

Advanced Topics In Physics II

– Computational Physics

Phys 750 Lecture 1

Advanced Topics in Physics II — Computational Physics

Phys 750 — Fall 2017
Department of Physics & Astronomy

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**link to the
syllabus**

More details provided in the [syllabus](#).

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I'm a condensed matter theorist, working primarily in computational many-body physics. This site records some of my ongoing research activities. It also includes several how-to guides and web pages for the courses I've been teaching.



Kevin Beach

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Course objectives

The goals of this course are to (1) introduce computing as a tool for numerical problem solving in physics, with an emphasis on simulation; (2) familiarize students with a variety of important methods and algorithms; and (3) use numerical experiments to uncover and explore phenomena from diverse subfields of physics.

Catalog description

This course covers topics of current interest, both experimental and theoretical.

Tools and skills

- ▶ Basic programming in C++14, using the gcc or llvm compilers
- ▶ Standard, freely available tools (e.g., make, gnuplot, LaTeX, ...)
- ▶ Skeleton codes designed for UNIX or MacOS
- ▶ Assignment submission via Bitbucket: please sign up for a free academic account at bitbucket.org using your olemiss.edu email address

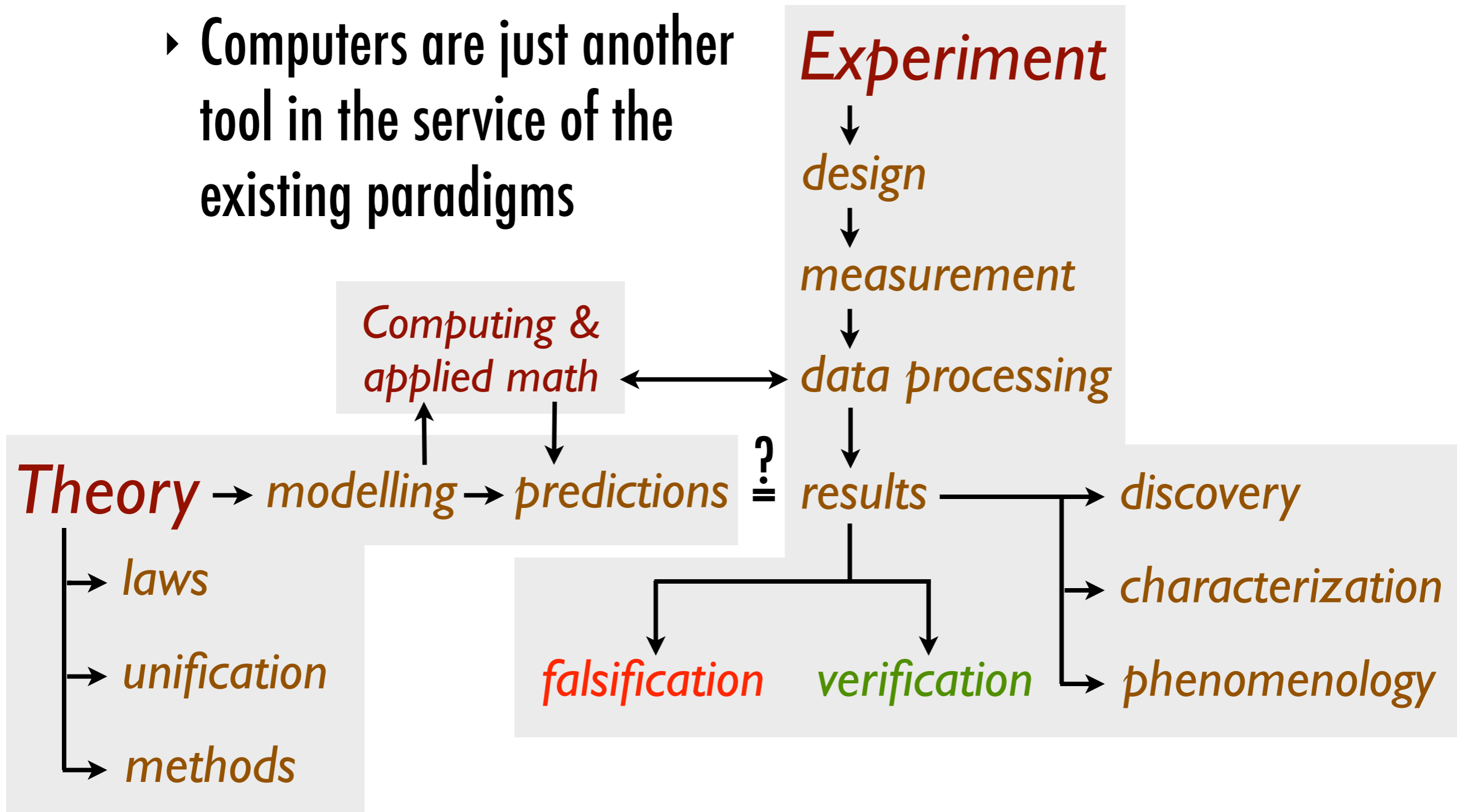
Computational physics

What is computational physics?

- ▶ A **branch of physics** in its own right and an important bridge between theory and experiment
- ▶ Concerned with the development and implementation of numerical **algorithms** that can **simulate** complex physical behaviour
- ▶ Employed extensively in almost every physics discipline

The purely instrumental view

- ▶ Computers are just another tool in the service of the existing paradigms



The purely instrumental view

- ▶ Contact between **theory** and **experiment** relies on our making **quantitative** comparisons
- ▶ The computer plays a supporting role:
 - ▶ treat by numerical methods models that cannot be solved analytically *Wait! Can we solve any models by hand?*
 - ▶ manipulate experimental data (background subtraction, Fourier analysis, etc.)
Is it always necessary (or even possible) to perform an experiment?

