

C++ Standard Template Library

C++ **STL** supplies a number of algorithms that are available in Thrust

STL provide efficient ways to store, access, manipulate and view data
also includes containers,

```
#include<numeric>  
#include <algorithm>
```

Example: List of random numbers, sorted, and printed in 4 lines of code.

```
vector<int> myVector(NUM_INTS);           //See Class4.pdf  
generate(myVector.begin(), myVector.end(), rand);  
sort(myVector.begin(), myVector.end());  
copy(myVector.begin(), myVector.end(), ostream_iterator<int>(cout, "\n"));
```

```
int A[] = {1, 4, 2, 8, 5, 7};  
const int N = sizeof(A) / sizeof(int);  
sort(A, A + N);  
copy(A, A + N, ostream_iterator<int>(cout, " "));  
// The output is " 1 2 4 5 7 8".
```

C++ Standard Template Library: Algorithms

Searching, sorting, reordering, permuting, creating, and destroying sets of data.

Over 50 of them: either in `<numeric>` or `<algorithm>`

<http://www.cplusplus.com/reference/algorithm/>

deque: double ended queue

Vectors allow insertion of data into the middle of the vector, but often just want to add at the ends.

Deque is a vector with insertion at both the back end: `push_back`
but also at the front end: `push_front`

`pop_back` to retrieve from back

`pop_front`

deque is a little slower than vector

Thrust Library

<http://docs.nvidia.com/cuda/thrust/index.html>

<http://thrust.github.io>

Data structures:

`thrust::device_vector`

`thrust::host_vector`

etc

```
thrust::host_vector<int> A(10,1) : initialize A with 10 elements set to 1
thrust::host_vector<int> h_vec(12);
```

```
// set the elements of h_vec to 0, 1, 2, 3, ...
thrust::sequence(h_vec.begin(), h_vec.end());
```

```
thrust::device_vector<int> d_vec = h_vec;
```

```
// set the first seven elements of a vector to 9
thrust::fill(d_vec.begin(), d_vec.begin() + 7, 9);
```

```
#include <thrust/host_vector.h>
#include <thrust/device_vector.h>
#include <iostream>
int main(void)
{ // H has storage for 4 integers
  thrust::host_vector<int> H(4);
  H[0] = 14; H[1] = 20; H[2] = 38; H[3] = 46;
  std::cout << "H has size " << H.size() << std::endl;
  for(int i = 0; i < H.size(); i++)
    std::cout << "H[" << i << "] = " << H[i] << std::endl;

  H.resize(2);
  std::cout << "H now has size " << H.size() << std::endl;
  thrust::device_vector<int> D = H;
  D[0] = 99;
  D[1] = 88;
  for(int i = 0; i < D.size(); i++)
    std::cout << "D[" << i << "] = " << D[i] << std::endl;

  // H and D are automatically deleted when the function returns
  return 0;
}
```

Thrust Library

Some algorithms—four generic types

transformation (for_each element, apply an operation)

```
thrust::sequence(X.begin(), X.end());
```

reduce (reduction of an array to a single number)

```
int sum = thrust::reduce(D.begin(), D.end(), (int) 0, thrust::plus<int>());
```

scan (prefix-sum)

```
thrust::inclusive_scan(data, data + 6, data); // in-place scan
```

sort

```
thrust::sort(A, A + 6);
```

Note: here all commands begin with `thrust::` as that is the namespace for the thrust commands (so as not to confuse with STL commands)

Thrust functions

| | | | | | | |
|-----------------------|---------------------------|--------------------|-----------------|------------------|--------------------|----------------------|
| adjacent_difference.h | device_malloc_allocator.h | execution_policy.h | inner_product.h | random.h | sort.h | uninitialized_copy.h |
| advance.h | device_malloc.h | extrema.h | iterator | reduce.h | swap.h | uninitialized_fill.h |
| binary_search.h | device_new_allocator.h | fill.h | logical.h | remove.h | system | unique.h |
| copy.h | device_new.h | find.h | memory.h | replace.h | system_error.h | version.h |
| count.h | device_ptr.h | for_each.h | merge.h | reverse.h | tabulate.h | |
| detail | device_reference.h | functional.h | mismatch.h | scan.h | transform.h | |
| device_allocator.h | device_vector.h | gather.h | pair.h | scatter.h | transform_reduce.h | |
| device_delete.h | distance.h | generate.h | partition.h | sequence.h | transform_scan.h | |
| device_free.h | equal.h | host_vector.h | random | set_operations.h | tuple.h | |

