

Parallel STL for CPU and GPU The Future of Heterogeneous/Distributed C++

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Acknowledgement Disclaimer

Numerous people internal and external to the original C++/Khronos group, in industry and academia, have made contributions, influenced ideas, written part of this presentations, and offered feedbacks to form part of this talk. I even lifted this acknowledgement and disclaimer from some of them.

But I claim all credit for errors, and stupid mistakes. These are mine, all mine!

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Agenda

- History of ParallelSTL
- What changed from TS to C++17: the life and times of a TS
- ParallelSTL on a CPU
- One more thing: ParallelSTL on GPU
- Live Demo

C++17 Parallel STL: Democratizing Parallelism in C++

What is Parallel STL?

Parallel STL greatly facilitates the usage of parallelism in C++ by exposing a parallel interface for the STL algorithms.

Why do I care?

Hardware architecture is becoming increasingly parallel. You cannot escape. See Herb Sutter The Eree Lunch Is Over, which is *now over 10 years old now!* More updated version: Welcome to the jungle

What does it include?

It adds wording for parallel execution on the C++ standard, and **Execution Policies** to the STL interface that enable selecting the appropriate level of parallelism.

New parallel algorithms are also added to the interface.

What do I take from this talk?

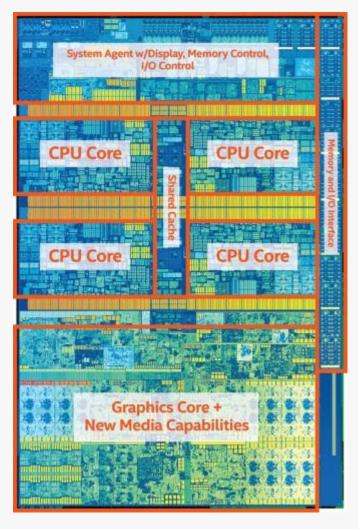
You will understand what Parallel STL is and learn the basic to use them. You'll be ready to use also the SYCL ParallelSTL on your accelerator.

C++ goes parallel!

Current "Desktop" technology



AMD Ryzen (4 cores/socket)



Intel Core i7 7th generation (4 cores + GPU / socket)

- Various libraries existed over the years:
 - •AMD Bolt, NVIDIA Thrust, Microsoft C++ AMP algorithms...
- •In 2012, two separate proposals for parallelism come to C++ standard:
 - •NVIDIA (N3408) based on Thrust
 - Microsoft and Intel (N3429), based on Intel TBB and PPL/C++AMP



- Joint Proposal in 2013:
 - •A Parallel Algorithms Library (n3554)



Proposal evolved/matured for a couple of years

•N3554, N3850, N3960, N4071, N4409...



- •Final proposal P0024R2 accepted for C++17 during Jacksonville
- Many corrections and clarifications before C++17
- •This is the life of a TS from birth to ratification



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Road from Parallelism TS to C++17

- Dropped dynamic execution policy before the TS
- Execution policy Name changed from vec to unseq- Jacksonville Meeting
- Detached exception from attached to algorithm to attached to execution policy
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2016/p0394r4.html
- Removed exception list and replaced with terminate and don't unwind
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2016/p0394r4.html
- Changes to numeric parts:
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2017/p0571r0.html
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2017/p0452r1.html
- Name change for transform_reduce
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2017/p0623r0.html
- Changed random_access_iterator instead of just forward_access_iterator so it can be invalidated safely
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2017/p0523r1.html
- Allowed cloning to arguments enable SYCL accessors
 - http://www.open-std.org/jtc1/sc22/wg21/docs/papers/2017/p0518r0.html

