sender</i>	Block until snd completes and return or throw whatever it sent.



before | **then(f)** | **after;**



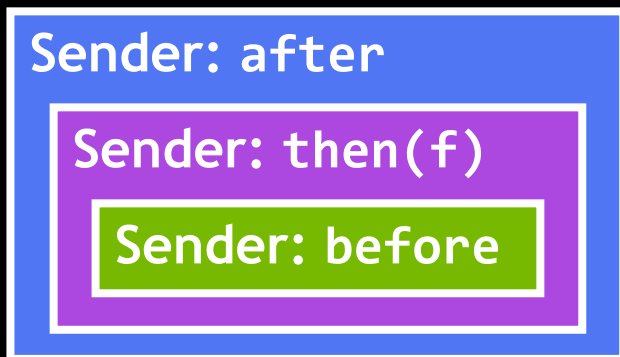
before | **then(f)** | **after**;

```
sender auto before_snd = ...;  
sender auto then_f_snd = then_sender(before_snd, f);  
sender auto after_snd = after_sender(then_f_snd);
```



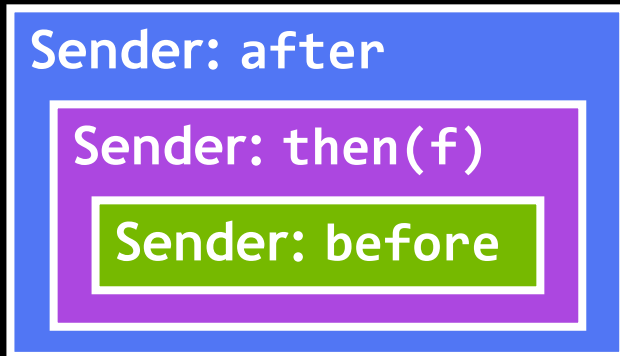
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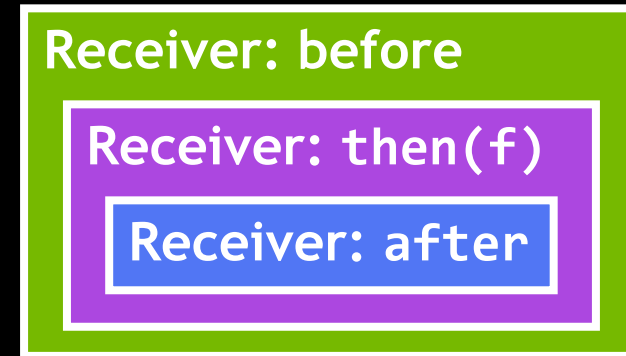
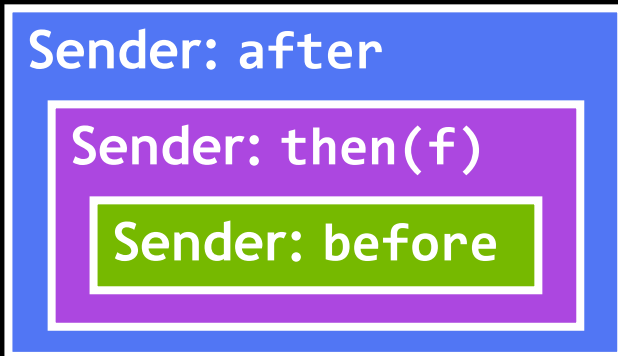
before | **then(f)** | **after**;

```
sender auto before_snd = ...;  
sender auto then_f_snd = then_sender(before_snd, f);  
sender auto after_snd = after_sender(then_f_snd);  
...  
    return connect(after_snd, ...);  
        return connect(then_f_snd, after_rcv);  
            return connect(before_snd, then_f_rcv);  
        ...
```



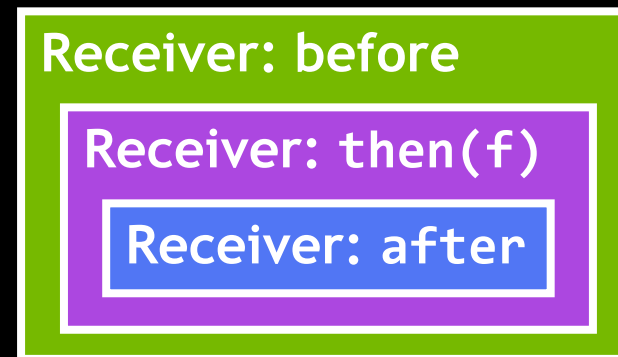
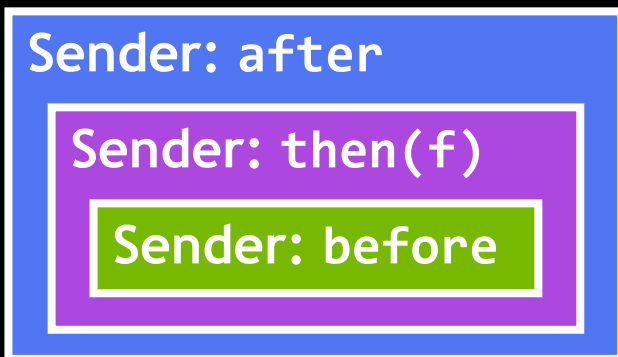
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```
sender auto before_snd = ...;  
sender auto then_f_snd = then_sender(before_snd, f);  
sender auto after_snd = after_sender(then_f_snd);  
...  
    return connect(after_snd, ...);  
        return connect(then_f_snd, after_rcv);  
            return connect(before_snd, then_f_rcv);  
        ...
```



before | **then(f)** | **after**;