A richer view

Theory

Computational physics

Experiment

simulation

numerical experiment

discovery

*hypothesis
testing*

*engineering
in silico*

*inaccessible
regimes*

e.g., chaos,
fractals, strange
attractors

e.g., quark
confinement
in QCD

e.g., designer
materials
like graphene

e.g., metallic
hydrogen at
ultra-high pressure

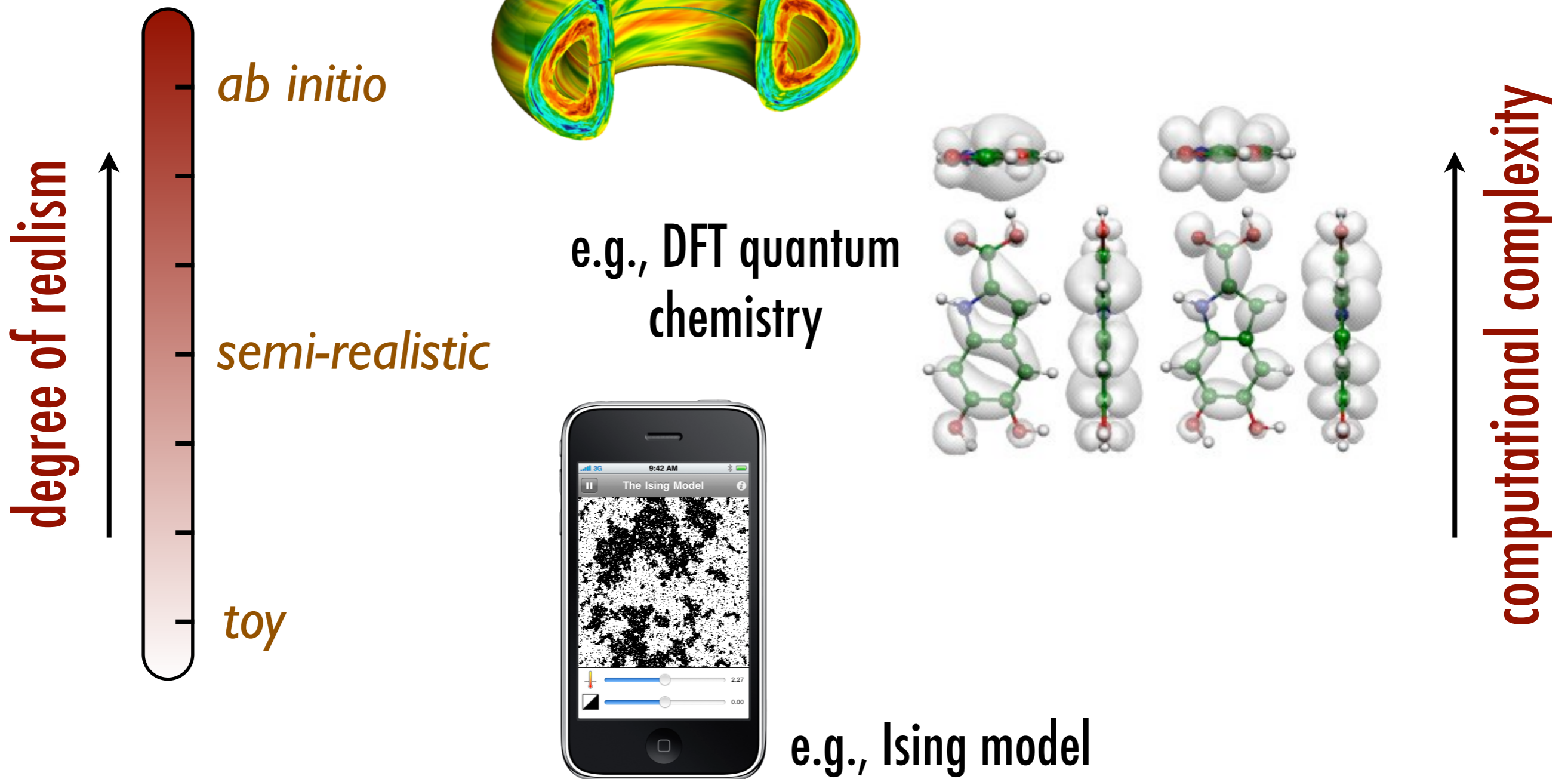
A richer view

- ▶ Computational physics seen as a **co-equal branch** of physics, **complementary** to theory and experiment
- ▶ Draws on lessons from computer science and applied mathematics but applies insights from physics
- ▶ Many problems can be addressed by no other means: Wigner crystals, plasma near fusion ignition, stellar interiors, colliding black holes, galaxy formation, undiscovered elements, climate models, ...

Important issues

- ▶ How do we make physics come alive in the machine?
- ▶ What degree of realism is necessary in our modelling?
- ▶ How do we design algorithms?
- ▶ What are the key considerations for efficiency of storage and execution time?
- ▶ How do we apply insights from physics?

Degree of realism



Algorithm families

- ▶ **Time evolution (of particles or fields):**
 - ▶ molecular dynamics, N-body simulation, computational fluid dynamics
 - ▶ forward integration of the equations of motion
- ▶ **Stochastic sampling**
 - ▶ Monte Carlo methods
 - ▶ ensemble averages for systems in thermal equilibrium
- ▶ **Normal mode analysis**
 - ▶ linearized dynamics, spectral methods, matrix mechanics

Algorithmic scaling

▶ How do the storage requirements and execution time scale as the size of the simulation grows?

▶ For N

▶ particles ...

▶ time steps ...

▶ lattice spacings ...