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Sorting with the STL

```
std::vector<int> data = { 8, 9, 1, 4 };
                                                    Normal sequential
                                                    sort algorithm
std::sort(std::begin(data), std::end(data));
if (std::is sorted(data)) {
    Std::cout << " Data is sorted!" << std::endl;
                            std::vector<int> data = { 8, 9, 1, 4 };
                            std::sort(std::execution policy::par,
                                       std::begin(data), std::end(data));
      Extra parameter to STL
      algorithms enable
      parallelism
                            if (std::is sorted(data)) {
                                Std::cout << " Data is sorted!" << std::endl;</pre>
```

The Execution Policy: Standard policy classes

- Defined in the execution namespace
 - Sequenced policy
 - Never do parallel, sequenced in-order execution
 - constexpr sequenced_policy sequenced;
 - Parallel policy
 - Can use caller thread but may span others (std::thread)
 - Invocations do not interleave on a single thread
 - constexpr sequenced_policy par;
 - Parallel unsequenced
 - Can use caller thread or others (e.g std::thread)
 - Multiple invocations may be interleaved on a single thread
 - constexpr sequenced_policy par_unseq;

Many different existing implementations

Available today

- Microsoft: http://parallelstl.codeplex.com
- HPX: http://stellar-group.github.io/hpx/docs/html/hpx/manual/parallel.html
- HSA: http://www.hsafoundation.com/hsa-for-math-science
- Thibaut Lutz: http://github.com/t-lutz/ParalleISTL
- NVIDIA: https://thrust.github.io/doc/group_execution_policies.html
- Codeplay: http://github.com/KhronosGroup/SyclParalleISTL
- Clang: Not yet available

Expect major C++ compilers to implement it soon!

Using execution policies

```
using std::execution_policy;

// May execute in parallel
std::sort(par, std::begin(data), std::end(data))

// May be parallelized and vectorized
std::sort(std::par_unseq, std::begin(data), std::end(data));

// Will not be parallelized/vectorized
std::sort(std::sequenced, std::begin(data), std::end(data));

// Vendor-specific policy, read their documentation!
std::sort(custom_vendor_policy, std::begin(data), std::end(data));
```

Propagating the policy to the end user

```
using std::execution_policy;
template<typename Policy, typename Iterator>
void library_function(Policy p, Iterator begin,
                       Iterator end) {
  std::sort(p, begin, end);
  std::for_each(p, begin, end,
                  [&](Iterator::value_type e&) { e ++;}) ;
  std::for_each(std::sequenced, begin, end,
                 non_parallel_operation) ;
```

Parallel overloads available

Table 1 — Table of parallel algorithms
--

ruble 1 — Tuble of paramet digorithms				
adjacent_difference	adjacent_find	all_of	any_of	
сору	copy_if	copy_n	count	
count_if	equal	exclusive_scan	fill	
fill_n	find	find_end	find_first_of	
find_if	find_if_not	for_each	for_each_n	
generate	generate_n	includes	inclusive_scan	
inner_product	<pre>inplace_merge</pre>	is_heap	is_heap_until	
is_partitioned	is_sorted	is_sorted_until	<pre>lexicographical_compare</pre>	
max_element	merge	min_element	minmax_element	
mismatch	move	none_of	nth_element	
partial_sort	partial_sort_copy	partition	partition_copy	
reduce	remove	remove_copy	remove_copy_if	
remove_if	replace	replace_copy	replace_copy_if	
replace_if	reverse	reverse_copy	rotate	
rotate_copy	search	search_n	set_difference	
set_intersection	<pre>set_symmetric_difference</pre>	set_union	sort	
stable_partition	stable_sort	swap_ranges	transform	
transform_exclusive_scan	transform_inclusive_scan	transform_reduce	uninitialized_copy	
uninitialized_copy_n	uninitialized_fill	$uninitialized_fill_n$	unique	
unique_copy				

New algorithms into the STL: Parallel For Each

```
template<class ExecutionPolicy, class InputIterator, class Function>
void for_each(ExecutionPolicy && exec,InputIterator first,
InputIterator last, Function f);
template<class ExecutionPolicy, class InputIterator, class Size, class
Function>
InputIterator for_each_n(ExecutionPolicy && exec,
                        InputIterator first, Size n,
                         Function f);
template<class InputIterator, class Size, class Function>
InputIterator for_each_n(InputIterator first, Size n, Function f);
```