```
sender auto before_snd = ...;  
sender auto then_f_snd = then_sender(before_snd, f);  
sender auto after_snd = after_sender(then_f_snd);  
...  
return connect(after_snd, ...);  
return connect(then_f_snd, after_rcv);  
return connect(before_snd, then_f_rcv);  
...
```



```
...  
set_value(before_rcv, ...);  
set_value(then_f_rcv, before_val);  
set_value(after_rcv, f(before_val));  
...
```



```
inline constexpr sender_adaptor auto  
inclusive_scan_async = [] (...) -> ex::sender auto {  
    ...  
}
```




```
inline constexpr sender_adaptor auto  
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {  
    ...  
}
```



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then([=] (stdr::random_access_range auto input) {
            ...
        })
    ...
}

```



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then([=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        ...
}

```



```

inline constexpr sender_adaptor auto
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        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                ...
            })
        ...
    }
}

```



```

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inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
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            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                ...
            })
        ...
}

```



a	b	c	d	e	f	g	h	i
a	ab	abc	d	de	def	g	gh	ghi



a	b	c	d	e	f	g	h	i
---	---	---	---	---	---	---	---	---

a	ab	abc
---	----	-----

`std::inclusive_scan`

d	de	def
---	----	-----

`std::inclusive_scan`

g	gh	ghi
---	----	-----

`std::inclusive_scan`

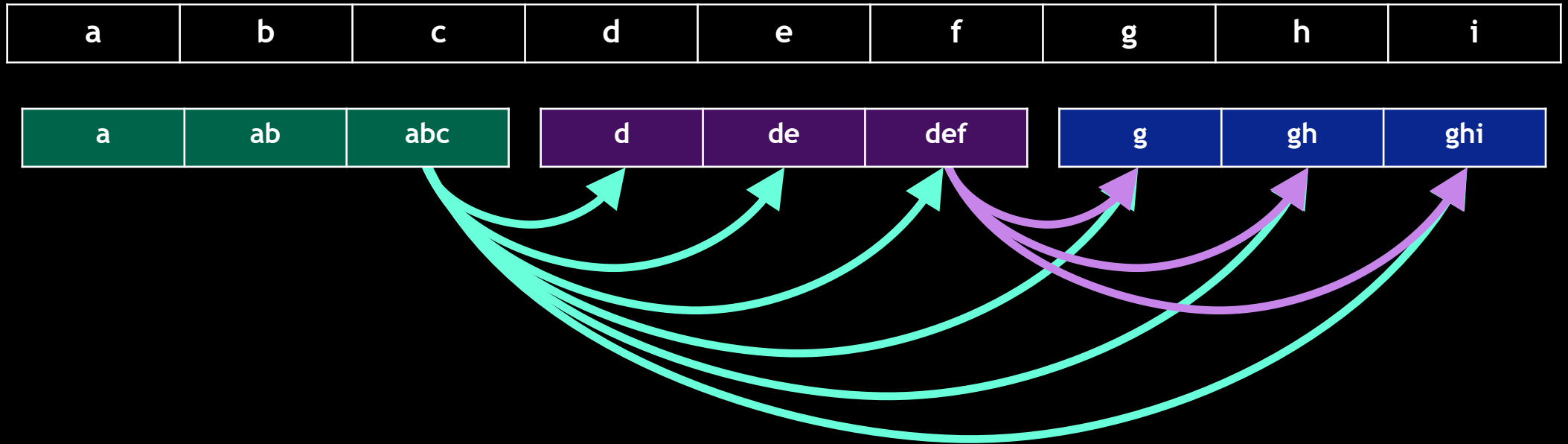



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                ...
                std::inclusive_scan(begin(input) + start,
                                    begin(input) + end,
                                    begin(input) + start);
            })
        ...
    }
}

```





```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                ...            = *--std::inclusive_scan(begin(input) + start,
                                begin(input) + end,
                                begin(input) + start);
            })
        ...
    }
}

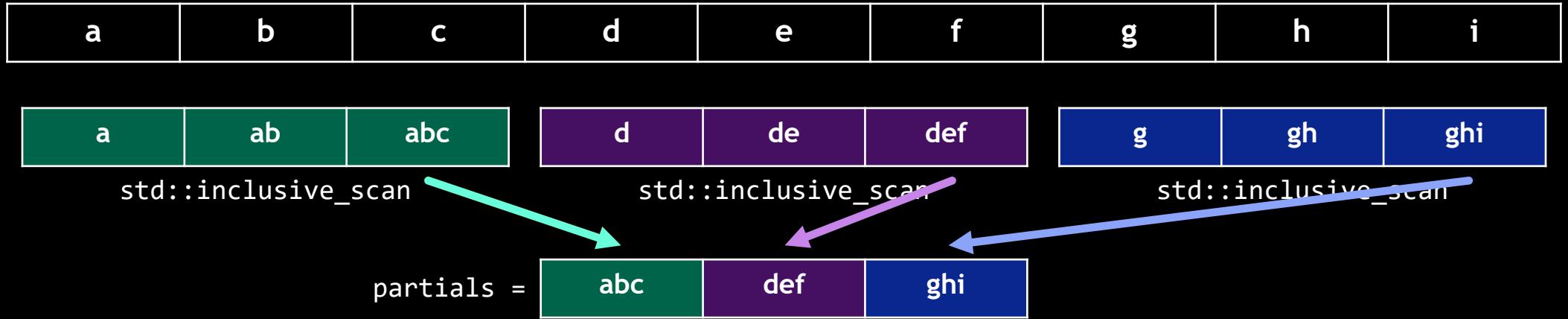
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inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
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                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                            begin(input) + end,
                                                            begin(input) + start);
            })
        ...
}

