

STL Algorithms Principles and Practice

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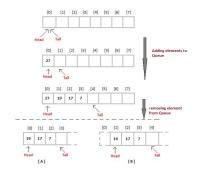
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Agenda

Part 0: STL Background



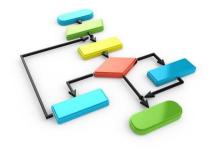
Part 1: Containers and Iterators



Part 2: STL Function Objects and Utilities



Part 3-4: STL Algorithms Principles and Practice



STL Background

(recap prerequisites)

STL and Its Design Principles

Generic Programming



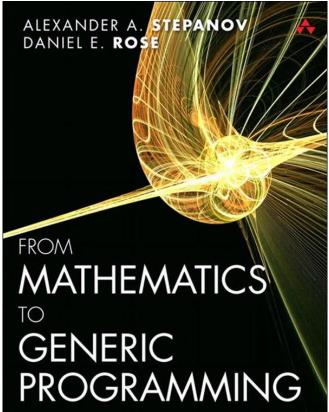
- algorithms are associated with a set of common properties
 Eg. op { +, *, min, max } => associative operations => reorder operands
 => parallelize + reduction (std::accumulate)
- find the most general representation of algorithms (abstraction)
- exists a **generic algorithm** behind every WHILE or FOR loop
- natural extension of 4,000 years of **mathematics**

Alexander Stepanov (2002),

STL and Its Design Principles

Generic Programming

- Egyptian multiplication ~ 1900-1650 BC
- Ancient Greek number theory
- Prime numbers
- Euclid's GCD algorithm
- Abstraction in mathematics
- Deriving generic algorithms
- Algebraic structures
- Programming concepts
- Permutation algorithms
- Cryptology (RSA) ~ 1977 AD



STL Data Structures

- they implement whole-part semantics (copy is deep members)
- 2 objects never intersect (they are separate entities)
- 2 objects have separate lifetimes
- STL algorithms work only with *Regular* data structures
- **Semiregular** = Assignable + Constructible (both Copy and Move operations)
- **Regular** = Semiregular + *EqualityComparable*
- => STL assumes **equality** is always defined (at least, equivalence relation)



Video: "Regular Types and Why Do I Care"

STL Iterators

- Iterators are the mechanism that makes it possible to *decouple* algorithms from containers.
- Algorithms are *template functions* parameterized by the **type of iterator**, so they are not restricted

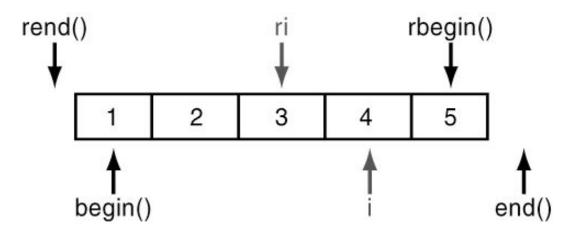
to a single type of container.

- An iterator represents an abstraction for a memory address (**pointer**).
- An iterator is an **object** that can iterate over elements in an STL container or range.
- All containers provide iterators so that algorithms can access their elements in a *standard* way.

STL Iterators

Ranges

- STL ranges are always semi-open intervals: [b, e)
- Get the beginning of a range/container: **v.begin()**; or **begin(v)**;
- You can get a reference to the first element in the range by: ***v.begin()**;
- You cannot dereference the iterator returned by: **v.end()**; or **end(v)**;



STL Iterators

Iterate a collection (range-for)

```
std::array<int, 5 > v = \{2, 4, 6, 8, 10\};
```

```
for(auto it = v.begin(); it != v.end(); ++it) { ... }
```

```
auto it = v.begin();
auto end = v.end();
for(; it != end; ++it) { ... }
```

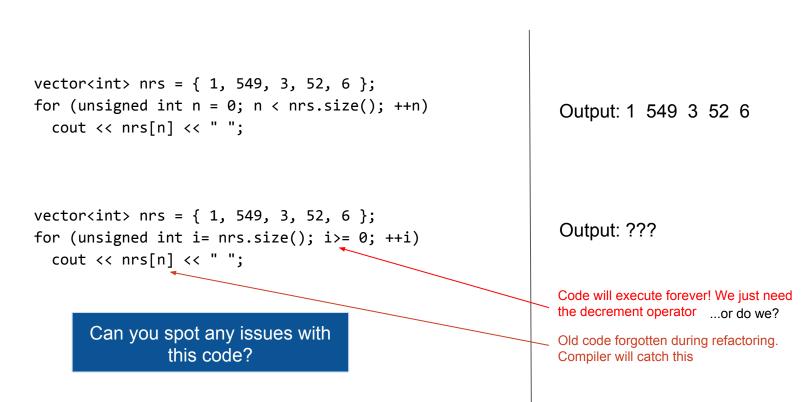
for(auto val : v) { ... }

https://cppinsights.io

C-style iteration vs STL Iterators

Refactor existing code so that is prints numbers in reverse order.