- for_each: Applies f to elements in range [first, last).
- **for_each_n**: Applies f to elements in [first, first + n)

New algorithms into the STL

Numerical Parallel Algorithms

```
template < class InputIterator >
typename iterator_traits < InputIterator >:: value_type
reduce ( InputIterator first , InputIterator last ) ;

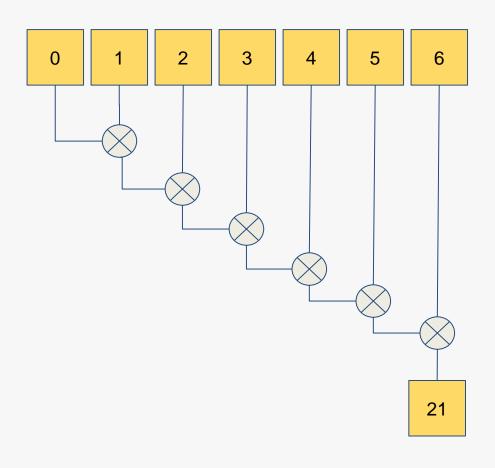
template < class InputIterator , class T >
T reduce ( InputIterator first , InputIterator last , T init ) ;

template < class InputIterator , class T , class BinaryOperation >
T reduce ( InputIterator first , InputIterator last , T init ,
BinaryOperation binary_op ) ;
```

Implements a reduction operation (the order of the binary_op is not relevant).

The sequential equivalent is accumulate

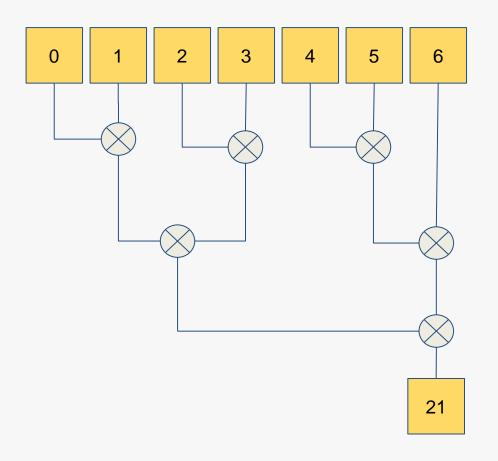
New algorithms into the STL (Serial Reduction pattern)



```
size_t nElems = 1000u;
std::vector<float> nums(nElems);
std::accumulate(std::begin(v1), nElems, 1);
```

Only one core is used for the different additions.

New algorithms into the STL (Parallel Reduction Pattern)



If operation is commutative and associative, can be run in parallel.

Reduction uses all cores!

Transform

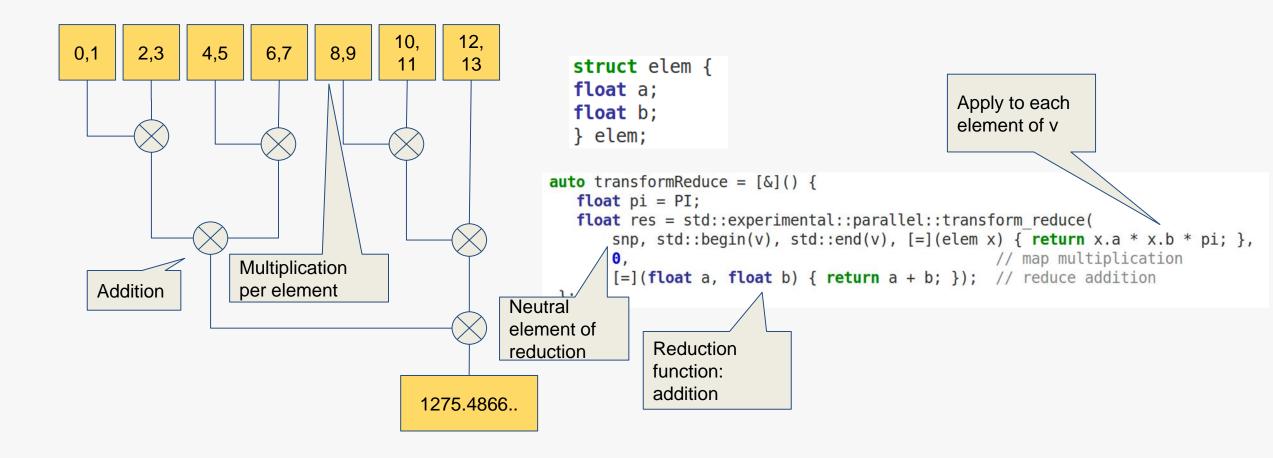
• transform (a.k.a map) applies a function to an input range and stores the result on the output range. Operation is out of order.

