

# AMATH 483/583 High Performance Scientific Computing

## Templates and Generic Programming

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# Before

```
class RowMatrix {
public:
    RowMatrix(size_t M, size_t N) : num_rows_(M), num_cols_(N), 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]; }

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

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

# After

```
class ColMatrix {
public:
    ColMatrix(size_t M, size_t N) : num_rows_(M), num_cols_(N), storage_(num_rows_ * num_cols_) {}

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

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

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

# Matrix-Matrix Product

```
Matrix operator*(const Matrix& A, const Matrix& B) {
    Matrix C(A.num_rows(), B.num_cols());
    for (size_t i = 0; i < A.num_rows(); ++i) {
        for (size_t j = 0; j < B.num_cols(); ++j) {
            for (size_t k = 0; k < A.num_cols(); ++k) {
                C(i, j) += A(i, k) * B(k, j);
            }
        }
    }
    return C;
}
```

```
RowMatrix A(32, 32);
RowMatrix B(32, 32);
RowMatrix C = A * B;
```

```
ColMatrix A(32, 32);
ColMatrix B(32, 32);
ColMatrix C = A * B;
```

# Matrix-Matrix Product

```
RowMatrix operator*(const RowMatrix& A, const RowMatrix& B) {  
    RowMatrix C(A.num_rows(), B.num_cols());  
    for (size_t i = 0; i < A.num_rows(); ++i) {  
        for (size_t j = 0; j < B.num_cols(); ++j) {  
            for (size_t k = 0; k < A.num_cols(); ++k) {  
                C(i, j) += A(i, k) * B(k, j);  
            }  
        }  
    }  
    return C;  
}
```

```
RowMatrix A(32, 32);  
RowMatrix B(32, 32);  
RowMatrix C = A * B;
```

Matrix-matrix  
product is the same  
for any matrix

```
ColMatrix operator*(const ColMatrix& A, const ColMatrix& B) {  
    ColMatrix C(A.num_rows(), B.num_cols());  
    for (size_t i = 0; i < A.num_rows(); ++i) {  
        for (size_t j = 0; j < B.num_cols(); ++j) {  
            for (size_t k = 0; k < A.num_cols(); ++k) {  
                C(i, j) += A(i, k) * B(k, j);  
            }  
        }  
    }  
    return C;  
}
```

```
ColMatrix A(32, 32);  
ColMatrix B(32, 32);  
ColMatrix C = A * B;
```

Why should we  
ever write more  
than one?

What's wrong with  
writing more than  
one?

# A programming problem

- “I’ve assigned this problem in courses at Bell Labs and IBM. Professional programmers had a couple of hours to convert the description into a programming language of their choice; a high-level pseudo code was fine... Ninety percent of the programmers found bugs in their programs (and I wasn’t always convinced of the correctness of the code in which no bugs were found).”  
- Jon Bentley, Programming Pearls, 1986

This must be a  
complicated  
algorithm!

# Binary search solution

```
int* lower_bound(int* first, int* last, int x)
{
    while (first != last)
    {
        int* middle = first + (last - first) / 2;

        if (*middle < x) first = middle + 1;
        else last = middle;
    }

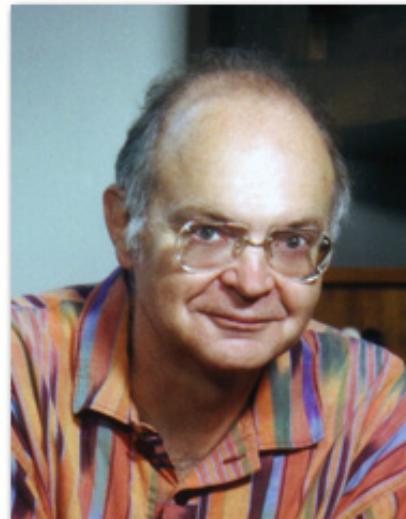
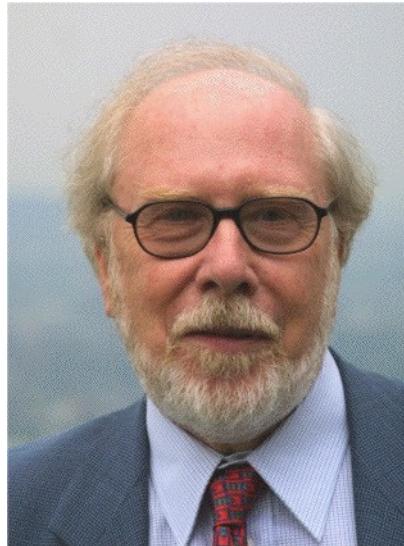
    return first;
}
```

# If We Can't Write Binary Search...

- Jon Bentley's solution is considerably more complicated (and slower)
- Photoshop uses this problem as a take home test for candidates.
  - > 90% of candidates fail.
- Experience teaching algorithms indicate that > 90% of engineers, regardless of experience, cannot write this simple code
- It's about correctness