The C way



C-style iteration vs STL Iterators

Refactor existing code so that is prints numbers in reverse order.

The STL Iterators way

```
vector<int> nrs = { 1, 549, 3, 52, 6 };
                                                                            Output: 1 549 3 52 6
for (auto i = nrs.begin(), endIt = nrs.end(); i != endIt; ++i)
   cout << *it << " ";</pre>
vector<int> nrs = { 1, 549, 3, 52, 6 };
for (auto it = nrs.rbegin(), endIt = nrs.rend(); i != endIt; ++it)
                                                                            Output: 6 52 3 549 1
 cout << *it << " ";</pre>
       Can you spot any issues with
                 this code?
                                            Old code forgotten during refactoring.
                                            Compiler will catch this
```

C-style iteration vs STL Iterators

Refactor existing code so that is prints numbers in reverse order.

The range-for way

```
vector<int> numbers = { 1, 549, 3, 52, 6 };
for (auto i : numbers)
    cout << i << " ";</pre>
```

```
vector<int> numbers = { 1, 549, 3, 52, 6 };
for (auto i : reverse(numbers))
    cout << i << " ";</pre>
```

✓ No issues here^h

Output: 1 549 3 52 6

Output: 6 52 3 549 1



Iterate a collection in reverse order

std::vector<int> values;

C style:

```
for (int i = values.size() - 1; i >= 0; --i)
  cout << values[i] << endl;</pre>
```

C++98:

for(vector<int>::reverse_iterator it = v.rbegin(); it != v.rend(); ++it) { ... }

STL + Lambdas:

for_each(values.rbegin()), values.rend(),
 [](const string & val) { cout << val << endl; });</pre>

Modern C++ range-for, using iterator adapter:

for (auto & val : reverse(values)) { cout << val << endl; }</pre>

Iterator Adaptors

```
Iterate a collection in reverse order
```

```
namespace detail
  template <typename T>
  struct reversion wrapper
    T & mContainer;
  };
/**
 * Helper function that constructs
 * the appropriate iterator type based on ADL.
 */
template <typename T>
detail::reversion wrapper<T> reverse(T && aContainer)
  return { aContainer };
```

Iterator Adaptors

Iterate a collection in reverse order

```
namespace std
{
  template <typename T>
  auto begin(detail::reversion_wrapper<T> aRwrapper)
  {
    return rbegin(aRwrapper.mContainer);
  }
  template <typename T>
  auto end(detail::reversion_wrapper<T> aRwrapper)
  {
    return rend(aRwrapper.mContainer);
  }
}
```



Iterator Adaptors

Iterate through an associative container keys or values

std::map<int, string> m; // container value types are <key, value> pairs

for (auto & key : IterateFirst(m)) { cout << key << endl; }</pre>

for (auto & val : IterateSecond(m)) { cout << val << endl; }</pre>

Using the same technique shown for **reverse()** iteration adaptor, implement **IterateFirst()** and **IterateSecond()** adaptors.

Email solutions to: gabriel.diaconita@caphyon.com

Function Objects Basics

```
template<class InputIt, class UnaryFunction>
void std::for each( InputIt first, InputIt last, UnaryFunction func )
  for(; first != last; ++first)
    func( *first );
struct Printer // our custom functor for console output
 void operator() (const std::string & str)
  {
    std::cout << str << std::endl;</pre>
};
std::vector<std::string> vec = { "STL", "function", "objects", "rule" };
std::for each(vec.begin(), vec.end(), Printer());
```

Lambda Functions

```
struct Printer // our custom functor for console output
{
   void operator()(const string & str)
   {
      cout << str << endl;
   }
};
std::vector<string> vec = { "STL", "function", "objects", "rule" };
std::for_each(vec.begin(), vec.end(), Printer());
```

```
// using a lambda
std::for_each(vec.begin(), vec.end(),
       [](const string & str) { cout << str << endl; });</pre>
```

