# Slides from FYS3150/4150 Programming aspects

Morten Hjorth-Jensen<sup>1,2</sup>

Department of Physics, University of Oslo<sup>1</sup>

Department of Physics and Astronomy and National Superconducting Cyclotron Laboratory, Michigan State University  $^2$ 

Fall 2015

### Extremely useful tools, strongly recommended

# and discussed at the lab sessions the first two weeks (see guides at the website of the course)

- ► GIT for version control, discussed at the lab this week (and next week as well)
- ipython notebook, mentioned this week
- QTcreator for editing and mastering computational projects (for C++ codes, see webpage of course)
- Armadillo as a useful numerical library for C++, highly recommended
- Unit tests
- Devilry for handing in projects

# A structured programming approach

- ▶ Before writing a single line, have the algorithm clarified and understood. It is crucial to have a logical structure of e.g., the flow and organization of data before one starts writing.
- ▶ Always try to choose the simplest algorithm. Computational speed can be improved upon later.
- ► Try to write a as clear program as possible. Such programs are easier to debug, and although it may take more time, in the long run it may save you time. If you collaborate with other people, it reduces spending time on debuging and trying to understand what the codes do. A clear program will also allow you to remember better what the program really does!

# A structured programming approach

- ▶ The planning of the program should be from top down to bottom, trying to keep the flow as linear as possible. Avoid jumping back and forth in the program. First you need to arrange the major tasks to be achieved. Then try to break the major tasks into subtasks. These can be represented by functions or subprograms. They should accomplish limited tasks and as far as possible be independent of each other. That will allow you to use them in other programs as well.
- Try always to find some cases where an analytical solution exists or where simple test cases can be applied. If possible, devise different algorithms for solving the same problem. If you get the same answers, you may have coded things correctly or made the same error twice or more.

# Getting Started

### Compiling and linking, without QTcreator

In order to obtain an executable file for a C++ program, the following instructions under Linux/Unix can be used

```
c++ -c -Wall myprogram.cpp
c++ -o myprogram myprogram.o
```

where the compiler is called through the command c++/g++. The compiler option -Wall means that a warning is issued in case of non-standard language. The executable file is in this case myprogram. The option -c is for compilation only, where the program is translated into machine code, while the -o option links the produced object file myprogram. o and produces the executable myprogram.

For Fortran2008 we use the Intel compiler, replace c++ with ifort. Also, to speed up the code use compile options like

```
c++ -03 -c -Wall myprogram.cpp
```

### Makefiles and simple scripts

Under Linux/Unix it is often convenient to create a so-called makefile, which is a script which includes possible compiling commands.

```
# Comment lines
# General makefile for c - choose PROG = name of given program
# Here we define compiler option, libraries and the target
CC= g++ -Wall
PROG= myprogram
# this is the math library in C, not necessary for C++
LIB = -lm
# Here we make the executable file
${PROG}: ${PROG}.o
${CC} ${PROG}.o
${CC} ${PROG}.o
${PROG}.c
${PROG}.c
${PROG}.c
${CC} -c ${PROG}.c
```

If you name your file for makefile, simply type the command make and Linux/Unix executes all of the statements in the above makefile. Note that C++ files have the extension .cpp.

#### Hello world

#### The C encounter

Here we present first the C version.

# Hello World, dissecting the code

#### Dissection I

The compiler must see a declaration of a function before you can call it (the compiler checks the argument and return types). The declaration of library functions appears in so-called "header files" that must be included in the program, e.g.,

```
#include <stdlib.h> /* atof function */
```

We call three functions (atof, sin, printf) and these are declared in three different header files. The main program is a function called main with a return value set to an integer, int (0 if success). The operating system stores the return value, and other programs/utilities can check whether the execution was successful or not. The command-line arguments are transferred to the main function through

```
int main (int argc, char* argv[])
```

### Hello World, more dissection

#### Dissection II

The command-line arguments are transferred to the main function through

```
int main (int argc, char* argv[])
```

The integer argc is the no of command-line arguments, set to one in our case, while argy is a vector of strings containing the command-line arguments with argv [0] containing the name of the program and argv[1], argv[2], ... are the command-line args, i.e., the number of lines of input to the program. Here we define floating points, see also below, through the keywords float for single precision real numbers and double for double precision. The function atof transforms a text (argv[1]) to a float. The sine function is declared in math.h, a library which is not automatically included and needs to be linked when computing an executable file. With the command printf we obtain a formatted printout. The printf syntax is used for formatting output in many C-inspired languages (Perl, Python, Awk, partly C++).