# Let an expert write binary search

- Once and for all



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# Matrix-Matrix Product

```
template <typename MatrixType>
MatrixType operator*(const MatrixType& A, const MatrixType& B) {
    MatrixType C(A.num_rows(), B.num_cols());
    for (size_t i = 0; i < A.num_rows(); ++i) {
        for (size_t j = 0; j < B.num_cols(); ++j) {
            for (size_t k = 0; k < A.num_cols(); ++k) {
                C(i, j) += A(i, k) * B(k, j);
            }
        }
    }
    return C;
}
```

This will work for any type  
that meets requirements  
for MatrixType

Constructor  
Accessor

```
NewMatrix A(32, 32);
NewMatrix B(32, 32);
NewMatrix C = A * B;
```

```
RowMatrix A(32, 32);
RowMatrix B(32, 32);
RowMatrix C = A * B;
```

```
ColMatrix A(32, 32);
ColMatrix B(32, 32);
ColMatrix C = A * B;
```

```
Matrix A(32, 32);
Matrix B(32, 32);
Matrix C = A * B;
```

# Generic Programming Methodology

1. Study the concrete implementations of an algorithm
2. Lift away unnecessary requirements to produce a more abstract algorithm
  - a) Catalog these requirements.
  - b) Bundle requirements into **concepts**.
3. Repeat the lifting process until we have obtained a generic algorithm that:
  - a) Instantiates to efficient concrete implementations.
  - b) Captures the essence of the “higher truth” of that algorithm.

# Lifting

```
double sum(double* x, size_t N) {  
    double s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

Array of  
doubles

Beginning

End

Overload (ad-hoc  
polymorphism)

```
float sum(float* x, size_t N) {  
    float s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

Array of  
floats

Beginning

End

Overload (ad-hoc  
polymorphism)

But we need a different  
implementation for  
every type

Polymorphism: same  
function can be called  
with different types

# Lifting

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

Array of Ts

Beginning

End

Parametric polymorphism

```
double* dx;
size_t dN;
double dz = sum(dx, dN);

float* fx;
size_t fN;
float fz = sum(fx, fN);
```

Polymorphism not due to overload, rather parameterized by argument type

Parametric polymorphism

Polymorphism: same function can be called with different types

# Before

```
double sum(double* x, size_t N) {  
    double s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

# Before

```
float sum(float* x, size_t N) {  
    float s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

Exactly the  
same loop

# After

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

Exactly the  
same loop

# C++ (function) templates

Introduce template

Template parameter

Begin

Return a T

End

Array of T

Function body

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; i++)
        s += x[i];
    return s;
```

Declare and initialize a T

# C++ (function) templates

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

The function gets created on instantiation

```
double* dx;
size_t dN;
double dz = sum<double>(dx, dN);
```

```
float* dx;
size_t dN;
float dz = sum<float>(dx, dN);
```

This is not a function

It is a function template

A blueprint for a function

# C++ (function) templates

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

At this level

```
double* dx;
size_t dN;
double dz = sum<double>(dx, dN);
```

Bind T to be a double

At this level

```
float* dx;
size_t dN;
float dz = sum<float>(dx, dN);
```

Bind T to be a float

But we know this is a float

# C++ (function) templates

```
template <typename T>
T sum(T* x, size_t N)
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

At this level

```
double* dx;
size_t dN;
double dz = sum(dx, dN);
```

Bind T to be a double

```
float* dx;
size_t dN;
float dz = sum(dx, dN);
```

Bind T to be a float

# C++ (function) templates

```
int main() {  
  
    Vector v(1024);  
    double a = sum(v, v.num_rows());  
  
    return 0;  
}
```

Bind T to be a  
Vector

```
template <typename T>  
T sum(T* x, size_t N) {  
    T s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

```
$ c++ vector_sum.cpp  
vector_sum.cpp:16:14: error: no matching function for call to 'sum'  
    double a = sum(v, v.num_rows());  
               ^~~  
vector_sum.cpp:4:3: note: candidate template ignored: could not match 'T *' against 'Vector'  
T sum (T* x, size_t N) {  
    ^  
1 error generated.
```

# C++ (function) templates

```
int main() {  
  
    Vector v(1024);  
    double a = sum(&v[0], v.num_rows());  
  
    return 0;  
}
```

Bind T to be a  
double\*

```
template <typename T>  
T sum(T* x, size_t N) {  
    T s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

# C++ (function) templates

```
struct element {  
    double val;  
    element* next;  
};  
  
int main() {  
    size_t N = 0;  
    element* linked_list = null;  
  
    // create list  
    double a = sum(linked_list,  
  
    return 0;  
}
```

Bind T to be an  
element\*

```
template <typename T>  
T sum(T* x, size_t N) {  
    T s = 0;  
    for (size_t i = 0; i < N; ++i)  
        s += x[i];  
    return s;  
}
```

```
$ g++ linked_list_0.cpp  
linked_list_0.cpp:22:10: error: no viable conversion from 'element' to 'double'  
    double a = sum(linked_list, N);  
           ^ ~~~~~  
linked_list_0.cpp:5:5: error: no viable conversion from 'int' to 'element'  
    T s = 0;  
    ^ ~  
linked_list_0.cpp:22:14: note: in instantiation of function template specialization 'sum<element>' requested here  
    double a = sum(linked_list, N);  
           ^  
linked_list_0.cpp:12:8: note: candidate constructor (the implicit copy constructor) not viable:  
no known conversion from 'int' to 'const element &' for 1st argument  
struct element {  
    ^  
linked_list_0.cpp:9:10: error: no viable conversion from returned value of type 'int' to function  
return type 'element'  
    return 0;  
           ^  
linked_list_0.cpp:12:8: note: candidate constructor (the implicit copy constructor) not viable:  
no known conversion from 'int' to 'const element &' for 1st argument  
struct element {  
    ^  
3 errors generated.
```

## Requirements for sum

We need to be able assign 0 to a T

Pointer to an array of T

Something that can count Ts

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

But what if I want to sum over a linked list?