algorithmic efficiency



$O(\log N)$

$O(N)$

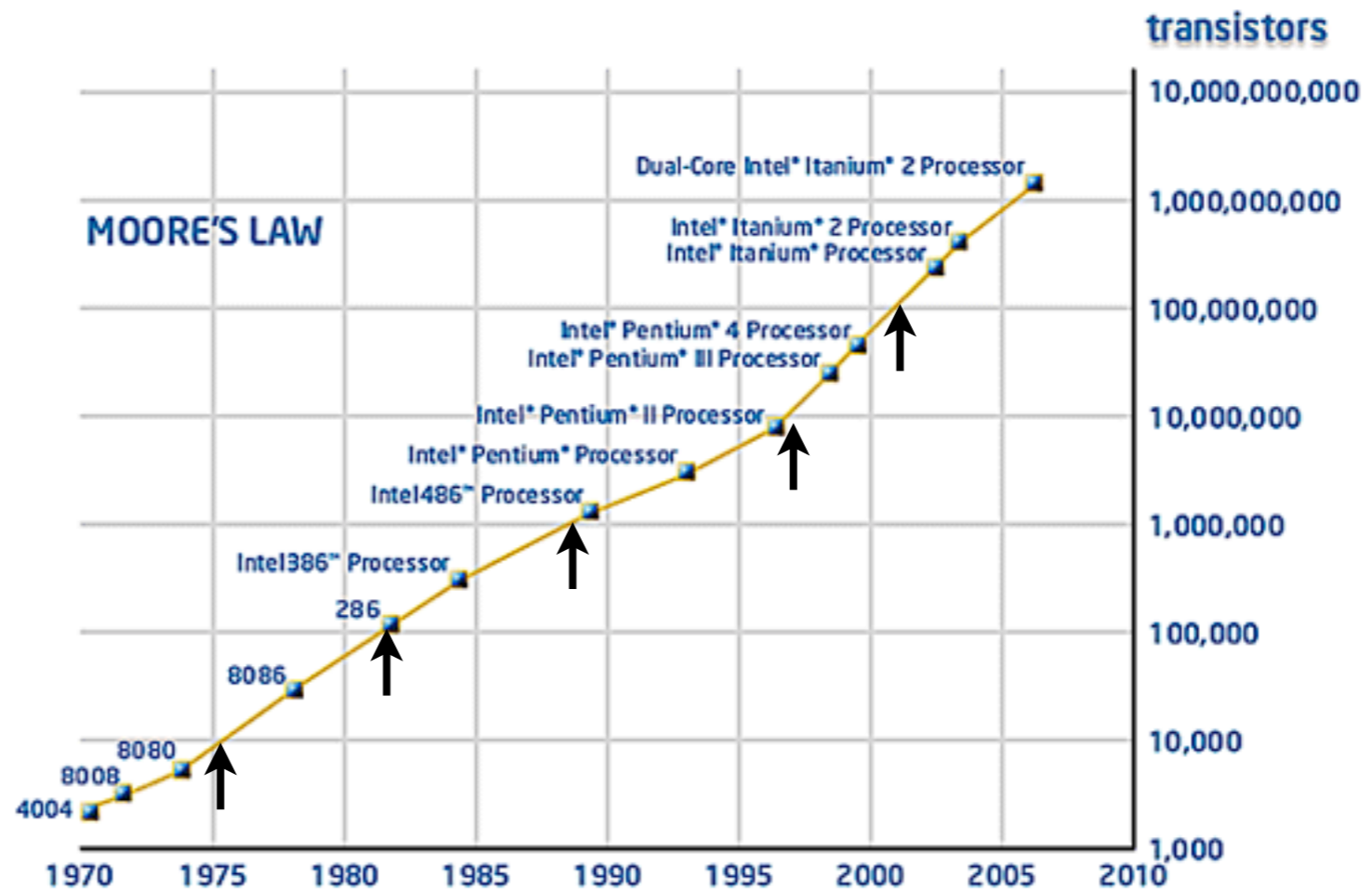
$O(N \log N)$

$O(N^2)$

$O(2^N)$

Algorithmic scaling

<i>good</i> $O(N \log N)$	$N=10$	$N=80$	$N=667$	$N=5720$	$N=50000$
<i>bad</i> $O(N^2)$	$N=10$	$N=32$	$N=100$	$N=316$	$N=1000$
<i>ugly</i> $O(2^N)$	$N=10$	$N=12.5$	$N=15$	$N=17.5$	$N=20$



Algorithmic scaling

- ▶ e.g., simulation of a gravitating system; execution time limited by the calculation of all pairwise forces

```
const int N = 8; // number planets

// simple loop with N^2 operations
for (int i = 0; i < N; ++i)
    for (int j = 0; j < N; ++j)
        if (i != j)
            acc[i] += force(i,j)/m[i];
```


Algorithmic scaling

- ▶ e.g., simulation of a gravitating system; execution time limited by the calculation of all pairwise forces

```
const int N = 8; // number planets
// simple loop with N^2 operations
for (int i = 0; i < N; ++i)
    for (int j = 0; j < N; ++j)
        if (i != j)
            acc[i] += force(i,j)/m[i];
```



```
// More efficient but op count
// N*(N-1)/2 is still O(N^2)
for (int i = 0; i < N; ++i)
    for (int j = i+1; j < N; ++j)
    {
        const double tmp = force(i,j);
        acc[i] += tmp/m[i];
        acc[j] -= tmp/m[j];
    }
```

Algorithmic scaling

- ▶ e.g., find the median from an array of energy values; a naive implementation that scales as $O(N^2)$

```
double median_naive(double* E, int N) {
    for (int i = 0; i <= N/2; ++i)
    {
        double smallest = E[i];
        for (int j = N-1; j > i; --j)
            if (E[j] < smallest) swap(E[i],E[j]);
    }
    return E[N/2];
}
double E[100] = { -3.98, 14.72, ..., 0.0892 };
double m = median_naive(E,100);
```