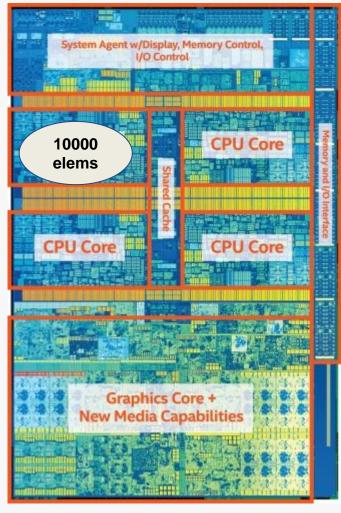
Transform reduce

```
template<class ExecutionPolicy,
         class ForwardIt1, class ForwardIt2, class T>
                                                                                                (since
T transform reduce(ExecutionPolicy&& policy,
                                                                                                C++17
                   ForwardIt1 first1, ForwardIt1 last1, ForwardIt2 first2, T init);
template<class ExecutionPolicy,
         class ForwardIt1, class ForwardIt2, class T, class BinaryOp1, class BinaryOp2>
                                                                                                (since
T transform reduce(ExecutionPolicy&& policy,
                                                                                                C++17)
                   ForwardIt1 first1, ForwardIt1 last1, ForwardIt2 first2,
                   T init, BinaryOp1 binary op1, BinaryOp2 binary op2);
template<class ExecutionPolicy,
         class ForwardIt, class T, class BinaryOp, class UnaryOp>
                                                                                                (since
T transform reduce(ExecutionPolicy&& policy,
                                                                                                C++17
                   ForwardIt first, ForwardIt last,
                   T init, BinaryOp binary op, UnaryOp unary op);
```

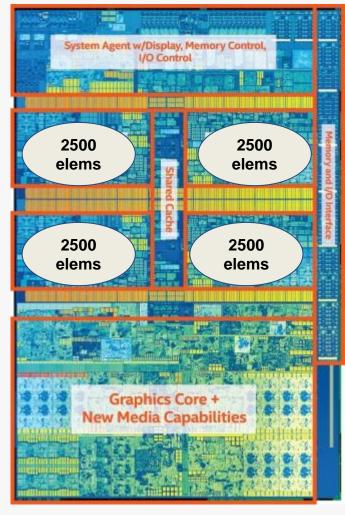
 transform_reduce applies a function to an input range and then applies the binary operation to reduce the values

Transform Reduce example





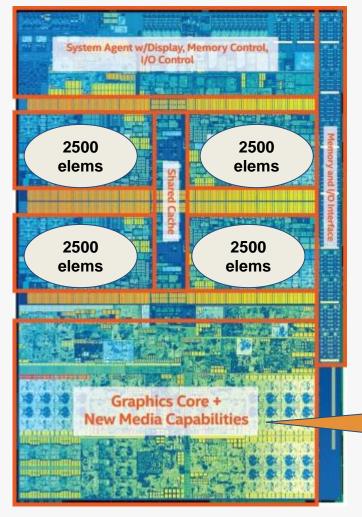
Intel Core i7 7th generation



Intel Core i7 7th generation

Workload is distributed across cores!