We need to index into the array

Perfectly reasonable

## Templates for sum so far

We have a thing we want to sum over

Beginning of the thing

End of the thing

Go through the thing

The type of s can be set to zero

Get a value out of the thing

The value is not the same as the thing

The value is not the same as the thing

```
template <typename T>
T sum(T* x, size_t N) {
    T s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
```

The value of the thing can be added to s

# Lifting

```
template <typename T>
T sum (T* begin, T* end) {
    T s = 0;
    for (T* p = begin; p < end; ++p) {
        s += *p;
    }
    return s;
}
```

We don't know what kind of thing, so parameterize

From begin to end

Use pointer

Dereference pointer

Get a value

OK for linked list?

Almost, actually

# Lifting

```
template <typename T>
T sum (T* begin, T* end) {
    T s = 0;
    for (T* p = begin; p < end; ++p) {
        s += *p;
    }
    return s;
}
```

Get value

Go to next element

Linked list can do this

# Lifting

```
template <typename T>
T sum (T* begin, T* end) {
    T s = 0;
    for (T* p = begin; p < end; ++p) {
        s += *p;
    }
    return s;
}
```

begin

```
double sum(element* x) {
    double s = 0;
    while (x != nullptr) {
        s += x->val;
        x = x->next;
    }
    return s;
}
```

Get value

Go to next element

end

We can do all the things needed for sum

But we can't use it with our sum

Because of syntax

# For your consideration (son)

```
struct element_ptr {  
    element_ptr(element* x) : x(x) {}  
    element_ptr operator++() { x = x->next; return x; }  
    element_ptr operator++(int) { element* y = x; x = x->next; return y; }  
    double operator*() { return x->val; }  
    bool operator==(element_ptr y) { return x == y.x; }  
    bool operator!=(element_ptr y) { return x != y.x; }  
  
    element* x;  
};
```

Element  
“thing”

We also need to  
compare

Get value

Go to next

# Lifting

Get value

```
template <typename T>
T sum (T* begin, T* end) {
    T s = 0;
    for (T* p = begin; p < end; ++p)
        s += *p;
}
return s;
```

No less than

Check

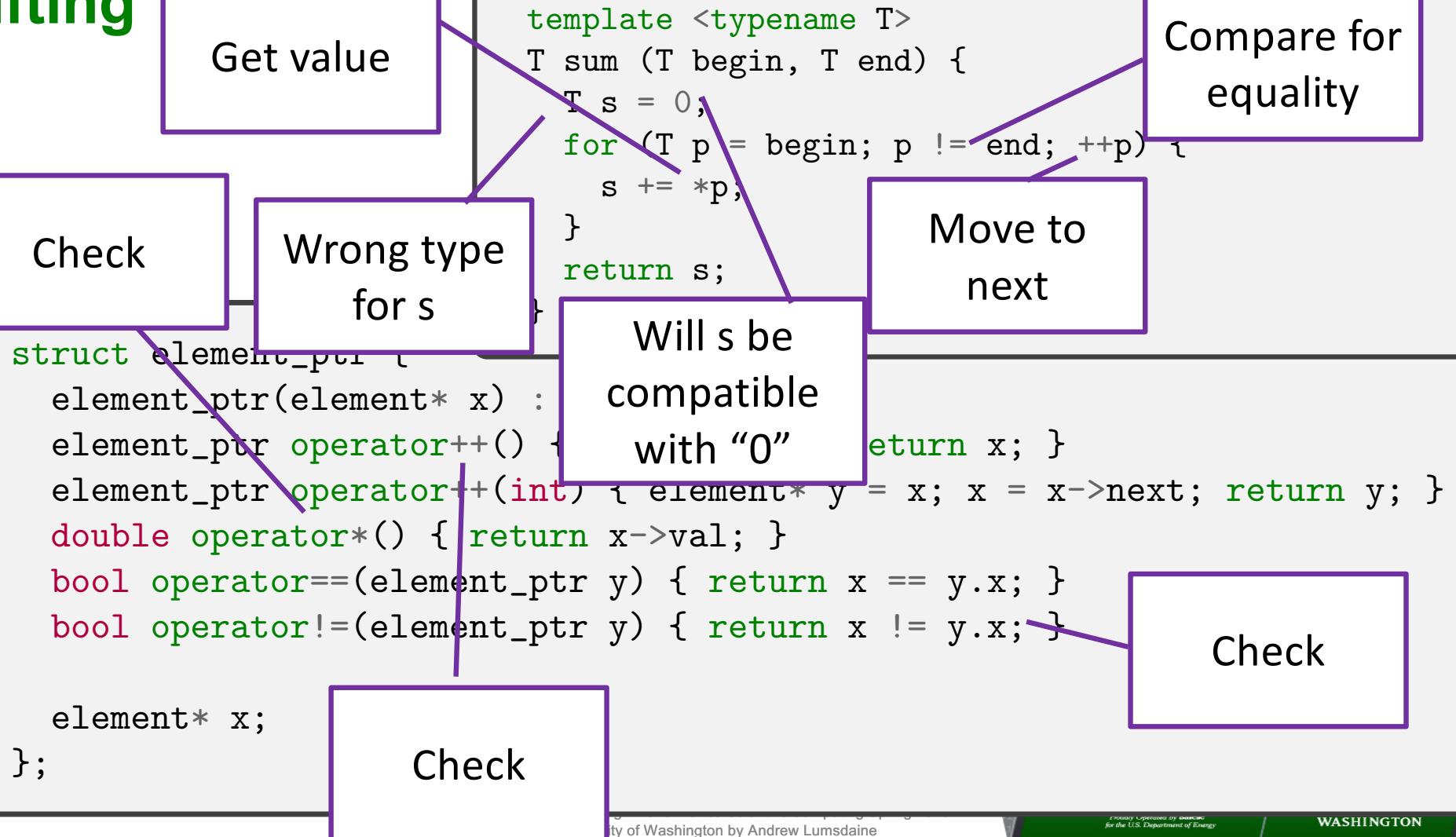
Move to  
next

```
struct element_ptr {
    element_ptr(element* x) : x(x) {}
    element_ptr operator++() { x = x->next; return x; }
    element_ptr operator++(int) { element* y = x; x = x->next; return y; }
    double operator*() { return x->val; }
    bool operator==(element_ptr y) { return x == y.x; }
    bool operator!=(element_ptr y) { return x != y.x; }

    element* x;
};
```