Lambda Functions

[capture-list] (params) mutable_(optional) -> ret { body }

[capture-list] (params) -> ret { body }

[capture-list] (params) { body }

```
[ capture-list ] { body }
```

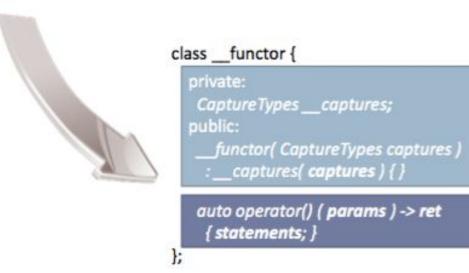
Capture list can be passed as follows :

- **[a, &b]** where **a** is captured by *value* and **b** is captured by *reference*.
- [this] captures the this pointer by value
- **[&]** captures all automatic variables **used** in the body of the lambda by *reference*
- [=] captures all automatic variables **used** in the body of the lambda by **value**
- [] captures *nothing*

Anatomy of A Lambda

Lambdas == Functors

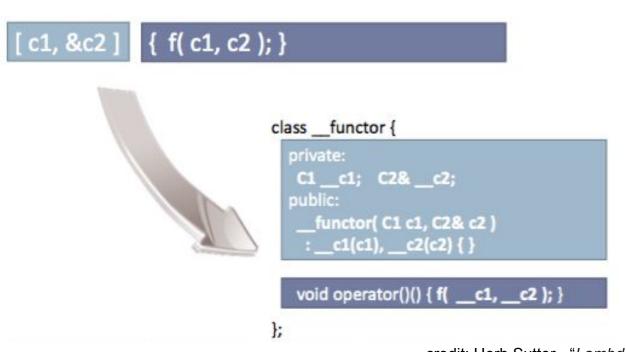
[captures] (params) -> ret { statements; }



credit: Herb Sutter - "Lambdas, Lambdas Everywhere" https://www.youtube.com/watch?v=rcqRY7sOA58

Anatomy of A Lambda

Capture Example

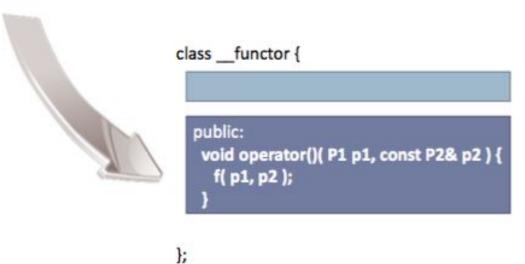


credit: Herb Sutter - "Lambdas, Lambdas Everywhere" https://www.youtube.com/watch?v=rcgRY7sOA58

Anatomy of A Lambda

Parameter Example

[] (P1 p1, const P2& p2) { f(p1, p2); }



credit: Herb Sutter - "Lambdas, Lambdas Everywhere" https://www.youtube.com/watch?v=rcgRY7sOA58

Lambda Functions

```
std::list<Person> members = {...};
unsigned int minAge = GetMinimumAge();
members.remove_if( [minAge](const Person & p) { return p.age < minAge; } );</pre>
// compiler generated code:
struct Lambda 247
{
  Lambda 247(unsigned int minAge) : minAge( minAge) {}
  bool operator()(const Person & p) { return p.age < minAge; }</pre>
  unsigned int minAge;
};
```

members.remove_if(Lambda_247(minAge));

https://cppinsights.io

Prefer Function Objects or Lambdas to Free Functions

```
vector<int> v = { ... };
```

```
bool GreaterInt(int i1, int i2) { return i1 > i2; }
```

sort(v.begin(), v.end(), GreaterInt); // pass function pointer

```
sort(v.begin(), v.end(), greater<>());
```

sort(v.begin(), v.end(), [](int i1, int i2) { return i1 > i2; });

Function Objects and Lambdas leverage **operator()** inlining vs. indirect **function call** through a *function pointer*

This is the main reason **std::sort()** outperforms **qsort()** from **C**-runtime by at least 500% in typical scenarios, on large collections.

STL Algorithms - Principles and Practice

"Prefer algorithm calls to hand-written loops."

Scott Meyers, "Effective STL"

Goal: No Raw Loops {}

Sean Parent - C++ Seasoning, 2013

Whenever you want to write a **for/while** loop:

for(int i = 0; i < v.size(); ++i) { ... }</pre>

Put the Mouse Down and Step Away from the Keyboard !

Burk Hufnagel

Correctness

Fewer opportunities to write bugs like:

- iterator invalidation
- copy/paste bugs
- iterator range bugs
- loop continuations or early loop breaks
- guaranteeing loop invariants
- issues with algorithm logic

Code is a liability: maintenance, people, knowledge, dependencies, sharing, etc.