```





`std::inclusive_scan`

`std::inclusive_scan`

`std::inclusive_scan`

`partials =`



`std::inclusive_scan`

```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then([ ] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            ...
        })
        ...
    }
}

```



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        ...
    }
}

```





`std::inclusive_scan`

`std::inclusive_scan`

`std::inclusive_scan`

`partials =`



`std::inclusive_scan`



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                ...
            })
        ...
    }
}

```



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
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            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [=] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                ...
            })
        ...
    }
}

```



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [=] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                std::for_each(begin(input) + start, begin(input) + end,
                              [&] (auto& e) { e = partials[i] + e; });
            })
        ...
    }
}

```





`std::inclusive_scan`

`std::inclusive_scan`

`std::inclusive_scan`

partials =



`std::inclusive_scan`



Add partials[0]



Add partials[1]



```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                std::for_each(begin(input) + start, begin(input) + end,
                    [&] (auto& e) { e = partials[i] + e; });
            })
        | ex::then( [=] (auto input, auto partials) { return input; });
}

```

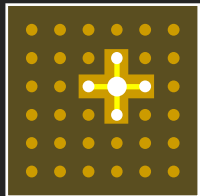
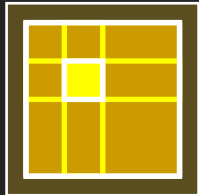
```

inline constexpr sender_adaptor auto
inclusive_scan_async = [] (ex::sender auto last, auto init, std::size_t tile_count) -> ex::sender auto {
    return last
        | ex::then( [=] (std::random_access_range auto input) {
            std::vector<std::range_value_t<decltype(input)>> partials(tile_count + 1);
            partials[0] = init;
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                partials[i + 1] = *--std::inclusive_scan(begin(input) + start,
                                                         begin(input) + end,
                                                         begin(input) + start);
            })
        | ex::then( [] (auto input, auto partials) {
            std::inclusive_scan(begin(partial), end(partial), begin(partial));
            return send_values(input, std::move(partial));
        })
        | ex::bulk(tile_count,
            [=] (std::size_t i, auto input, auto partials) {
                auto tile_size = (input.size() + tile_count - 1) / tile_count;
                auto start     = i * tile_size;
                auto end       = std::min(input.size(), (i + 1) * tile_size);
                std::for_each(begin(input) + start, begin(input) + end,
                    [&] (auto& e) { e = partials[i] + e; });
            })
        | ex::then( [=] (auto input, auto partials) { return input; });
}

```

Pillars of Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries



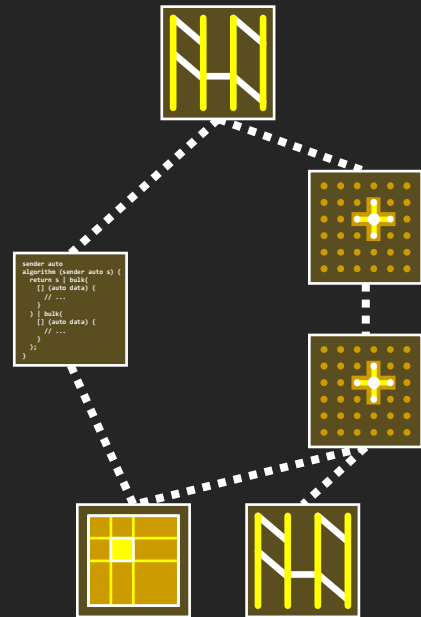
Tools to Write Your Own Parallel Algorithms that Run Anywhere



```
sender auto  
algorithm (sender auto s) {  
    return s | bulk(N,  
        [] (auto data) {  
            // ...  
        }) | bulk(N,  
        [] (auto data) {  
            // ...  
        });  
}
```



Mechanisms for Composing Parallel Invocations into Task Graphs



Today

With Senders & Receivers

#include <C++>

Copyright (C) 2021 Bryce Adelstein Lelbach





Standard Algorithms

Serial (C++98)

```
std::vector<T> x{...};

std::for_each(
    begin(x), end(x),
    f);

std::for_each(
    begin(x), end(x),
    g);

std::for_each(
    begin(x), end(x),
    h);
```

Parallel (C++17)

```
std::vector<T> x{...};

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    f);

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    g);

std::for_each(
    ex::par_unseq,
    begin(x), end(x),
    h);
```

Asynchronous

```
std::vector<T> x(...);

ex::sender auto s
    = ex::transfer_just(sch, x)
    | for_each_async(f)
    | for_each_async(g)
    | for_each_async(h);

this thread::sync wait(s);
```



Today, C++ has no reasonable abstraction for multi-dimensional data.



Today, C++ has no reasonable abstraction for multi-dimensional data.

The solution is coming in C++23:

`std::mdspan`



`std::mdspan`

- Non-owning; pointer + metadata.