Check

# Lifting



# Lifting

Rename  
some things

```
template <typename Iter, typename T>
T sum (Iter begin, Iter end, T init) {
    for (T p = begin; p != end; ++p) {
        init += *p;
    }
    return init;
}
```

And pass in  
initial value  
of s

Parameterize  
the type of s

```
struct element_ptr {
    element_ptr(element* x) : x(x) {}
    element_ptr operator++() { x = x->next; return x; }
    element_ptr operator++(int) { element* y = x; x = x->next; return y; }
    double operator*() { return x->val; }
    bool operator==(element_ptr y) { return x == y.x; }
    bool operator!=(element_ptr y) { return x != y.x; }

    element* x;
};
```

# Final

Lets us iterate through our thing

The thing is holding values of type T

```
template <typename ForwardIterator, typename T>
T sum(ForwardIterator begin, ForwardIterator end, T init) {
    while (begin != end)
        init += *begin++;
    return init;
}
```

Add to init

Move to next

Compare

Get value

Use iterators to mark begin and end of what we want to sum

# Requirements

```
template <typename ForwardIterator, typename T>
T sum(ForwardIterator begin, ForwardIterator end, T init) {
    while (begin != end)
        init += *begin++;
    return init;
}
```

If the type we bind to  
ForwardIterator has these  
expressions, we can use sum

- Need dereference – `*i`
- Need increment – `i++`
- Need equality comparison – `i == j` (equiv `i != j`)

# Lifting

```
template <typename ForwardIterator, typename T>
T sum(ForwardIterator begin, ForwardIterator end, T init) {
    while (begin != end)
        init += *begin++;
    return init;
}
```

```
double dd = sum(dx, dx + dN, 0.0);
double ff = sum(fx, fx + fN, 0.0);
double ll = sum(lx, nullptr, 0.0);
```

# Specialization

```
double dd = sum(dx, dx + dN, 0.0);
double ff = sum(fx, fx + fN, 0.0);
double ll = sum(lx, nullptr, 0.0);
```

```
double sum(double* x, size_t N) {
    double s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

```
float sum(float* x, size_t N) {
    float s = 0;
    for (size_t i = 0; i < N; ++i)
        s += x[i];
    return s;
}
```

```
double sum(element* x) {
    double s = 0;
    while (x != nullptr) {
        s += x->val;
        x = x->next;
    }
    return s;
}
```

# Instantiation model

- Instantiation model— For each template instance, a separate piece of code is generated, and compiled.
- Not directly required by the standard, but all language rules assume it. Used by every C++ compiler (except for Lunar).
- Different from Generic Java, Eiffel, ... which compile generic definitions to a single skeleton code.
- Speed/space trade-off: instantiation model often faster, but prone to code bloat.
- Some evidence suggest otherwise (Mark Jones, Haskell dictionary passing).

# Unconstrained genericity

```
template <typename ForwardIterator, typename T>
T sum(ForwardIterator begin, ForwardIterator end, T init) {
    while (begin != end)
        init += *begin++;
    return init;
}
```

Even though we have a spec for this