More code => more bugs, more test units, more maintenance, more documentation

Code Clarity

- Algorithm **names** say what they do.
- Raw "for" loops don't (without reading/understanding the whole body).
- We get to program at a higher level of **abstraction** by using well-known **verbs** (find, sort, remove, count, transform).
- A piece of code is **read** many more times than it's **modified**.
- **Maintenance** of a piece of code is greatly helped if all future programmers

understand (with confidence) what that code does.

Is simplicity a good goal ?

- Simpler code is more **readable** code
- Unsurprising code is more **maintainable** code
- Code that moves complexity to abstractions often has less bugs
 - corner cases get covered by the **library** writer
 - **RAII** ensures nothing is forgotten
- Compilers and libraries are often much better than you (**optimizing**)
 - they're guaranteed to be better than someone who's not measuring

What does it mean for code to be simple ?

- Easy to **read**
- Understandable and expressive
- Usually, **shorter** means simpler (but not always)
- **Idioms** can be simpler than they first appear (because they are recognized)

Simplicity ?

- We can't have simplicity **everywhere**
- The problems we're trying to solve or model are **complicated**
- Moving complexity to a **library** (or another **abstraction**) is good
- Complicated **guidelines** that lead us to writing simpler code are good
 - Being <u>forced to think</u> about resources, lifetime management, invariants, etc. is also good, even if it's sometimes painful.

Simplicity is Not Just for Beginners

- Requires knowledge
 - language / syntax
 - \circ idioms
 - what can go wrong
 - what might change some day
- Simplicity is an act of generosity
 - \circ to others
 - \circ to future you
- Not about skipping or leaving out
 - \circ error handling
 - \circ testing
 - \circ documentation
 - meaningful names

Modern C++ (C++11/14/17 standards)

- Modern C++ adds more useful algorithms to the STL library.
- Makes existing algorithms much easier to use due to simplified language syntax and lambda functions (closures).

```
for(vector<string>::iterator it = v.begin(); it != v.end(); ++it) { ... }
```

```
for(auto it = v.begin(); it != v.end(); ++it) { ... }
```

```
for(auto it = v.begin(), end = v.end(); it != end; ++it) { ... }
```

```
std::for_each(v.begin(), v.end(), [](const auto & val) { ... });
```

```
for(const auto & val : v) { ... }
```

Performance / Efficiency

- Vendor implementations are highly **tuned** (most of the time).
- Avoid some unnecessary temporary copies (leverage **move** operations for objects).
- Function helpers and functors are **inlined** away (no abstraction penalty).
- Compiler optimizers can do a better job without worrying about **pointer aliasing** (auto-vectorization, auto-parallelization, loop unrolling, dependency checking, etc.).

The difference between Efficiency and Performance

Why do we care ?

Because: "Software is getting slower more rapidly than hardware becomes faster."

"A Plea for Lean Software" - Niklaus Wirth

	Efficiency	Performance	Noted, systematic, and parametering treatment of basis and dynamic data	
	the amount of work you need to do	how fast you can do that work	structures, uniform, recursive algorithms, language structures, and compiling	NIKLAUS WIRTH
	governed by your algorithm	governed by your data structures		Algorithms +
Efficiency and performance are not dependant on one another.			PRENTICE HALL BENCE IN AUTOMATIC EOUNLTATION	Structures = Programs

Optimization

Strategy:

- 1. **Identification**: profile the application and identify the worst performing parts.
- 2. **Comprehension**: understand what the code is trying to achieve and why it is slow.
- 3. **Iteration**: change the code based on step 2 and then re-profile; repeat until fast enough.

Very often, code becomes a bottleneck for one of four reasons:

• It's being called too often.

Don't trust your instinct.

Competitive programming

Always Benchmark !

- It's a bad choice of algorithm: $O(n^2)$ vs O(n), for example.
- It's doing unnecessary work or it is doing necessary work too frequently.
- The data is bad: either too much data or the layout and access patterns are bad.

Performance / Efficiency Parallelize + Reduction (map/reduce)

C++17 supports parallel versions of the std::algorithms (many of them)

=> WOW ! It became really simple to write parallel code 🞉

Eg.

```
template< class InputIt, class T >
InputIt find( InputIt first, InputIt last, const T& value );
template< class ExecutionPolicy, class ForwardIt, class T >
ForwardIt find( ExecutionPolicy&& policy, ForwardIt first, ForwardIt last, const T& value );
```

Not so fast ! Let's see...