`std::mdspan`

- Non-owning; pointer + metadata.
- Metadata can be dynamic or static.



`std::mdspan`

- Non-owning; pointer + metadata.
- Metadata can be dynamic or static.
- Parameterizes layout.



`std::mdspan`

- Non-owning; pointer + metadata.
- Metadata can be dynamic or static.
- Parameterizes layout and access.



```
template <std::size_t... Extents>  
class std::extents;
```




```
template <std::size_t... Extents>  
class std::extents;
```

```
std::extents e0{16, 32};
```

```
// Equivalent to:
```

```
std::extents<std::dynamic_extent, std::dynamic_extent> e1{16, 32};
```

```
e0.rank() == 2
```

```
e0.extent(0) == 16
```

```
e0.extent(1) == 32
```

```
template <std::size_t... Extents>  
class std::extents;
```

```
std::extents e0{16, 32};
```

```
// Equivalent to:
```

```
std::extents<std::dynamic_extent, std::dynamic_extent> e1{16, 32};  
std::dextents<2> e2{16, 32};
```

```
e0.rank() == 2
```

```
e0.extent(0) == 16
```

```
e0.extent(1) == 32
```



```
template <std::size_t... Extents>  
class std::extents;
```

```
std::extents e0{16, 32};
```

```
// Equivalent to:
```

```
std::extents<std::dynamic_extent, std::dynamic_extent> e1{16, 32};  
std::dextents<2> e2{16, 32};
```

```
e0.rank()      == 2  
e0.extent(0)   == 16  
e0.extent(1)   == 32
```

```
std::extents<16, 32> e3;
```



```
template <std::size_t... Extents>  
class std::extents;
```

```
std::extents e0{16, 32};
```

```
// Equivalent to:
```

```
std::extents<std::dynamic_extent, std::dynamic_extent> e1{16, 32};  
std::dextents<2> e2{16, 32};
```

```
e0.rank()      == 2  
e0.extent(0)   == 16  
e0.extent(1)   == 32
```

```
std::extents<16, 32> e3;
```

```
std::extents<16, std::dynamic_extent> e4{32};
```



```
template <std::size_t... Extents>  
class std::extents;
```

```
std::extents e0{16, 32};
```

```
// Equivalent to:
```

```
std::extents<std::dynamic_extent, std::dynamic_extent> e1{16, 32};  
std::dextents<2> e2{16, 32};
```

```
e0.rank()      == 2  
e0.extent(0)   == 16  
e0.extent(1)   == 32
```

```
std::extents<16, 32> e3;
```

```
std::extents<16, std::dynamic_extent> e4{32};
```

```
std::extents e5{16, 32, 48, 4};
```



```
template <
```

```
>
```

```
class std::mdspan;
```



```
template <class I,
```

```
>
```

```
class std::mdspan;
```



```
template <class I,  
         class Extents,
```

>

```
class std::mdspan;
```



```
template <class I,  
          class Extents,  
          class LayoutPolicy = std::layout right,  
  
class std::mdspan;
```

>



```
template <class I,  
          class Extents,  
          class LayoutPolicy = std::layout right,  
          class AccessorPolicy = std::default accessor<T>>  
class std::mdspan;
```

```
template <class I,  
         class Extents,  
         class LayoutPolicy = std::layout right,  
         class AccessorPolicy = std::default accessor<T>>  
class std::mdspan;  
  
std::mdspan m0{data, 16, 32};  
// Equivalent to:  
std::mdspan<double, std::dextents<2>> m1{data, 16, 32};
```

```
template <class I,  
         class Extents,  
         class LayoutPolicy = std::layout right,  
         class AccessorPolicy = std::default accessor<T>>  
class std::mdspan;
```

```
std::mdspan m0{data, 16, 32};
```

```
// Equivalent to:
```

```
std::mdspan<double, std::dextents<2>> m1{data, 16, 32};
```

```
m0[i, j] == data[i * M + j]
```



```

template <class I,
          class Extents,
          class LayoutPolicy = std::layout_right,
          class AccessorPolicy = std::default_accessor<T>>
class std::mdspan;

std::mdspan m0{data, 16, 32};
// Equivalent to:
std::mdspan<double, std::dextents<2>> m1{data, 16, 32};

m0[i, j] == data[i * M + j]

std::mdspan m2{data, std::extents<16, 32>{}};
// Equivalent to:
std::mdspan<double, std::extents<16, 32>> m3{data};

std::mdspan m4{data, std::extents<16, std::dynamic_extent>{32}};

```



Row-Major AKA Right

- C++, NumPy (default)
- Rightmost extent is contiguous

```
mdspan A{data, N, M};  
mdspan A{data, layout_right::mapping{N, M}};
```

```
A[i, j]      == data[i * M + j]  
A.stride(0) == M  
A.stride(1) == 1
```

Row-Major AKA Right

- C++, NumPy (default)
- Rightmost extent is contiguous

```
mdspan A{data, N, M};  
mdspan A{data, layout_right::mapping{N, M}};
```

```
A[i, j] == data[i * M + j]  
A.stride(0) == M  
A.stride(1) == 1
```