Algorithmic scaling

- ▶ median can be found in $O(N \log N)$ guaranteed

```
double E[100] = { -3.98, 14.72, ..., 0.0892 };  
sort(E, E+100);  
double m = E[50];
```

- ▶ or in $O(N)$ on average and $O(N^2)$ worst case with Hoare's selection algorithm (QuickSelect)

C++ language review

Edit-compile-run cycle

prompt

► From the **UNIX terminal**:

```
$ emacs myprog.cpp &
$ g++ -o myprog myprog.cpp \
    -ansi -pedantic \
    -lm -DNDEBUG
$ ls -F
myprog.cpp  myprog*
$ ./myprog
          0          1.41421
0.0314159  1.41404
0.0628319  1.41352
0.0942478  1.41264
          |          |
        3.07876    0.0444215
        3.11018    0.0222135
```

user-created program file

```
#include <cmath>
using std::sqrt;
using std::cos;

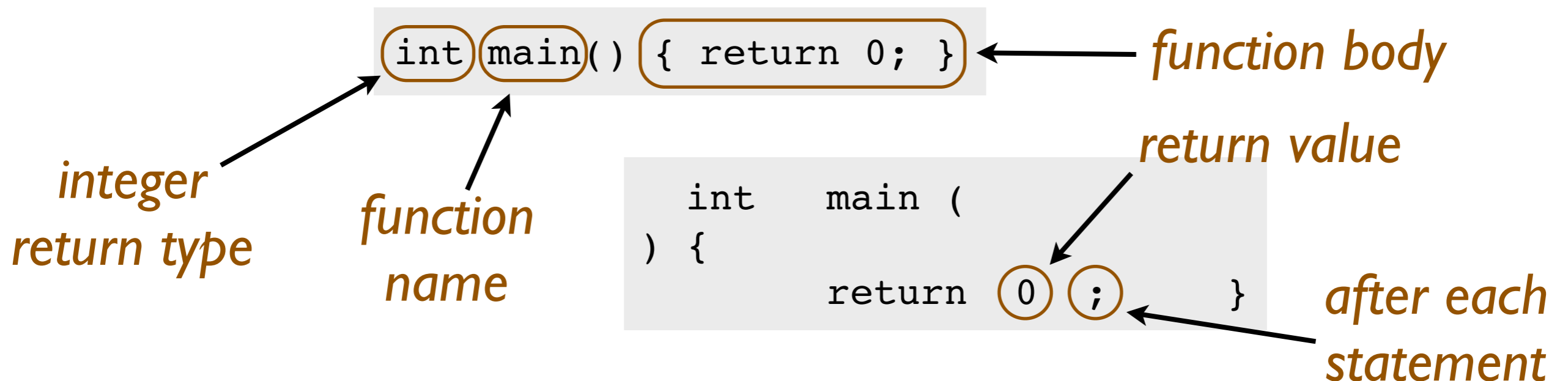
#include <iostream>
using std::cout;
using std::endl;

#include <iomanip>
using std::setw;

int main()
{
    for (int n = 0; n < 100; ++n)
    {
        const double x = M_PI*n/100.0;
        cout << setw(20) << x
              << setw(20) << sqrt(1+cos(x))
              << endl;
    }
    return 0;
}
```