Thrust: Sum 1024 random numbers

```
#include <thrust/host_vector.h>
#include <thrust/device_vector.h>
#include <thrust/generate.h>
#include <thrust/reduce.h>

__host__ static __inline__ float rand_01()
{
    return ((float)rand()/RAND_MAX); //random number between 0 -1
}

int main(void) {
    /* generate random data on the host */
    thrust::host_vector<float> h_vec(1024);
    thrust::generate(h_vec.begin(), h_vec.end(), rand_01);
    /* transfer to device and compute sum */
    thrust::device_vector<float> d_vec = h_vec;
    float x = thrust::reduce(d_vec.begin(), d_vec.end());
    return 0;
}
```


C++ Function Template

```
// function template to add numbers (type of T is variable)
```

```
template< typename T >
```

```
    T add(T a, T b)
```

```
{
```

```
    return a + b;
```

```
}
```

```
    // add integers
```

```
int x = 10; int y = 20; int z;
```

```
z = add<int>(x,y);
```

```
// type of T explicitly specified
```

```
z = add(x,y);
```

```
// type of T determined automatically
```

```
// add floats
```

```
float x = 10.0f; float y = 20.0f; float z;
```

```
z = add<float>(x,y); // type of T explicitly specified
```

```
z = add(x,y); // type of T determined automatically
```

Function Objects (Functors)

```
// templated functor to add numbers
```

```
template< typename T >  
    class add  
    {  
        public:  
        T operator()(T a, T b)  
        {  
            return a + b;  
        }  
    };
```

```
int x = 10; int y = 20; int z;  
add<int> func; // create an add functor for T=int  
z = func(x,y); // invoke functor on x and y, which are ints
```

```
float x = 10; float y = 20; float z;  
add<float> func; // create an add functor for T=float  
z = func(x,y); // invoke functor on x and y, which are floats
```

Another Example

```
// this is a functor
struct add_x {
    add_x(int x) : x(x) {}
    int operator()(int y) { return x + y; }
```

```
private:
    int x;
};
```

```
// Now you can use it like this:
add_x add42(42); // create an instance of the functor class
int i = add42(8); // and "call" it
assert(i == 50); // and it added 42 to its argument
```

```
std::vector<int> in; // assume this contains a bunch of values)
std::vector<int> out;
// Pass a functor to std::transform, which calls the functor on every element
// in the input sequence, and stores the result to the output sequence
std::transform(in.begin(), in.end(), out.begin(), add_x(1));
assert(out[i] == in[i] + 1); // for all i
```

Calculate Pi (first part)

```
#include <thrust/transform_reduce.h>
#include <thrust/functional.h>
#include <thrust/device_vector.h>
#include <thrust/host_vector.h>
#include <cmath>

....
// integrand<T> computes f(x) using a functor (C++ function object)
template <typename T>
struct integrand
{
    __host__ __device__ //means works on both host and device
    T operator()(const T& x) const {
        return 4./(1+ x * x);
    }
};
```

Calculate Pi (last part)

```
// initialize host array
thrust::host_vector<double> x(N); //initialize on host—dynamic container
for (int i = 0; i<N; i++)
    x[i]= interval* ( (double) i + 0.5);

// transfer to device
thrust::device_vector<double> d=x; //initialize of device and copy x to device vector

// setup arguments
integrand<double>    unary_op;
thrust::plus<double> binary_op; //available in Thrust
double init = 0;

// compute norm
double norm = thrust::transform_reduce(d.begin(), d.end(), unary_op, init, binary_op);
norm *= interval;
```

<thrust/functional.h>

```
struct thrust::plus< T >  
struct thrust::minus< T >  
struct thrust::multiplies< T >  
struct thrust::divides< T >  
struct thrust::modulus< T >  
struct thrust::negate< T >  
struct thrust::equal_to< T >  
struct thrust::not_equal_to< T >  
struct thrust::greater< T >  
struct thrust::less< T >  
struct thrust::greater_equal< T >  
struct thrust::less_equal< T >  
struct thrust::logical_and< T >  
struct thrust::logical_or< T >  
struct thrust::logical_not< T >  
struct thrust::bit_and< T >  
struct thrust::bit_or< T >  
struct thrust::bit_xor< T >  
struct thrust::identity< T >  
struct thrust::maximum< T >  
struct thrust::minimum< T >
```

.....

Thrust Summation

```
#include <thrust/reduce.h>
```

```
thrust::device_vector<int> D(10);
```

```
....define D....
```

```
int sum = thrust::reduce(D.begin(), D.end(), (int) 0, thrust::plus<int>());
```

^ ^
initial value operator

or simpler

```
int sum = thrust::reduce(D.begin(), D.end());
```

Compute norm

```
#include <thrust/transform_reduce.h>
```

```
#include <thrust/functional.h>
```

```
#include <thrust/device_vector.h>
```

```
using namespace std;
```

```
thrust::device_vector<float> d_x ;
```

```
// setup arguments
```

```
    square<float> unary_op;
```

```
    thrust::plus<float> binary_op;
```

```
float init = 0;
```

```
// compute norm
```

```
float norm;
```

```
norm = sqrt( thrust::transform_reduce(d_x.begin(), d_x.end(), unary_op, init, binary_op) );
```