Location	Element
0	a_{11}
1	a_{12}
2	a_{21}
3	a_{22}

$$\begin{bmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{bmatrix}$$



Row-Major AKA Right

- C++, NumPy (default)
- Rightmost extent is contiguous

```
mdspan A{data, N, M};  
mdspan A{data, layout right::mapping{N, M}};
```

```
A[i, j] == data[i * M + j]  
A.stride(0) == M  
A.stride(1) == 1
```

Location	Element
0	a_{11}
1	a_{12}
2	a_{21}
3	a_{22}

$$\begin{bmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{bmatrix}$$

Column-Major AKA Left

- Fortran, MATLAB
- Leftmost extent is contiguous

```
mdspan B{data, layout left::mapping{N, M}};
```

```
B[i, j] == data[i + j * N]  
B.stride(0) == 1  
B.stride(1) == N
```



Row-Major AKA Right

- C++, NumPy (default)
- Rightmost extent is contiguous

```
mdspan A{data, N, M};  
mdspan A{data, layout right::mapping{N, M}};
```

```
A[i, j] == data[i * M + j]  
A.stride(0) == M  
A.stride(1) == 1
```

Location	Element
0	a_{11}
1	a_{12}
2	a_{21}
3	a_{22}

$$\begin{bmatrix} a_{11} & a_{12} \\ a_{21} & a_{22} \end{bmatrix}$$

Column-Major AKA Left

- Fortran, MATLAB
- Leftmost extent is contiguous

```
mdspan B{data, layout left::mapping{N, M}};
```

```
B[i, j] == data[i + j * N]  
B.stride(0) == 1  
B.stride(1) == N
```

Location	Element
0	a_{11}
1	a_{21}
2	a_{12}
3	a_{22}



Row-Major AKA Right

- C++, NumPy (default)
- Rightmost extent is contiguous

Column-Major AKA Left

- Fortran, MATLAB
- Leftmost extent is contiguous

```
mdspan A{data, N, M};  
mdspan A{data, layout right::mapping{N, M}};
```

```
A[i, j]      == data[i * M + j]  
A.stride(0) == M  
A.stride(1) == 1
```

```
mdspan B{data, layout left::mapping{N, M}};
```

```
B[i, j]      == data[i + j * N]  
B.stride(0) == 1  
B.stride(1) == N
```

User-Defined Strides

```
mdspan C{data, layout stride::mapping{extents{N, M}, {X, Y}};
```

```
A[i, j]      == data[i * X + j * Y]  
A.stride(0) == X  
A.stride(1) == Y
```



Layouts map (i, j, k, \dots) to a data location.



Layouts map (i, j, k, \dots) to a data location.

Anyone can define a layout.

Layouts map (i, j, k, \dots) to a data location.

Anyone can define a layout.

Layouts may:

➤ Be non-contiguous.

Layouts map (i, j, k, \dots) to a data location.

Anyone can define a layout.

Layouts may:

- Be non-contiguous.
- Map multiple indices to the same location.



Layouts map (i, j, k, \dots) to a data location.

Anyone can define a layout.

Layouts may:

- Be non-contiguous.
- Map multiple indices to the same location.
- Perform complicated computations.



Layouts map (i, j, k, \dots) to a data location.

Anyone can define a layout.

Layouts may:

- Be non-contiguous.
- Map multiple indices to the same location.
- Perform complicated computations.
- Have or refer to state.



**Parametric layout enables
generic multi-dimensional algorithms.**



```
void your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>& m);
```



```
void your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>& m);  
your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>{...});
```



```
void your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>& m);
```

```
your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>{...});  
your_function(boost::numeric::ublas::matrix<double>{...});  
your_function(Mat{...}); // PETSc  
your_function(blaze::DynamicMatrix<double, blaze::rowMajor>{...});  
your_function(cutlass::HostTensor<float, cutlass::layout::ColumnMajor>{...});  
// ...
```



```
void your_function(std::mdspan<T, Extents, Layout, Accessor> m);
```

```
your_function(Eigen::Matrix<double, Eigen::Dynamic, Eigen::Dynamic>{...});  
your_function(boost::numeric::ublas::matrix<double>{...});  
your_function(Mat{...}); // PETSc  
your_function(blaze::DynamicMatrix<double, blaze::rowMajor>{...});  
your_function(cutlass::HostTensor<float, cutlass::layout::ColumnMajor>{...});  
// ...
```



```

struct my_matrix {
public:
    my_matrix(std::size_t N, std::size_t M)
        : num_rows_(N), num_cols_(M), storage_(num_rows_ * num_cols_) {}

    double& operator()(size_t i, size_t j)
    { return storage_[i * num_cols_ + j]; }
    const double& operator()(size_t i, size_t j) const
    { return storage_[i * num_cols_ + j]; }

    std::size_t num_rows() const { return num_rows_; }
    std::size_t num_cols() const { return num_cols_; }

private:
    std::size_t num_rows_, num_cols_;
    std::vector<double> storage_;
};

```



```

struct my_matrix {
public:
    my_matrix(std::size_t N, std::size_t M)
        : num_rows_(N), num_cols_(M), storage_(num_rows_ * num_cols_) {}

    double& operator()(size_t i, size_t j)
    { return storage_[i * num_cols_ + j]; }
    const double& operator()(size_t i, size_t j) const
    { return storage_[i * num_cols_ + j]; }

    std::size_t num_rows() const { return num_rows_; }
    std::size_t num_cols() const { return num_cols_; }

    operator std::mdspan<double, std::dextents<2>> const
{ return {storage_, num_rows_, num_cols_}; }

private:
    std::size_t num_rows_, num_cols_;
    std::vector<double> storage_;
};