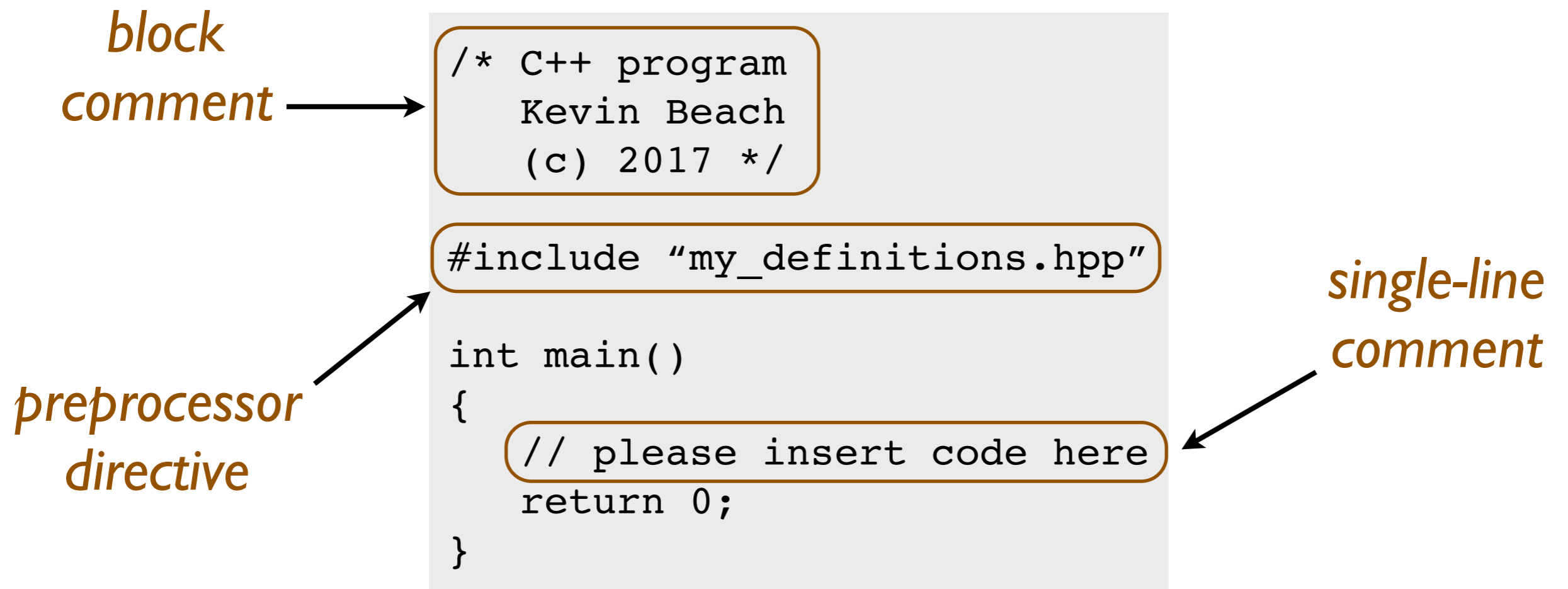
Code formatting

- ▶ C++ code is freeform:
 - ▶ code structure is indicated by semicolons and braces
 - ▶ white space has no meaning
- ▶ These are equivalent restatements of the **null program**:



Code formatting

- ▶ Single-line and block **comments** are supported
- ▶ Hash-prefixed commands are **preprocessor directives**



Properties

- ▶ The **type**, **mutability**, **scope**, and **duration** and of every **object** must be specified before it is used:
 - ▶ type and mutability are set by (prefix) keywords
 - ▶ scope and duration are controlled by where in the code an object is declared
- ▶ Every **function** acts on and returns objects of definite type

Types and their modifiers

- ▶ The integer and double-precision floating point types accept **type modifiers**
- ▶ Objects of any type may be flagged as immutable

	<i>type name</i>	<i>literal</i>	
	void		
	bool	true, false	
<i>type modifiers</i> signed, unsigned	char	'a'	<i>constant modifier</i> const
short, long	int	-81	
	float	3.14F	
long	double	3.14	

Declarations and prototypes

- ▶ Type **declarations** and function **prototypes**

```
int sum(int x, int y) { return x+y; }  
int prod(int, int);  
  
const int A = 5;  
  
int main()  
{  
    int a;  
    int b = 6;  
    a = sum(b,A); // give a the value 11  
    return 0;  
}
```

*function
prototype*

*integer
variable
declaration*

Declarations and prototypes

- ▶ Objects survive until their current code block terminates
- ▶ A variable name may be temporarily obscured

global variable

```
int k;  
  
int main()  
{  
    int i = 0;  
    {  
        int i, j ;  
        i = j = 1;  
    }  
    k = i; // k is 0 here  
    return 0;  
}
```

Algebraic operators

modify in place

```
int a = (5+7*3)/2; // a is 13
a = a - 2; // 11
a += 4; // 15
a /= 3; // 5
int b = a%4; // b is 1
int c = ++a/2; // a is 6, c is 3
int d = a--/3; // a is 5, d is 2
```

*pre- and postfix
“side-effects”*

```
#include <cmath>
using std::pow; using std::sqrt;
```