```
double dd = sum(dx, dx + dN, 0.0);
double ff = sum(fx, fx + fN, 0.0);
double ll = sum(lx, nullptr, 0.0);
```

How much of this can we type check (and when)?

For each template instance, a separate piece of code is generated, and compiled

# Unconstrained genericity

- Maximal reusability (structural conformance). Concise: no need to express constraints.
- No separate type checking, error diagnostics must be delayed until instantiation.
- Errors may occur deep inside a generic library. Errors difficult to interpret, difficult to assign blame.

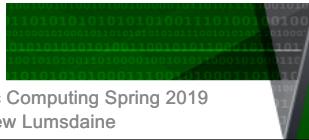
# Error messages

```
#include <iostream>
#include <algorithm>
#include <iterator>
#include <vector>
class A {};

int main() {
    std::vector<A> a;
    // ...
    std::copy(a.begin(), a.end(),
              std::ostream_iterator<A>(std::cout,
              "\n"));
}
```

# Error messages

```
/usr/include/c++/3.2/bits/stream_iterator.h: In member function
  'std::ostream_iterator<_Tp, _CharT, _Traits>& std::ostream_iterator<_Tp,
  _CharT, _Traits>::operator=(const _Tp&) [with _Tp = A, _CharT = char,
  _Traits = std::char_traits<char>]':
/usr/include/c++/3.2/bits/stl_algobase.h:241:
  instantiated from '_OutputIter std::__copy(_RandomAccessIter,
  _RandomAccessIter, _OutputIter, std::random_access_iterator_tag)
  [with _RandomAccessIter = A*, _OutputIter =
  std::ostream_iterator<A, char, std::char_traits<char> >]'
/usr/include/c++/3.2/bits/stl_algobase.h:260: instantiated from
  '_OutputIter std::__copy_aux2(_InputIter, _InputIter, _OutputIter,
  __false_type) [with _InputIter = A*, _OutputIter =
  std::ostream_iterator<A, char, std::char_traits<char> >]',
/usr/include/c++/3.2/bits/stl_algobase.h:303: instantiated from
  '_OutputIter std::__copy_ni2(_InputIter, _InputIter, _OutputIter,
  __false_type) [with _InputIter = A*, _OutputIter =
  std::ostream_iterator<A, char, std::char_traits<char> >]',
/usr/include/c++/3.2/bits/stl_algobase.h:314: instantiated from
  '_OutputIter std::__copy_ni1(_InputIter, _InputIter, _OutputIter,
  __true_type) [with _InputIter = __gnu_cxx::__normal_iterator<A*,
  std::vector<A, std::allocator<A> >, _OutputIter =
  std::ostream_iterator<A, char, std::char_traits<char> >]',
/usr/include/c++/3.2/bits/stl_algobase.h:349: instantiated from
  '_OutputIter std::copy(_InputIter, _InputIter, _OutputIter) [with
  _InputIter = __gnu_cxx::__normal_iterator<A*, std::vector<A,
  std::allocator<A> >, _OutputIter = std::ostream_iterator<A, char,
  std::char_traits<char> >]' cpp_templates/cpp_templates.w:1067:
  instantiated from here
/usr/include/c++/3.2/bits/stream_iterator.h:141: no match for '
  std::basic_ostream<char, std::char_traits<char> >& << const A&'
  operator
```



# Error messages

```
/usr/include/c++/3.2/bits/stream.tcc:55: candidates are:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(std::basic_ostream<_CharT, _Traits>*) (std::basic_ostream<_CharT, _Traits>*) [with _CharT =
char, _Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:77:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(std::basic_ostream<_CharT, _Traits>*) (with _CharT =
char, _Traits = std::char_traits<char>)
/usr/include/c++/3.2/bits/stream.tcc:99:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(std::ios_base&)
[with _CharT = char, _Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:171:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(long int) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:208:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(long unsigned int) [with _CharT = char,
_Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:146:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(bool) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:104:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(short int) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:115:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(short unsigned int) [with _CharT = char,
_Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:119:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(char) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:130:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(char) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:139:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(unsigned int) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:234:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(long long) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:272:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(long long unsigned int) [with _CharT = char,
_Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:298:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(double) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:45:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(float) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:323:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(long double) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:348:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(const void*) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:120:
std::basic_ostream<_CharT, _Traits> std::basic_ostream<_CharT,
_Traits>::operator<<(std::basic_ostream<_CharT, _Traits>*) [with
_CharT = char, _Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:211:
std::basic_ostream<_CharT, _Traits> std::operator<<(std::basic_ostream<_CharT, _Traits>*, char) [with _CharT = char, _Traits =
std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:500:
std::basic_ostream<char, std::char_traits<char>, std::allocator<char>>
[with Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:222:
std::basic_ostream<char, std::char_traits<char>, std::allocator<char>>
[with Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:227:
std::basic_ostream<char, std::char_traits<char>, std::allocator<char>>
[with Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:246:
std::basic_ostream<char, std::char_traits<char>, std::allocator<char>>
[with Traits = std::char_traits<char>]
/usr/include/c++/3.2/bits/stream.tcc:251:
std::basic_ostream<char, std::char_traits<char>, std::allocator<char>>
[with Traits = std::char_traits<char>]
```