```



```
std::mdspan A{input, N, M, 0};
```

```
std::mdspan B{output, N, M, 0};
```

```
auto v = stdv::cartesian_product(  
    stdv::iota(1, A.extent(0) - 1),  
    stdv::iota(1, A.extent(1) - 1),  
    stdv::iota(1, A.extent(2) - 1));
```

```
std::for_each(ex::par_unseq,  
    begin(v), end(v),  
    [=] (auto idx) {  
        auto [i, j, k] = idx;  
        B[i, j, k] = ( A[i, j, k-1] +  
                      A[i-1, j, k] +  
                      A[i, j-1, k] + A[i, j, k] + A[i, j+1, k]  
                      + A[i+1, j, k]  
                      + A[i, j, k+1] ) / 7.0  
    });
```




```

std::mdspan A{input,
               std::layout_left::mapping{N, M, O}};
std::mdspan B{output,
               std::layout_left::mapping{N, M, O}};

```

```

auto v = stdv::cartesian_product(
    stdv::iota(1, A.extent(0) - 1),
    stdv::iota(1, A.extent(1) - 1),
    stdv::iota(1, A.extent(2) - 1));

std::for_each(ex::par_unseq,
    begin(v), end(v),
    [=] (auto idx) {
        auto [i, j, k] = idx;
        B[i, j, k] = ( A[i, j, k-1] +
                       A[i-1, j, k] +
                       A[i, j-1, k] + A[i, j, k] + A[i, j+1, k]
                       + A[i+1, j, k]
                       + A[i, j, k+1] ) / 7.0
    });

```



```
std::span A{input,  N * M};  
std::span B{output, M * N};  
  
auto v = stdv::cartesian_product(  
    stdv::iota(0, N),  
    stdv::iota(0, M));  
  
std::for_each(ex::par_unseq,  
    begin(v), end(v),  
    [=] (auto idx) {  
        auto [i, j] = idx;  
        B[i + j * N] = A[i * M + j];  
    });
```



```
std::mdspan A{input, N, M};  
std::mdspan B{output, M, N};
```

```
auto v = stdv::cartesian_product(  
    stdv::iota(0, A.extent(0)),  
    stdv::iota(0, A.extent(1)));
```

```
std::for_each(ex::par_unseq,  
    begin(v), end(v),  
    [=] (auto idx) {  
        auto [i, j] = idx;  
        B[j, i] = A[i, j];  
    });
```



```
std::mdspan A{input, N, M};  
std::mdspan B{output, M, N};
```

```
std::for_each(  
    ex::par_unseq,  
    A.indices(),  
    [=] (auto [i, j]) {  
        B[j, i] = A[i, j];  
    });
```



```
std::mdspan A{input, N, M};  
std::mdspan B{output, M, N};
```

```
ex::sender auto s =  
    ex::transfer_just(sch, A.indices())  
    | for_each_async(  
        [=] (auto [i, j]) {  
            B[j, i] = A[i, j];  
        });
```



```
submdspan(mdspan<...> m, SliceSpecifiers... ss)  
    -> mdspan<...>
```



submdspan(mdspan<...> m, SliceSpecifiers... ss)
-> mdspan<...>

Slice Specifier	Argument	Reduces Rank?
Single Index	Integral	✓



submdspan(mdspan<...> m, SliceSpecifiers... ss)
-> mdspan<...>

Slice Specifier	Argument	Reduces Rank?
Single Index	Integral	✓
Range of Indices	std::pair<Integral, Integral> std::tuple<Integral, Integral>	✗



submdspan(mdspan<...> m, SliceSpecifiers... ss)
-> mdspan<...>

Slice Specifier	Argument	Reduces Rank?
Single Index	Integral	✓
Range of Indices	std::pair<Integral, Integral> std::tuple<Integral, Integral>	✗
All Indices	std::full_extent	✗

```
std::mdspan m0{64, 128, 32};
```

```
auto m1 = std::submdspan(m0, std::tuple{16, 24},  
                           std::tuple{32, 40},  
                           std::tuple{ 8, 16});
```



```
std::mdspan m0{64, 128, 32};  
  
auto m1 = std::submdspan(m0, std::tuple{16, 24},  
                           std::tuple{32, 40},  
                           std::tuple{ 8, 16});  
  
m1.rank() == 3
```



```
std::mdspan m0{64, 128, 32};
```

```
auto m1 = std::submdspan(m0, std::tuple{16, 24},  
                           std::tuple{32, 40},  
                           std::tuple{ 8, 16});
```

```
m1.rank()      == 3
```

```
m1.extent(0)   == 8
```

```
m1.extent(1)   == 8
```

```
m1.extent(2)   == 8
```



```
std::mdspan m0{64, 128, 32};

auto m1 = std::submdspan(m0, std::tuple{16, 24},
                           std::tuple{32, 40},
                           std::tuple{ 8, 16});

m1.rank()      == 3
m1.extent(0)   == 8
m1.extent(1)   == 8
m1.extent(2)   == 8
m1[i, j, k]    == m0[i + 16, j + 32, k + 8]
```



```

std::mdspan m0{64, 128, 32};

auto m1 = std::submdspan(m0, std::tuple{16, 24},
                          std::tuple{32, 40},
                          std::tuple{ 8, 16});

m1.rank()      == 3
m1.extent(0)   == 8
m1.extent(1)   == 8
m1.extent(2)   == 8
m1[i, j, k]    == m0[i + 16, j + 32, k + 8]

auto m2 = std::submdspan(m0, 16,
                          std::full_extent,
                          32);