(mileage may vary, implementation-specific behaviour)



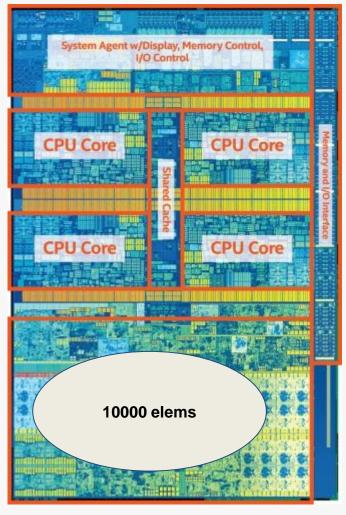
Intel Core i7 7th generation

Workload is distributed across cores!

(mileage may vary, implementation-specific behaviour)

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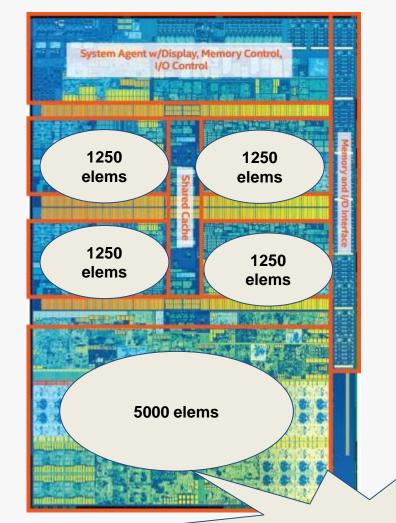


Intel Core i7 7th generation



```
size_t nElems = 1000u;
std::vector<float> nums(nElems);
std::fill_n(sycl_policy,
          std::begin(v1), nElems, 1);
std::for_each(sycl_named_policy
              <class KernelName>,
             std::begin(v), std::end(v),
              [=](float f) \{ f * f + f \});
Workload is distributed on the GPU cores
```

(mileage may vary, implementation-specific behaviour)





```
size_t nElems = 1000u;
std::vector<float> nums(nElems);
std::fill_n(sycl_heter_policy(cpu, gpu, 0.5),
          std::begin(v1), nElems, 1);
std::for_each(sycl_heter_policy<class kName>
             (cpu, gpu, 0.5),
             std::begin(v), std::end(v),
              [=](float f) \{ f * f + f \});
   Workload is distributed on all cores!
```

Intel Core i7 7th

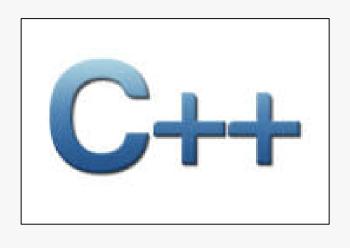
Experimental!

(mileage may vary, implementation-specific behaviour)

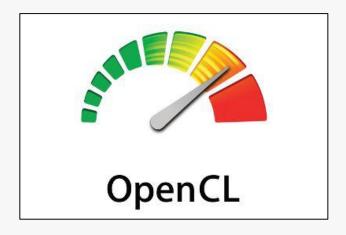
Parallel overloads available in SYCL Parallel STL

Table 1 — Table of parallel algorithms adjacent difference adjacent find all of any of copy if 🗸 copy n count copy count if 🗸 exclusive scan fill 🗸 equal find 🗸 fill n find end find first of for each_n < for each 🗸 find if 🚺 find_if_not inclusive scan includes generate generate n is heap until inner product 🗸 inplace merge is heap is partitioned lexicographical compare is sorted is sorted until min element minmax element max element merge mismatch none of nth element move partition_copy partial sort partial sort copy partition reduce 🗸 remove copy if remove copy remove remove if replace copy replace copy if replace replace if reverse copy rotate reverse set difference rotate copy search search n set intersection sort 🗸 set symmetric difference set union stable partition stable sort swap ranges transform 🗸 transform_exclusive_scan transform_inclusive_scan transform_reduce uninitialized copy uninitialized copy n uninitialized fill uninitialized fill n unique unique copy