ExecutionPolicy

- std::execution::seq
 - same as non-parallel algorithm (invocations of element access functions are indeterminately sequenced in the calling thread)
- std::execution::par
 - execution may be *parallelized* (invocations of element access functions are permitted to execute in either the *invoking thread* or in a *thread created* by STL implicitly)
 - invocations executing in the same thread are *indeterminately* sequenced with respect to each other
- std::execution::par_unseq
 - execution may be *parallelized*, *vectorized*, or *migrated* across threads (by STL)
 - invocations of element access functions are permitted to execute:
 - in an **unordered** fashion
 - in *unspecified* threads
 - unsequenced with respect to one another, within each thread

```
template<class Iterator>
size_t seq_calc_sum(Iterator begin, Iterator end)
{
    size_t x = 0;
    std::for_each(begin, end, [&](int item) {
        x += item;
    });
    return x;
}
```

```
template<class Iterator>
size_t par_calc_sum(Iterator begin, Iterator end)
{
    size_t x = 0;
    std::for_each(std::execution::par, begin, end, [&](int item) {
        x += item; <= data race; fast, but often causes wrong result!
    });
    return x;
}</pre>
```

```
template<class Iterator>
size_t par_calc_sum(Iterator begin, Iterator end)
{
  size_t x = 0;
  std::mutex m;
  std::for_each(std::execution::par, begin, end, [&](int item) {
    std::lock_guard<std::mutex> guard(m); <= ~90x slower than sequential version</pre>
    x += item;
  });
  return x;
}
```

```
template<class Iterator>
size_t par_calc_sum(Iterator begin, Iterator end)
{
    std::atomic<size_t> x = 0;
    std::for_each(std::execution::par, begin, end, [&](int item) {
        x += item; // or x.fetch_add(item); <= ~50x slower than sequential version
    });
    return x;
}</pre>
```

Always Benchmark !

Don't trust your instinct.

Results

Box	non- parallelized	std::execution::par with std::mutex	std::execution::par with std::atomic
#1 (4 physical, 8 logical cores)	470+-4us	41200+-900us (90x slower, 600x+ less power-efficient)	23400+-140us (50x slower, 300x+ less power-efficient)
#2 (2 physical, 4 logical cores)	900+-150us	52500+-6000us (60x slower, 200x+ less power- efficient)	25100+-4500us (30x slower, 100x+ less power-efficient)

```
template<class RandomAccessIterator>
size t par calc sum(RandomAccessIterator begin, RandomAccessIterator end)
  // reduce the synchronization overhead by partitioning the load
  constexpr int NCHUNKS = 128;
  assert( (end-begin) % NCHUNKS == 0 ); // for simplicity of slide code
  const size t sz = (end - begin) / NCHUNKS; // size of a chunk
                                         // start offsets for all chunks
  RandomAccessIterator starts[NCHUNKS];
  for (int i = 0; i < NCHUNKS; ++i)
  {
    starts[i] = begin + sz * i;
    assert(starts[i] < end);</pre>
  }
  std::atomic<size t> total = 0;
  std::for each(std::execution::par, starts, starts + NCHUNKS, [&](RandomAccessIterator s)
  {
    size t partial sum = 0;
   for (auto it = s; it < s + sz; ++it)
      partial sum += *it; // NO synchronization (COLD)
   total += partial sum; // synchronization (HOT)
  });
  return total;
                                                                   Almost 2x FASTER than sequential version 🕸
```

{

(on 8 core CPU)



```
std::reduce()
```

```
template<class Iterator>
size_t par_calc_sum(Iterator begin, Iterator end)
{
    return std::reduce(std::execution::par, begin, end, (size_t)0);
}
```

std::reduce() - just like our partial sums code - exploits the fact that operation which is used for reduce
(default: +) is associative.

```
template<class ExecutionPolicy, class ForwardIt, class T, class BinaryOp>
T reduce(ExecutionPolicy && policy, ForwardIt first, ForwardIt last, T init, BinaryOp binary_op);
```

```
~3% faster than our manual implementation \textcircled{b}
```

```
(on 8 core CPU)
```

https://en.cppreference.com/w/cpp/algorithm/reduce



TL;DR: std::reduce() rulezz !

Pretty much all other *parallel* algorithms are *difficult* to use properly:

- safe (no data races)
- with good performance results

(on traditional architectures; exception NUMA/GPGPU)

- don't trust your instinct: Always Benchmark !



Solve these two Advent of Code challenges, using constructs presented in this course (STL data structures, algorithms, lambda functions, range-for, etc):

https://adventofcode.com/2018/day/9 EASY

https://adventofcode.com/2018/day/13 MEDIUM

Email solutions to gabriel.diaconita@caphyon.com

See you in 2 weeks...

Don't forget about your assignments