```



```

std::mdspan m0{64, 128, 32};

auto m1 = std::submdspan(m0, std::tuple{16, 24},
                           std::tuple{32, 40},
                           std::tuple{ 8, 16});

m1.rank()      == 3
m1.extent(0)   == 8
m1.extent(1)   == 8
m1.extent(2)   == 8
m1[i, j, k]    == m0[i + 16, j + 32, k + 8]

auto m2 = std::submdspan(m0, 16,
                           std::full_extent,
                           32);

m2.rank() == 1

```



```

std::mdspan m0{64, 128, 32};

auto m1 = std::submdspan(m0, std::tuple{16, 24},
                          std::tuple{32, 40},
                          std::tuple{ 8, 16});

m1.rank()      == 3
m1.extent(0)   == 8
m1.extent(1)   == 8
m1.extent(2)   == 8
m1[i, j, k]    == m0[i + 16, j + 32, k + 8]

auto m2 = std::submdspan(m0, 16,
                          std::full_extent,
                          32);

m2.rank()      == 1
m2.extent(0)   == 128

```




```

std::mdspan m0{64, 128, 32};

auto m1 = std::submdspan(m0, std::tuple{16, 24},
                          std::tuple{32, 40},
                          std::tuple{ 8, 16});

m1.rank()      == 3
m1.extent(0)   == 8
m1.extent(1)   == 8
m1.extent(2)   == 8
m1[i, j, k]    == m0[i + 16, j + 32, k + 8]

auto m2 = std::submdspan(m0, 16,
                          std::full_extent,
                          32);

m2.rank()      == 1
m2.extent(0)   == 128
m2[j]          == m0[16, j, 32]

```



```
std::mdspan A{input, N, M};  
std::mdspan B{output, M, N};  
std::size_t T = ...;
```

```
std::mdspan A{input,  N, M};  
std::mdspan B{output, M, N};  
std::size_t T = ...;  
  
auto outer = stdv::cartesian_product(stdv::iota(0, (N + T - 1) / T),  
                                     stdv::iota(0, (M + T - 1) / T));
```

```
std::mdspan A{input,  N, M};  
std::mdspan B{output, M, N};  
std::size_t T = ...;  
  
auto outer = stdv::cartesian_product(stdv::iota(0, (N + T - 1) / T),  
                                     stdv::iota(0, (M + T - 1) / T));  
  
std::for_each(ex::par_unseq, begin(outer), end(outer),  
  [=] (auto tile) {  
    auto [x, y] = tile;  
    ...  
  });
```



```

std::mdspan A{input,  N, M};
std::mdspan B{output, M, N};
std::size_t T = ...;

auto outer = std::cartesian_product(std::iota(0, (N + T - 1) / T),
                                     std::iota(0, (M + T - 1) / T));

std::for_each(ex::par_unseq, begin(outer), end(outer),
  [=] (auto tile) {
    auto [x, y] = tile;
    std::tuple selectN{T * x, std::min(T * (x + 1), N)};
    std::tuple selectM{T * y, std::min(T * (y + 1), M)};

    ...
  });

```



```

std::mdspan A{input, N, M};
std::mdspan B{output, M, N};
std::size_t T = ...;

auto outer = std::cartesian_product(std::iota(0, (N + T - 1) / T),
                                     std::iota(0, (M + T - 1) / T));

std::for_each(ex::par_unseq, begin(outer), end(outer),
  [=] (auto tile) {
    auto [x, y] = tile;
    std::tuple selectN{T * x, std::min(T * (x + 1), N)};
    std::tuple selectM{T * y, std::min(T * (y + 1), M)};

    auto TA = std::submdspan(A, selectN, selectM);
    auto TB = std::submdspan(B, selectM, selectN);

    ...
  });

```



```

std::mdspan A{input, N, M};
std::mdspan B{output, M, N};
std::size_t T = ...;

auto outer = stdv::cartesian_product(stdv::iota(0, (N + T - 1) / T),
                                     stdv::iota(0, (M + T - 1) / T));

std::for_each(ex::par_unseq, begin(outer), end(outer),
  [=] (auto tile) {
    auto [x, y] = tile;
    std::tuple selectN{T * x, std::min(T * (x + 1), N)};
    std::tuple selectM{T * y, std::min(T * (y + 1), M)};

    auto TA = std::submdspan(A, selectN, selectM);
    auto TB = std::submdspan(B, selectM, selectN);

    auto inner = stdv::cartesian_product(stdv::iota(0, TA.extent(0)),
                                          stdv::iota(0, TA.extent(1)));

    ...
  });