SYCL for OpenCL

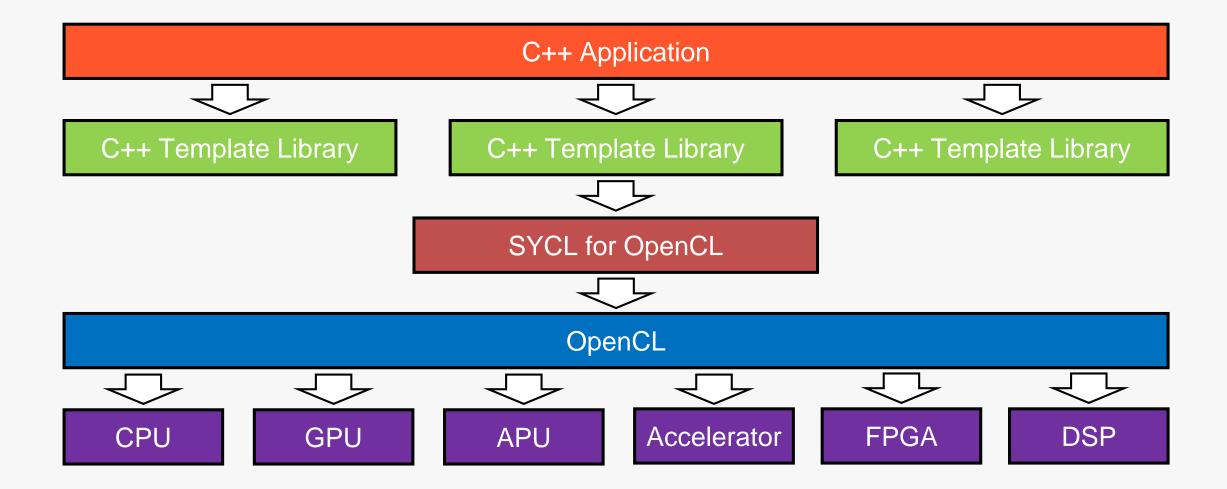






- > Cross-platform, single-source, high-level, C++ programming layer
 - ➤ Built on top of OpenCL and based on standard C++14