What is D?

```
int main(void)
{

    thrust::device_vector<int> D(10, 1);

    thrust::fill(D.begin(), D.begin() + 7, 9);

    thrust::host_vector<int> H(D.begin(), D.begin() + 5);

    thrust::sequence(H.begin(), H.end());

    thrust::copy(H.begin(), H.end(), D.begin());

    // print D
    for(int i = 0; i < D.size(); i++)
        std::cout << "D[" << i << "] = " << D[i] << std::endl;

    return 0;
}
```

Scan

Prefix Sums:

```
thrust::inclusive_scan(data, data + 6, data); // in-place scan
```

For six elements add the preceding elements together one at a time: partial sums

```
#include <thrust/scan.h>
```

```
int data[6] = {1, 0, 2, 2, 1, 3};
```

```
thrust::inclusive_scan(data, data + 6, data); // in-place scan
```

```
// data is now {1, 1, 3, 5, 6, 9}
```

Thrust Sort

Sort by keys:

```
#include <thrust/sort.h>
```

```
...
```

```
const int N = 6;
```

```
int keys[N] = { 1, 4, 2, 8, 5, 7};
```

```
char values[N] = {'a', 'b', 'c', 'd', 'e', 'f'};
```

```
thrust::sort_by_key(keys, keys + N, values);
```

```
// keys is now { 1, 2, 4, 5, 7, 8}
```

```
// values is now {'a', 'c', 'b', 'e', 'f', 'd'}
```

Using Thrust

Write a Thrust program to compute

$y \leftarrow a x + y$, where a is a constant and x and y are vectors (1024)

SAXPY (one way)

Given X , Y as defined, along with the constant A

```
thrust::device_vector<float> temp(X.size());
```

```
// temp <- A
```

```
thrust::fill(temp.begin(), temp.end(), A);
```

```
// temp <- A * X
```

```
thrust::transform(X.begin(), X.end(), temp.begin(), temp.begin(), thrust::multiplies<float>());
```

```
// Y <- A * X + Y
```

```
thrust::transform(temp.begin(), temp.end(), Y.begin(), Y.begin(), thrust::plus<float>());
```

```
const int N = 1000;
```

```
thrust::device_vector<float> V1(N);
```

```
thrust::device_vector<float> V2(N);
```

```
thrust::device_vector<float> V3(N);
```

```
thrust::sequence(V1.begin(), V1.end(), 1);
```

```
thrust::fill(V2.begin(), V2.end(), 75);
```

```
thrust::transform(V1.begin(), V1.end(), V2.begin(), V3.begin(),  
                 thrust::multiplies<float>());
```

```
// V3 is now {75, 150, 225, ..., 75000}
```

Example of
multiplies

Thrust

Example for SAXPY Problem (single precision $a x + y$)

```
struct saxpy_functor
{
    const float a;

    saxpy_functor(float _a) : a(_a) {}

    __host__ __device__
    float operator()(const float& x, const float& y) const {
        return a * x + y;
    }
};

int main() {
    // Y <- A * X + Y
    thrust::transform(X.begin(), X.end(), Y.begin(), Y.end(), saxpy_functor(A));

    or simpler
    thrust::transform(X.begin(), X.end(), Y.begin(), Y.end(), a*_1 + _2);
}
```

Comparison of scan and reduce (again)

Thrust on Host Only

```
#include <thrust/host_vector.h>
#include <thrust/sort.h>
#include <cstdlib>
#include <algorithm>
#include <iostream>
int main(void)
{
// serially generate 1M random numbers
  thrust::host_vector<int> vec(1 << 20);
  std::generate(vec.begin(), vec.end(), rand);
  // sort data on host
  thrust::sort(vec.begin(), vec.end());

// report the largest number
  std::cout << "Largest number is " << vec.back() << std::endl;

  return 0;
}
```

```
/usr/local/bin/g++ -O3 thrust_on_host.cpp -I/Developer/NVIDIA/CUDA-6.5/include
```


Thrust and OpenMP on Host

```
#include <thrust/host_vector.h>
#include <thrust/system/omp/vector.h>

#include <thrust/device_vector.h>
#include <thrust/sort.h>
#include <thrust/copy.h>

#include <cstdlib>
#include <algorithm>

.....
// serially generate 1M random numbers
thrust::host_vector<int> h_vec(1<<20);
std::generate(h_vec.begin(), h_vec.end(), rand);

//transfer data to OpenMP
thrust::omp::vector<int> d_vec = h_vec;

// sort data in parallel with OpenMP
thrust::sort( d_vec.begin(), d_vec.end());

//transfer back to host
thrust::copy(d_vec.begin(), d_vec.end(), h_vec.begin());
```