#### Hello World

#### Now in C++

Here we present first the C++ version.

```
// A comment line begins like this in C++ programs
// Standard ANSI-C++ include files
using namespace std
#include <iostream> // input and output
int main (int argc, char* argv[])
{
    // convert the text argv[1] to double using atof:
    double r = atof(argv[1]);
    double s = sin(r);
    cout << "Hello, World! sin(" << r << ")=" << s << '\n';
    // success
    return 0;
}</pre>
```

#### C++ Hello World

#### Dissection I

We have replaced the call to printf with the standard C++ function cout. The header file <iostream.h> is then needed. In addition, we don't need to declare variables like r and s at the beginning of the program. I personally prefer however to declare all variables at the beginning of a function, as this gives me a feeling of greater readability.

# Brief summary

### C/C++ program

- ► A C/C++ program begins with include statements of header files (libraries,intrinsic functions etc)
- Functions which are used are normally defined at top (details next week)
- ► The main program is set up as an integer, it returns 0 (everything correct) or 1 (something went wrong)
- Standard if, while and for statements as in Java, Fortran, Python...
- Integers have a very limited range.

# Brief summary

#### Arrays

- ► A C/C++ array begins by indexing at 0!
- ▶ Array allocations are done by size, not by the final index value. If you allocate an array with 10 elements, you should index them from 0, 1, . . . , 9.
- ▶ Initialize always an array before a computation.

# Serious problems and representation of numbers

### Integer and Real Numbers

- Overflow
- Underflow
- Roundoff errors
- Loss of precision

# Limits, you must declare variables

C++ and Fortran declarations

type in C/C++ and Fortran2008	bits	range
int/INTEGER (2)	16	-32768 to 32767
unsigned int	16	0 to 65535
signed int	16	-32768 to 32767
short int	16	-32768 to 32767
unsigned short int	16	0 to 65535
signed short int	16	-32768 to 32767
int/long int/INTEGER (4)	32	-2147483648 to 2147483647
signed long int	32	-2147483648 to 2147483647
float/REAL(4)	32	$3.4 \times 10^{-44} \text{ to } 3.4 \times 10^{+38}$
double/REAL(8)	64	$1.7 \times 10^{-322} \text{ to } 1.7 \times 10^{+308}$
long double	64	$1.7  imes 10^{-322}  ext{ to } 1.7  imes 10^{+308}$

# From decimal to binary representation

#### How to do it

$$a_n 2^n + a_{n-1} 2^{n-1} + a_{n-2} 2^{n-2} + \dots + a_0 2^0$$
.

In binary notation we have thus  $(417)_{10} = (110110001)_2$  since we have

$$(110100001)_2 = 1 \times 2^8 + 1 \times 2^7 + 0 \times 2^6 + 1 \times 2^5 + 0 \times 2^4 + 0 \times 2^3 + 0 \times 2^2 + 0 \times 2^2 + 0 \times 2^1 + 1 \times 2^0.$$

# From decimal to binary representation, the actual operation

# To see this, we have performed the following divisions by 2

417/2=208	remainder 1	coefficient of 20 is 1
208/2=104	remainder 0	coefficient of 2 <sup>1</sup> is 0
104/2 = 52	remainder 0	coefficient of $2^2$ is 0
52/2=26	remainder 0	coefficient of $2^3$ is 0
26/2 = 13	remainder 1	coefficient of 2 <sup>4</sup> is 0
13/2 = 6	remainder 1	coefficient of $2^5$ is $1$
6/2 = 3	remainder 0	coefficient of 2 <sup>6</sup> is 0
3/2 = 1	remainder 1	coefficient of 2 <sup>7</sup> is 1
1/2 = 0	remainder 1	coefficient of $2^8$ is $1$

### From decimal to binary representation

### Integer numbers

```
using namespace std;
#include <iostream>
int main (int argc, char* argv[])
  int i;
  int terms[32]; // storage of a0, a1, etc, up to 32 bits
  int number = atoi(argv[1]);
  // initialise the term a0, a1 etc
  for (i=0; i < 32; i++){terms[i] = 0;}
  for (i=0; i < 32; i++){
    terms[i] = number%2;
    number /= 2;
  // write out results
  cout << "Number of bytes used= " << sizeof(number) << endl;</pre>
  for (i=0; i < 32; i++){
    cout << " Term nr: " << i << "Value= " << terms[i]:</pre>
    cout << endl:</pre>
  return 0:
```