The SYCL Ecosystem





```
#include <CL/sycl.hpp>
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
```

```
#include <CL/sycl.hpp>
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
  cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
  cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
  cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
                       The buffers
                    synchronise upon
                       destruction
```

```
#include <CL/sycl.hpp>
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
  cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
  cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
  cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
  cl::sycl::queue defaultQueue;
```

```
#include <CL/sycl.hpp>
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
  cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
  cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
  cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
  cl::sycl::queue defaultQueue;
                                                               Create a command group to
 defaultQueue.submit([&] (cl::sycl::handler &cqh)
                                                               define an asynchronous task
```

```
#include <CL/sycl.hpp>
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
  cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
 cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
  cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
  cl::sycl::queue defaultQueue;
  defaultQueue.submit([&] (cl::sycl::handler &cgh) {
   auto inputAPtr = inputABuf.get access<cl::sycl::access::read>(cgh);
    auto inputBPtr = inputBBuf.get access<cl::sycl::access::read>(cgh);
    auto outputPtr = outputBuf.get access<cl::sycl::access::write>(cgh);
  });
```

```
#include <CL/sycl.hpp>
template <typename T> kernel;
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out)
 cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
                                                              You must provide
 cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
                                                               a name for the
 cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
                                                                 lambda
 cl::sycl::queue defaultQueue;
 defaultQueue.submit([&] (cl::sycl::handler &cqh)
   auto inputBPtr = inputBBuf.get access::read>(cgh);
   auto outputPtr = outputBuf get access<cl::sycl::access::write>(cgh);
   cgh.parallel for<kernel<T>>(cl::sycl::range<1>(out.size())),
                            [=](cl::sycl::id<1> idx) {
                                                               Create a parallel_for
                                                               to define the device
                                                                    code
```

```
#include <CL/sycl.hpp>
template <typename T> kernel;
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> &out) {
  cl::sycl::buffer<T, 1> inputABuf(inA.data(), out.size());
 cl::sycl::buffer<T, 1> inputBBuf(inB.data(), out.size());
  cl::sycl::buffer<T, 1> outputBuf(out.data(), out.size());
  cl::sycl::queue defaultQueue;
  defaultQueue.submit([&] (cl::sycl::handler &cqh) {
    auto inputAPtr = inputABuf.get access<cl::sycl::access::read>(cgh);
    auto inputBPtr = inputBBuf.get access<cl::sycl::access::read>(cgh);
    auto outputPtr = outputBuf.get access<cl::sycl::access::write>(cgh);
    cgh.parallel for<kernel<T>>(cl::sycl::range<1>(out.size())),
                              [=](cl::sycl::id<1> idx) {
      outputPtr[idx] = inputAPtr[idx] + inputBPtr[idx];
   }));
  });
```

```
template <typename T>
void parallel add(std::vector<T> inA, std::vector<T> inB, std::vector<T> out);
int main() {
  std::vector<float> inputA = { /* input a */ };
  std::vector<float> inputB = { /* input b */ };
  std::vector<float> output = { /* output */ };
 parallel add(inputA, inputB, output);
```

Implementing Parallel STL with SYCL

```
/* sycl_execution_policy.
* The sycl_execution_policy enables algorithms to be executed using
* a SYCL implementation.
template <class KernelName = DefaultKernelName>
class sycl_execution_policy {
 cl::sycl::queue m_q;
public:
 // The kernel name when using lambdas
                                                              Creates a SYCL policy
 using kernelName = KernelName;
                                                              using an existing queue
 sycl_execution_policy() = default;
 sycl_execution_policy(cl::sycl::queue q) : m_q(q){};
 sycl_execution_policy(const sycl_execution_policy&) = default;
 // Returns the name of the kernel as a string
                                                                                Typeid information only valid for
 std::string get_name() const { return typeid(kernelName).name(); };
                                                                                debugging
 // Returns the queue, if any
 cl::sycl::queue get_queue() const { return m_q; }
```

Implementing Parallel STL with SYCL

```
/* for_each

*/

Iterator can be any RandomAccess tag
```

Functions can take C++ iterators or SYCL-specific iterators

```
template <class Iterator, class UnaryFunction>
void for_each(Iterator b, Iterator e, UnaryFunction f) {
  impl::for_each(*this, b, e, f);
}
```

For_each member function on the policy forwards to implementation

```
template <class ExecutionPolicy, class Iterator, class UnaryFunction>
void for_each(ExecutionPolicy &sep, Iterator b, Iterator e, UnaryFunction op) {
                                             Obtain the queue from the policy
  cl::sycl::queue q(sep.get_queue());
  auto device = q.get_device();
                                          Obtain device parameters
  size_t localRange =
     device.get_info<cl::sycl::info::device::max_work_group_size>();
  auto bufl = sycl::helpers::make_buffer(b, e); __
                                                                Prepare allocations on device
  auto vectorSize = bufl.get_count();
  size_t globalRange = sep.calculateGlobalSize(vectorSize, localRange);
```



```
auto f = [vectorSize, localRange, globalRange, &bufl, op](
   cl::sycl::handler &h) mutable {
 cl::sycl::nd_range<1> r{
    cl::sycl::range<1>{std::max(globalRange, localRange)},
    cl::sycl::range<1>{localRange}};
 auto al = bufl.template get_access<cl::sycl::access::mode::read_write>(h);
 h.parallel_for<typename ExecutionPolicy::kernelName>(
    r, [al, op, vectorSize](cl::sycl::nd_item<1> id) {
      if (id.get_global(0) < vectorSize) {</pre>
                                                       Device Lambda
       op(al[id.get_global(0)]);
                                  User functor
q.submit(f);
                   Submit for execution on the
                         device
```