```



```

std::mdspan A{input, N, M};
std::mdspan B{output, M, N};
std::size_t T = ...;

auto outer = stdv::cartesian_product(stdv::iota(0, (N + T - 1) / T),
                                     stdv::iota(0, (M + T - 1) / T));

std::for_each(ex::par_unseq, begin(outer), end(outer),
  [=] (auto tile) {
    auto [x, y] = tile;
    std::tuple selectN{T * x, std::min(T * (x + 1), N)};
    std::tuple selectM{T * y, std::min(T * (y + 1), M)};

    auto TA = std::submdspan(A, selectN, selectM);
    auto TB = std::submdspan(B, selectM, selectN);

    auto inner = stdv::cartesian_product(stdv::iota(0, TA.extent(0)),
                                          stdv::iota(0, TA.extent(1)));

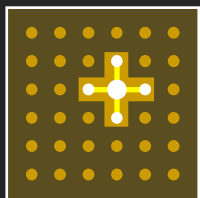
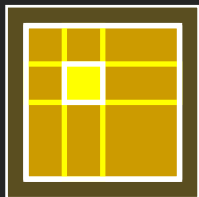
    for (auto [i, j] : inner)
      TB[j, i] = TA[i, j];
  });

```



Pillars of Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries



Expanding the Set

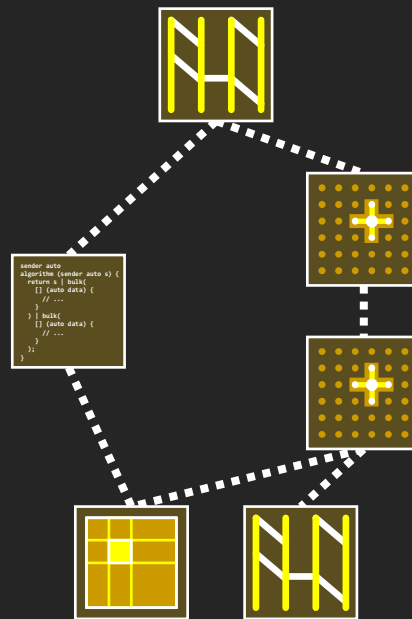
Tools to Write Your Own Parallel Algorithms that Run Anywhere



```
sender auto  
algorithm (sender auto s) {  
    return s | bulk(N,  
        [] (auto data) {  
            // ...  
        }) | bulk(N,  
        [] (auto data) {  
            // ...  
        });  
}
```



Mechanisms for Composing Parallel Invocations into Task Graphs



```
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(  
    ex::par_unseq,  
    std::scaled(3.0, A), x,  
    std::scaled(2.0, y), y);
```



```
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(  
    ex::par_unseq,  
    std::scaled(3.0, A), x,  
    std::scaled(2.0, y), y);
```



```
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(  
    ex::par_unseq,  
    std::scaled(3.0, A), x,  
    std::scaled(2.0, y), y);
```

```

std::mdspan A{..., N, M};
std::mdspan x{..., M};
std::mdspan b{..., N};

// Solve  $A x = b$  where  $A = U^T U$ 

// Solve  $U^T c = b$ , using  $x$  to store  $c$ 
std::triangular matrix vector solve(ex::par_unseq,
                                     std::transposed(A),
                                     std::upper_triangle, std::explicit_diagonal,
                                     b, x);

// Solve  $U x = c$ , overwriting  $x$  with result
std::triangular matrix vector solve(ex::par_unseq,
                                     A,
                                     std::upper_triangle, std::explicit_diagonal,
                                     x);

```

```

std::mdspan A{..., N, M};
std::mdspan x{..., M};
std::mdspan b{..., N};

// Solve  $A x = b$  where  $A = U^T U$ 

// Solve  $U^T c = b$ , using  $x$  to store  $c$ 
std::triangular_matrix_vector_solve(ex::par_unseq,
                                   std::transposed(A),
                                   std::upper_triangle, std::explicit_diagonal,
                                   b, x);

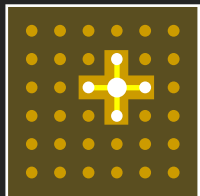
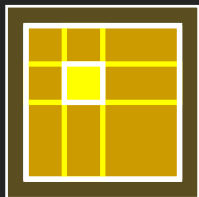
// Solve  $U x = c$ , overwriting  $x$  with result
std::triangular_matrix_vector_solve(ex::par_unseq,
                                   A,
                                   std::upper_triangle, std::explicit_diagonal,
                                   x);

```



Pillars of Standard Parallelism

Common Algorithms that Dispatch to Vendor-Optimized Parallel Libraries



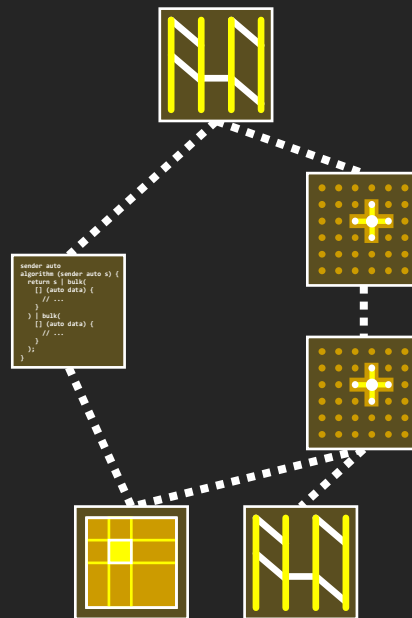
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```
sender auto  
algorithm (sender auto s) {  
    return s | bulk(N,  
        [] (auto data) {  
            // ...  
        }) | bulk(N,  
        [] (auto data) {  
            // ...  
        });  
};
```



Mechanisms for Composing Parallel Invocations into Task Graphs



We Need On-Ramps