### From decimal to binary representation

#### Integer numbers, Fortran

```
PROGRAM binary_integer
IMPLICIT NONE
  INTEGER i, number, terms(0:31) ! storage of a0, a1, etc, up to 32 b
  WRITE(*,*) 'Give a number to transform to binary notation'
  READ(*,*) number
! Initialise the terms a0. a1 etc
 terms = 0
! Fortran takes only integer loop variables
  DO i=0.31
     terms(i) = MOD(number,2)
     number = number/2
  ENDDO
! write out results
  WRITE(*,*) 'Binary representation '
  DO i=0.31
    WRITE(*,*)' Term nr and value', i, terms(i)
  ENDDO
END PROGRAM binary_integer
```

### Integer Numbers

### Possible Overflow for Integers

```
// A comment line begins like this in C++ programs
// Program to calculate 2**n
// Standard ANSI-C++ include files */
using namespace std
#include <iostream>
#include <cmath>
int main()
   int int1, int2, int3;
// print to screen
   cout << "Read in the exponential N for 2^N =\n";</pre>
// read from screen
   cin >> int2:
   int1 = (int) pow(2., (double) int2);
   cout << "2^N * 2^N = " << int1*int1 << "\n":
   int3 = int1 - 1:
   cout << "2^N*(2^N - 1) = " << int1 * int3 << "\n";
   cout << " 2^N- 1 = " << int3 << "\n":
   return 0:
// End: program main()
```

#### Machine Numbers

In the decimal system we would write a number like 9.90625 in what is called the normalized scientific notation.

$$9.90625 = 0.990625 \times 10^{1},$$

and a real non-zero number could be generalized as

$$x = \pm r \times 10^{\mathsf{n}},\tag{1}$$

with r a number in the range  $1/10 \le r < 1$ . In a similar way we can use represent a binary number in scientific notation as

$$x = \pm q \times 2^{\mathbf{m}},\tag{2}$$

with q a number in the range  $1/2 \le q < 1$ . This means that the mantissa of a binary number would be represented by the general formula

$$(0.a_{-1}a_{-2}\dots a_{-n})_2 = a_{-1} \times 2^{-1} + a_{-2} \times 2^{-2} + \dots + a_{-n} \times 2^{-n}.$$
 (3)

#### Machine Numbers

In a typical computer, floating-point numbers are represented in the way described above, but with certain restrictions on q and m imposed by the available word length. In the machine, our number x is represented as

$$x = (-1)^s \times \text{mantissa} \times 2^{\text{exponent}},$$
 (4)

where s is the sign bit, and the exponent gives the available range. With a single-precision word, 32 bits, 8 bits would typically be reserved for the exponent, 1 bit for the sign and 23 for the mantissa.

#### Machine Numbers

A modification of the scientific notation for binary numbers is to require that the leading binary digit 1 appears to the left of the binary point. In this case the representation of the mantissa q would be  $(1.f)_2$  and  $1 \leq q < 2$ . This form is rather useful when storing binary numbers in a computer word, since we can always assume that the leading bit 1 is there. One bit of space can then be saved meaning that a 23 bits mantissa has actually 24 bits. This means explicitly that a binary number with 23 bits for the mantissa reads

$$(1.a_{-1}a_{-2}\dots a_{-23})_2 = 1\times 2^0 + a_{-1}\times 2^{-1} + a_{-2}\times 2^{-2} + \dots + a_{-23}\times 2^{-23}.$$
(5)

# Loss of Precision, example

As an example, consider the 32 bits binary number

where the first bit is reserved for the sign, 1 in this case yielding a negative sign. The exponent m is given by the next 8 binary numbers 01111101 resulting in 125 in the decimal system.

#### Machine Numbers

However, since the exponent has eight bits, this means it has  $2^8-1=255$  possible numbers in the interval  $-128 \leq m \leq 127$ , our final exponent is 125-127=-2 resulting in  $2^{-2}$ . Inserting the sign and the mantissa yields the final number in the decimal representation as

$$-2^{-2}\left(1\times 2^{0}+1\times 2^{-1}+1\times 2^{-2}+1\times 2^{-3}+0\times 2^{-4}+1\times 2^{-5}\right)=$$

$$(-0.4765625)_{10}$$
.