```
#include <iostream>
#include <algorithm>
#include <iterator>
#include <vector>
class A {};
```

```
int main() {
    std::vector<A> a;
    // ...
    std::copy(a.begin(), a.end(),
        std::ostream_iterator<A>(std::cout,
        "\n"));
}
```

What is wrong here?

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# Organizing template files

```
// min.hpp
#ifndef MIN_HPP
#define MIN_HPP
template <class T> T min(const T& a, const T& b);
#endif // MIN_HPP

// min.cpp
#include "min.hpp"
template <class T>
T min(const T& a, const T& b) { return a < b ? a : b; }

// main.cpp
#include "min.hpp"
int main(int, char* []) {
    return min(0, 1);
}
```

# Traditional organization

```
$ g++ -c min.cpp
$ g++ -c main.cpp
$ g++ min.o main.o
main.o: In function 'main':
main.o(.text+0x2a):
undefined reference to 'int min<int>(int const&, int const&)'
collect2: ld returned 1 exit status
```

- `min<int>` has not been instantiated. Why not?

# Inclusion model

```
// min.hpp
#ifndef MIN_HPP
#define MIN_HPP
template <class T> T min(const T& a, const T& b) {
    return a < b ? a : b;
}
#endif // MIN_HPP

// main.cpp
#include "min.hpp"
int main(int, char* []) {
    return min(0, 1);
}
```

All source has to be included

# Interface Specification

- Lets formalize what we just did
- What does the interface really consist of?
- Operations supported by the parameterized type
- Other types associated with the parameterized type
- Semantics, complexity guarantees
- This set of requirements is called a *concept*
- A type meeting the requirements of a concept is said to *model* the concept

# Concepts in Generic Programming

- Generic programming is sometimes called “programming with concepts”
- Syntax
  - Valid expressions
  - Associated types
- Semantics
- Complexity

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# Iterator Concepts

- In our example, the iterator required \*, ++, !=
- These are requirements for an InputIterator
- C++ SL has a number of other iterator concepts
- The name of the required concept is usually indicated by the template name

# C++ SL Iterator Concepts

- Trivial Iterator: \*
- Input Iterator: \*, ++
- Output Iterator: \*, ++
- Forward Iterator: \*, ++
- Bidirectional Iterator: \*, ++, --
- Random Access Iterator: \*, ++, --, [], []

# The Standard Template Library

- In early-mid 90s Stepanov, Musser, Lee applied principles of ***generic programming*** to C++
- Leveraged templates / parametric polymorphism

std::set  
std::list  
std::map  
std::vector  
...

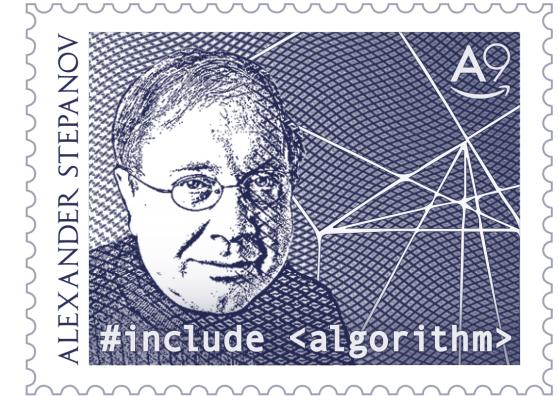
ForwardIterator  
ReverseIterator  
RandomAccessIterator

std::for\_each  
std::sort  
std::accumulate  
std::min\_element  
...

Containers

Iterators

Algorithms



Elements of  
Programming

Alexander Stepanov  
Paul McJones

Alexander Stepanov and Paul McJones.  
2009. *Elements of Programming* (1st  
ed.). Addison-Wesley Professional.

# Generic Programming

- Algorithms are *generic* (parametrically polymorphic)
- Algorithms can be used on *any* type that meets algorithmic reqts
  - Valid expressions, associated types
  - Not just std. ::types