*functions
from the
math library*

```
double x0 = 2.0*2.0;
double x1 = pow(2.0,2.5);
double x2 = x0*2.0;
double eps = sqrt(x0*x2)-x1;
```

Boolean (logical) operators

assignment operator

```
#include <cassert>
```

```
int a = 5;  
int b = 7;
```

test for equality

```
assert(a != b);  
assert(!( a == b ));
```

run-time checks

```
bool test1 = a < 2*b+5 and a != b;  
bool test2 = a*b >= 3 or a*b <= -3;  
bool test3 = b > a > 3;
```

legal but misleading

```
assert(test1);  
assert(test2);  
assert(!test3);
```

Bitwise operators

*enumerated
type*

```
enum directions { N = 1, E = 2, S = 4, W = 8 };  
const uint8_t opt1 = 020; // 2*8 == 16  
const uint8_t opt2 = 0x20; // 2*16 == 32
```

```
unsigned char flags = N | W;  
assert( (flags & N) and (flags & W) );
```

octal and hex

```
flags |= S | E;  
assert( flags == N | S | E | W );
```

test bits

```
flags &= ~S;  
assert( flags == N | E | W );
```

```
flags ^= N | E | opt1;  
assert( flags == W | opt1 );  
flags ^= opt1 | opt2;  
assert( !(flags & opt1) and (flags & opt2) );
```

*set,
clear,
and toggle
bits*

Control structures

- ▶ C++ provides standard **looping** and **branching** constructs:

```
int x = 1, y = 1;  
int n = 5;  
while (n > 0) { x *= 2; --n; }  
do { y *= 2; } while (y < 32);  
assert(x == y and y == 32);
```

```
const int M = (x < 0 ? -x : x);
```

```
int div5 = 0;  
for (int m = 0; m < M; ++m)  
    if (m%5 == 0)  
        cout << ++div5 << endl;  
    else  
        do_something();  
assert(div5 == 7);
```

looping

branching

Function arguments

- ▶ Functions **arguments** are **passed by value**, which prevents side effects
- ▶ Changes can be made to propagate outside the function by passing a **reference** instead

```
int thrice(int x) { return 3*x; }  
void triple(int &x) { x *= 3; }  
  
int x = 3;  
const int y = thrice(x); // y is 9  
                        // x is still 3  
triple(x); // x is now 9
```

*reference
operator*

Command-line arguments

```
#include <cstdlib>
using std::atoi; using std::atof;
using std::exit;
#include <iostream>
using std::cerr; using std::cout;
using std::endl;

int main(int argc, char* argv[])
{
    if (argc != 3)
    { cerr << "Two arguments required" << endl; exit(1); }

    int i = atoi(argv[1]); // argv[0] is "myprog"
    double x = atof(argv[2]);

    cout << "Int: " << i << " FP: " << x << endl;
    return 0;
}
```

```
$ emacs myprog.cpp &
$ g++ -o myprog myprog.cpp \
      -ansi -pedantic \
      -lm -DNDEBUG
$ ./myprog
Two arguments required
$ ./myprog 5 -3.88
Int: 5 FP: -3.88
```

Writing to the terminal

```
#include <iostream>
using std::cout;
using std::endl;

#include <iomanip>
using std::setw;

#include <cmath>

main()
{
    cout.setf(std::ios::scientific);
    cout.precision(8);
    cout << setw(16) << M_PI << endl;
    return 0;
}
```

Composite objects

- ▶ **arrays** are groups of identically typed objects stored contiguously in memory
- ▶ **structures** and **classes** bundle objects of arbitrary type

```
bool active[3];  
active[0] = active[1] = active[2] = true;  
  
struct particle { double m, x, vx; };  
particle gas[100]; particle test;  
  
gas[0].m = 1.0;  
test.vx = -5.5;
```

*member
operator*

*zero-based
array
indexing*

Composite objects

- ▶ Classes may also have **methods** associated with them
- ▶ Methods are functions belonging to a class that act on its internal data

constructor / initialization list

```
class particle
{
public:
    double m, x, vx;
    particle(double m_, double x_, double vx_) :
        m(m_), x(x_), vx(vx_) {}
    double energy(void) { return 0.5*vx*vx/m; }
};
```

```
particle p(2.0,0.0,3.0);
const double E = p.energy();
```

method

Passing composite objects

- ▶ Arrays are passed as **pointers** to the first element
- ▶ Structures and classes should be passed by reference
- ▶ Only a **memory address** rather than the data is copied

```
double dot_product(double u[], double v[], int N);  
double dot_product(double* u, double* v, int N);
```

pointer dereferencing

```
double momentum(const particle &p)  
{ return p.m*p.vx; }
```