In this case we have an exact machine representation with 32 bits (actually, we need less than 23 bits for the mantissa).

### Loss of Precision, consequences

If our number x can be exactly represented in the machine, we call x a machine number. Unfortunately, most numbers cannot and are thereby only approximated in the machine. When such a number occurs as the result of reading some input data or of a computation, an inevitable error will arise in representing it as accurately as possible by a machine number.

#### Machine Numbers

A floating number x, labelled fl(x) will therefore always be represented as

$$fl(x) = x(1 \pm \epsilon_x),$$
 (6)

with x the exact number and the error  $|\epsilon_x| \leq |\epsilon_M|$ , where  $\epsilon_M$  is the precision assigned. A number like 1/10 has no exact binary representation with single or double precision. Since the mantissa

$$(1.a_{-1}a_{-2}\ldots a_{-n})_2$$

is always truncated at some stage n due to its limited number of bits, there is only a limited number of real binary numbers. The spacing between every real binary number is given by the chosen machine precision. For a 32 bit words this number is approximately  $\epsilon_M \sim 10^{-7}$  and for double precision (64 bits) we have  $\epsilon_M \sim 10^{-16}$ , or in terms of a binary base as  $2^{-23}$  and  $2^{-52}$  for single and double precision, respectively.

#### Machine Numbers

In the machine a number is represented as

$$fl(x) = x(1+\epsilon) \tag{7}$$

where  $|\epsilon| \le \epsilon_M$  and  $\epsilon$  is given by the specified precision,  $10^{-7}$  for single and  $10^{-16}$  for double precision, respectively.  $\epsilon_M$  is the given precision. In case of a subtraction a=b-c, we have

$$fl(a) = fl(b) - fl(c) = a(1 + \epsilon_a), \tag{8}$$

or

$$fl(a) = b(1 + \epsilon_b) - c(1 + \epsilon_c), \tag{9}$$

The above means that

$$fl(a)/a = 1 + \epsilon_b \frac{b}{a} - \epsilon_c \frac{c}{a},$$
 (10)

and if  $b \approx c$  we see that there is a potential for an increased error in f(a).

#### Machine Numbers

Define the absolute error as

$$|fl(a) - a|, \tag{11}$$

whereas the relative error is

$$\frac{|fl(a) - a|}{a} \le \epsilon_a. \tag{12}$$

The above subraction is thus

$$\frac{|fl(a) - a|}{a} = \frac{|fl(b) - fl(c) - (b - c)|}{a},$$
 (13)

yielding

$$\frac{|fl(a)-a|}{a} = \frac{|b\epsilon_b - c\epsilon_c|}{a}.$$
 (14)

The relative error is the quantity of interest in scientific work. Information about the absolute error is normally of little use in the absence of the magnitude of the quantity being measured.

# Loss of numerical precision

Suppose we wish to evaluate the function

$$f(x) = \frac{1 - \cos(x)}{\sin(x)},$$

for small values of x. Five leading digits. If we multiply the denominator and numerator with  $1 + \cos(x)$  we obtain the equivalent expression

$$f(x) = \frac{\sin(x)}{1 + \cos(x)}.$$

If we now choose x = 0.007 (in radians) our choice of precision results in

$$\sin(0.007) \approx 0.69999 \times 10^{-2}$$

and

$$\cos(0.007) \approx 0.99998$$
.

# Loss of numerical precision

The first expression for f(x) results in

$$f(x) = \frac{1 - 0.99998}{0.69999 \times 10^{-2}} = \frac{0.2 \times 10^{-4}}{0.69999 \times 10^{-2}} = 0.28572 \times 10^{-2},$$

while the second expression results in

$$f(x) = \frac{0.69999 \times 10^{-2}}{1 + 0.99998} = \frac{0.69999 \times 10^{-2}}{1.99998} = 0.35000 \times 10^{-2},$$

which is also the exact result. In the first expression, due to our choice of precision, we have only one relevant digit in the numerator, after the subtraction. This leads to a loss of precision and a wrong result due to a cancellation of two nearly equal numbers. If we had chosen a precision of six leading digits, both expressions yield the same answer.