```
vector<double> array(N);  
...  
std::accumulate(array.begin(), array.end(), 0.0);
```

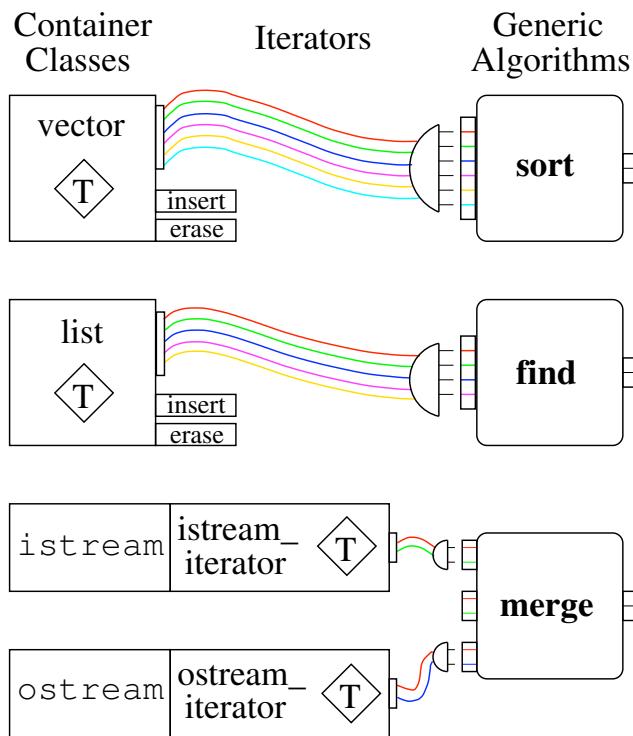
Standard Library container

iterator

iterator

Initial value

# Algorithms and data structures connected by iterators



---

`++ Increment`    `==, & Compare, Reference`  
`= Assign`            `-- Decrement`  
`* Dereference`    `+, -, < Random Access`

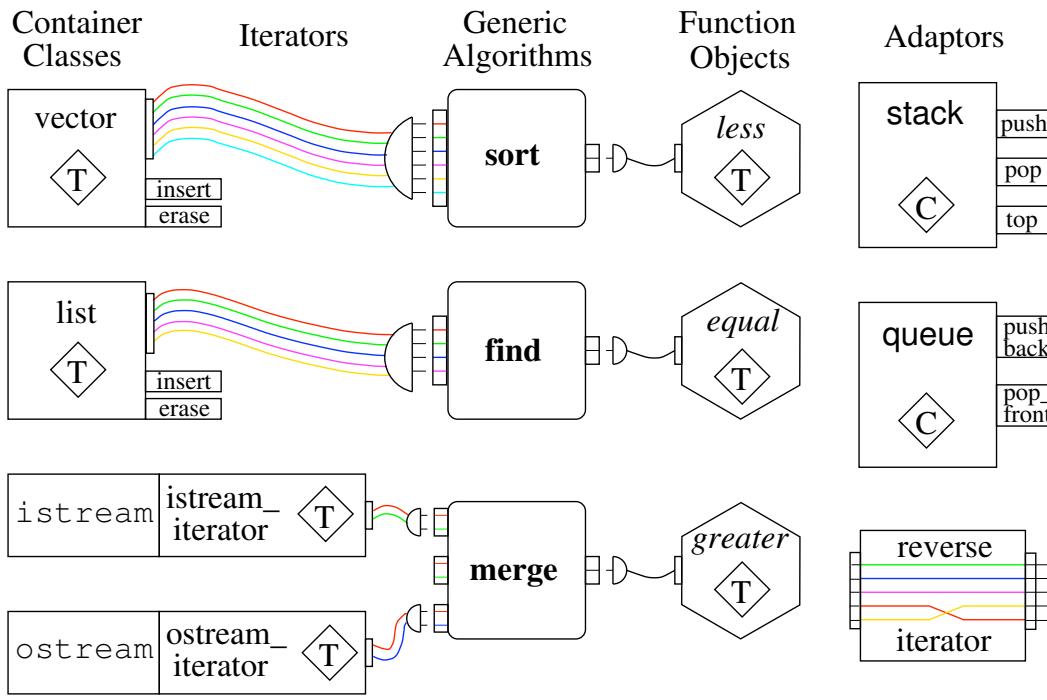
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# Five of the six major STL components



**++ Increment**      **==, & Compare, Reference**  
**= Assign**              **-- Decrement**  
**\* Dereference**          **+, -, < Random Access**

◇ *Generic Parameter*

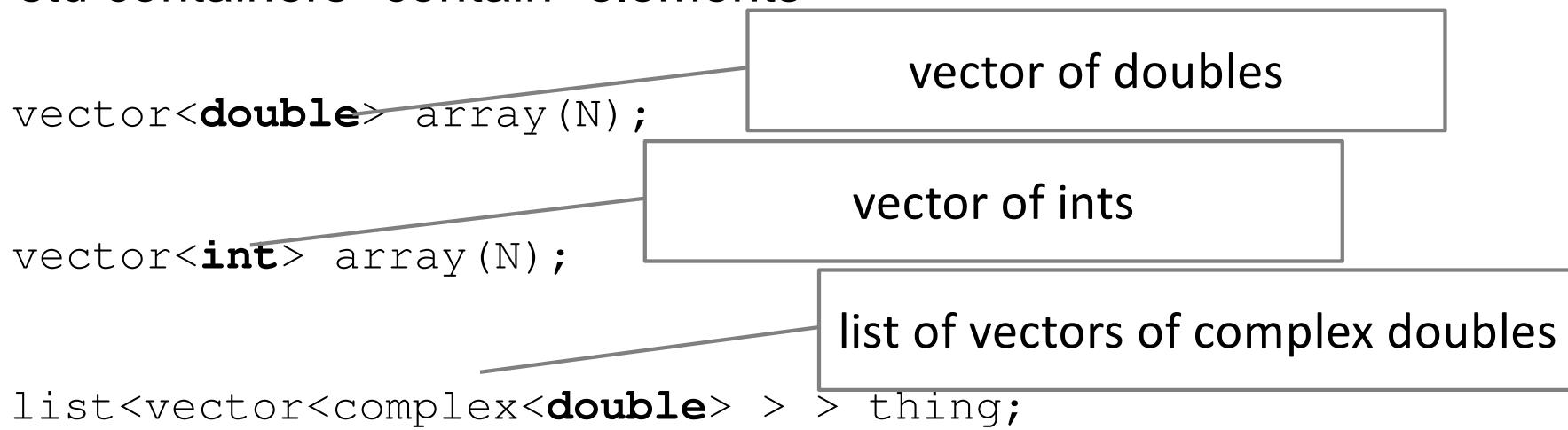
# std Containers

- Note that all containers have **same** interface
- (Actually a hierarchy, we'll come back to this)
- We will primarily be focusing on vector

| Headers        |                         | <code>&lt;vector&gt;</code> | <code>&lt;deque&gt;</code> | <code>&lt;list&gt;</code> |
|----------------|-------------------------|-----------------------------|----------------------------|---------------------------|
| Members        |                         | <code>vector</code>         | <code>deque</code>         | <code>list</code>         |
|                | constructor             | <code>vector</code>         | <code>deque</code>         | <code>list</code>         |
|                | <code>operator=</code>  | <code>operator=</code>      | <code>operator=</code>     | <code>operator=</code>    |
| iterators      | <code>begin</code>      | <code>begin</code>          | <code>begin</code>         | <code>begin</code>        |
|                | <code>end</code>        | <code>end</code>            | <code>end</code>           | <code>end</code>          |
| capacity       | <code>size</code>       | <code>size</code>           | <code>size</code>          | <code>size</code>         |
|                | <code>max_size</code>   | <code>max_size</code>       | <code>max_size</code>      | <code>max_size</code>     |
|                | <code>empty</code>      | <code>empty</code>          | <code>empty</code>         | <code>empty</code>        |
|                | <code>resize</code>     | <code>resize</code>         | <code>resize</code>        | <code>resize</code>       |
| element access | <code>front</code>      | <code>front</code>          | <code>front</code>         | <code>front</code>        |
|                | <code>back</code>       | <code>back</code>           | <code>back</code>          | <code>back</code>         |
|                | <code>operator[]</code> | <code>operator[]</code>     | <code>operator[]</code>    |                           |
| modifiers      | <code>insert</code>     | <code>insert</code>         | <code>insert</code>        | <code>insert</code>       |
|                | <code>erase</code>      | <code>erase</code>          | <code>erase</code>         | <code>erase</code>        |
|                | <code>push_back</code>  | <code>push_back</code>      | <code>push_back</code>     | <code>push_back</code>    |
|                | <code>pop_back</code>   | <code>pop_back</code>       | <code>pop_back</code>      | <code>pop_back</code>     |
|                | <code>swap</code>       | <code>swap</code>           | <code>swap</code>          | <code>swap</code>         |

# std Containers

- std containers “contain” elements



- Implementation of list, vector, complex is the same regardless of what is being contained

# Generic Programming

- Algorithms are *generic* (parametrically polymorphic)
- Algorithms can be used on *any* type that meets algorithmic reqts
  - Valid expressions, associated types
  - Not just std. ::types