Demo time

Demo Results - Running std::sort (Running on Intel i7 6600 CPU & Intel HD Graphics 520)

size	2^16	2^17	2^18	2^19
std::seq	0.27031s	0.620068s	0.669628s	1.48918s
std::par	0.259486s	0.478032s	0.444422s	1.83599s
std::unseq	0.24258s	0.413909s	0.456224s	1.01958s
sycl_execution_policy	0.273724s	0.269804s	0.277747s	0.399634s

Future direction

Future Heterogeneous/Distributed directions in C++

- SG14/SG1 driving towards a future TS in Heterogeneous ISO C++
 - Executors enables multiple resources
 - Asynchronous Algorithm enables latency hiding
 - Context
 - Affinity before inaccessible memory
 - Data movement to access inaccessible memory
 - Exception handling in a concurrent environment

Executors

invoke async

parallel algorithms

future::then

post

defer

define_task_block

dispatch

asynchronous operations

strand<>

Unified interface for execution

SYCL / OpenCL / CUDA / HCC

OpenMP / MPI

C++ Thread Pool

Boost.Asio / Networking TS













Summary

- Show History of Parallelism TS
- Discussed the path from a TS to C++17, many changes and continued discussions in design points based on feedback
- Showed Parallelism STL running on CPU
- ... and on GPU
- Show future direction in Heterogeneous/Distributed ISO C++

Thanks for Listening







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What are Thread Execution Steps

- Termination of the thread of execution
- Performing an access through a volatile glvalue
- Completion of a call to a library I/O function
- Synchronization operation (e.g. mutex)
- Atomic operation

A thread of execution makes progress when an execution step occurs

Forward Progress Guarantees

Concurrent forward progress

If a thread offers concurrent forward progress guarantee, it will make progress (as defined above) in finite amount of time, for as long as it has not terminated, regardless of whether other threads (if any) are making progress.

The standard encourages, but doesn't require that the main thread and the threads started by std::thread offer concurrent forward progress guarantee.

Forward Progress Guarantees

Parallel forward progress

If a thread offers *parallel forward progress guarantee*, the implementation is not required to ensure that the thread will eventually make progress if it has not yet executed any execution step (I/O, volatile, atomic, or synchronization), but once this thread has executed a step, it provides *concurrent forward progress* guarantees (this rule describes a thread in a thread pool that executes tasks in arbitrary order)

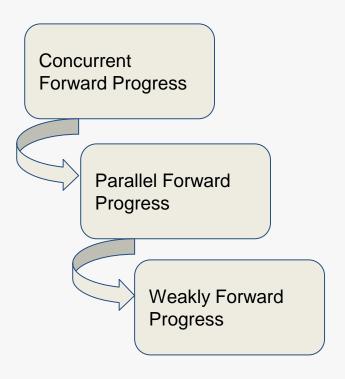
Forward Progress Guarantees

Weakly parallel forward progress

If a thread offers weakly parallel forward progress guarantee, it does not guarantee to eventually make progress, regardless of whether other threads make progress or not.

The parallel algorithms from the C++ standard library block with forward progress delegation on the completion of an unspecified set of library-managed threads.

What does that means



- Concurrent Forward Progress
 - all threads can progress completely independent
- Parallel Forward Progress
 - When a thread starts will finish but no guarantees that all threads will start simultaneously
- Weakly Forward Progress
 - No guarantees when/if a thread will re-start