*reference to a
constant object*

```
void evolve_no_accel(particle &p, double dt)  
{ p.x += p.vx*dt; }
```

Passing composite objects

- ▶ arrays don't know their own size and are thus dangerous

```
#include <cassert>
double sum_squares(const double x[], int N)
{
    if (N < 1)
        assert(false);
    double sum = 0.0;
    for (int i = 0; i < N; ++i)
        sum += x[i]*x[i];
    return sum;
}
const double v[3] = { 1.0, 2.0, -3.0 };
double norm_v = sum_squares(v, 5);
```

*forces a
run-time
error*

*memory error:
“segmentation
fault”*

Templates

- ▶ **Templates** provide a mechanism for adding compile-time pattern matching to classes and functions:

```
template <typename T>
T abs_value(T x)
{
    if (x < 0) return -x;
    else return x;
}

template <int y>
void increment_by(int &x) { x += y; }

int a = -5;
int b = abs_value(a); // b is 5
increment_by<3>(b); // 8
```

STL container classes

- ▶ The C++ standard library provides a variety of **dynamically-allocated** data structures:

```
#include <vector>
using std::vector;

double sum_squares(const vector<double> &v)
{
    assert(v.size()>0);
    double sum = 0.0;
    for (int i = 0; i < v.size(); ++i)
        sum += x[i]*x[i];
    return sum;
}

vector<double> u; double u0 = 0.5;
while(u.size() < 10) u.push_back(u0*=2.0);
const double N = sum_squares(u);
```


STL container classes

- ▶ **sequence containers**

- ▶ $O(1)$ element access
- ▶ $O(N)$ insertion

```
#include <vector>
using std::vector

#include <deque>
using std::deque
```

- ▶ **associative containers**

- ▶ $O(N \log N)$ lookup
- ▶ $O(1)$ insertion

```
#include <set>
using std::set

#include <map>
using std::map
```

`list, slist, multiset, multimap, stack, queue, ...`

Pointers and iterators

- ▶ **Pointers** point to data at a particular location in memory
- ▶ **Iterators** are pointer-like abstractions that are provided by the C++ container classes

```
double a[5] = { 1.1, 2.2, 3.3, 4.4, 5.5 };
vector<double> v(a, a+5);

for (int i = 0; i < v.size(); ++i)
    assert(a[i] == v[i]);

for (double* step = a; step < a+5; ++step)
    do_work_on(*step);

for (vector<double>::iterator step = v.begin();
     step != v.end(); ++step)
    do_work_on(*step);
```

Generic programming

```
#include <vector>
using std::vector;

template <class Iter>
double sum_squares(Iter begin, Iter end)
{
    assert(begin != end);
    Iter p = begin;
    double sum = (*p)*(*p);
    while (++p < end) sum += (*p)*(*p);
    return sum;
}

const double A[] = { 2.7, -5.5, 100.1 };
const int B[] = { 1, 2, 3, 4, 5 };
vector<double> v(A,A+3);

sum_squares(v.begin(), v.end());
sum_squares(B,B+5);
```

File output and input

```
#include <iostream>
using std::endl;
#include <fstream>
using std::ofstream; using std::ifstream;
#include <cassert>

main()
{
    ofstream fout("myfile.txt");
    fout << "1 2 3 4 5" << endl;
    fout << "6 7 8 9 10" << endl;
    fout.close();
    ifstream fin("myfile.txt");
    vector<int> v;
    while(fin) { int i; fin >> i;
                v.push_back(i); }
    fin.close();
    assert(v.size() == 10);
    return 0;
}
```

Our overall approach

- ▶ Programming style will be more procedural than OO:
 - ▶ Treat C++ as a syntactically cleaner version of C
 - ▶ Make use of templates, generic programming, and STL data structures
- ▶ Things we'll largely ignore:
 - ▶ class inheritance and polymorphism
 - ▶ virtual functions
 - ▶ exception handling