```
list<vector<complex<double> > > thing(N);  
...
```

```
std::accumulate(thing.begin(), thing.end(), 0.0);
```

Standard Library container

iterator

iterator

Initial value

# std Containers

- The std containers are **class templates** (not “template classes”)

```
template <typename T> class vector;  
template <typename T> class deque;  
template <typename T> class list;
```

What follows is  
a template

The template  
parameter is a  
type placeholder

A class  
template

- Don't need details for now

`vector<double>`

# Example

```
#include <iostream>
#include <algorithm>
#include <vector>
#include <numeric>

int main() {

    std::vector<int> x(10);
    std::iota(x.begin(), x.end(), 0);
    std::copy(x.begin(), x.end(),
              std::ostream_iterator<int>(std::cout, "\n"));

    return 0;
}
```

```
$ c++ copy_print_vector.cpp
$ ./a.out
0
1
2
3
4
5
6
7
8
9
```

# Class templates

```
template <typename T>
class Vector {
    public:
        Vector(size_t M) : num_rows_(M), storage_(num_rows_) {}

        double& operator()(size_t i) { return storage_[i]; }
        const double& operator()(size_t i) const { return storage_[i]; }

        size_t num_rows() const { return num_rows_; }

    private:
        size_t num_rows_;
        std::vector<T> storage_;
};
```

What is the first rule?

```
Vector<double> av(10);
```

# Thank you!

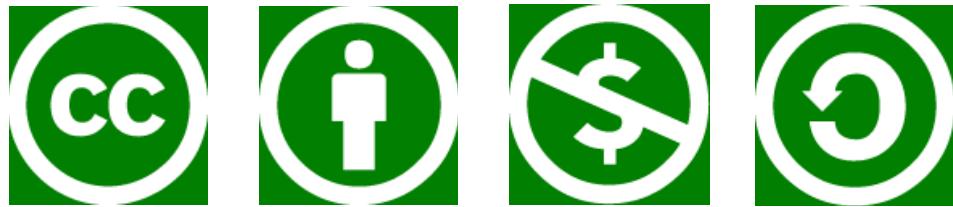
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