### Loss of numerical precision

If we were to evaluate  $x \sim \pi$ , then the second expression for f(x) can lead to potential losses of precision due to cancellations of nearly equal numbers.

This simple example demonstrates the loss of numerical precision due to roundoff errors, where the number of leading digits is lost in a subtraction of two near equal numbers. The lesson to be drawn is that we cannot blindly compute a function. We will always need to carefully analyze our algorithm in the search for potential pitfalls. There is no magic recipe however, the only guideline is an

understanding of the fact that a machine cannot represent correctly *all* numbers.

# Loss of precision can cuae serious problems

#### Real Numbers

- ➤ Overflow: When the positive exponent exceeds the max value, e.g., 308 for DOUBLE PRECISION (64 bits). Under such circumstances the program will terminate and some compilers may give you the warning OVERFLOW.
- ► Underflow: When the negative exponent becomes smaller than the min value, e.g., -308 for DOUBLE PRECISION.

  Normally, the variable is then set to zero and the program continues. Other compilers (or compiler options) may warn you with the UNDERFLOW message and the program terminates.

# Loss of precision, real numbers

Roundoff errors. A floating point number like

$$x = 1.234567891112131468 = 0.1234567891112131468 \times 10^{1}$$
 (15)

may be stored in the following way. The exponent is small and is stored in full precision. However, the mantissa is not stored fully. In double precision (64 bits), digits beyond the 15th are lost since the mantissa is normally stored in two words, one which is the most significant one representing 123456 and the least significant one containing 789111213. The digits beyond 3 are lost. Clearly, if we are summing alternating series with large numbers, subtractions between two large numbers may lead to roundoff errors, since not all relevant digits are kept. This leads eventually to the next problem, namely

## More on loss of precision Real Numbers

▶ Loss of precision: When one has to e.g., multiply two large numbers where one suspects that the outcome may be beyond the bonds imposed by the variable declaration, one could represent the numbers by logarithms, or rewrite the equations to be solved in terms of dimensionless variables. When dealing with problems in e.g., particle physics or nuclear physics where distance is measured in fm  $(10^{-15} \text{ m})$ , it can be quite convenient to redefine the variables for distance in terms of a dimensionless variable of the order of unity. To give an example, suppose you work with single precision and wish to perform the addition  $1 + 10^{-8}$ . In this case, the information containing in  $10^{-8}$  is simply lost in the addition. Typically, when performing the addition, the computer equates first the exponents of the two numbers to be added. For  $10^{-8}$  this has however catastrophic consequences since in order to obtain an exponent equal to 10<sup>0</sup>, bits in the mantissa are shifted to the right. At the end, all bits in the mantissa are zeros.

#### A problematic case

## Three ways of computing $e^{-x}$

Brute force:

$$\exp(-x) = \sum_{n=0}^{\infty} (-1)^n \frac{x^n}{n!}$$

Recursion relation for

$$\exp(-x) = \sum_{n=0}^{\infty} s_n = \sum_{n=0}^{\infty} (-1)^n \frac{x^n}{n!}$$
$$s_n = -s_{n-1} \frac{x}{n},$$

$$\exp(x) = \sum_{n=0}^{\infty} s_n$$

$$\exp(-x) = \frac{1}{\exp(x)}$$

#### Brute Force

```
// Program to calculate function exp(-x)
// using straightforward summation with differing precision
using namespace std
#include <iostream>
#include <cmath>
// type float: 32 bits precision
// type double: 64 bits precision
#define TYPE double
#define PHASE(a) (1 - 2 * (abs(a) % 2))
#define TRUNCATION 1.0E-10
// function declaration
TYPE factorial(int);
```

#### Still Brute Force

#### Oh, it never ends!

```
printf("\nx = %4.1f exp = %12.5E series = %12.5E
             number of terms = %d",
             x, exp(-x), sum, n);
  } // end of for() loop
  printf("\n");
                          // a final line shift on output
  return 0:
} // End: function main()
// The function factorial()
// calculates and returns n!
TYPE factorial(int n)
   int loop;
  TYPE fac:
  for(loop = 1, fac = 1.0; loop <= n; loop++) {
     fac *= loop:
  return fac:
} // End: function factorial()
```

# Results $\exp(-x)$

## What is going on?

X	$\exp(-x)$	Series	Number of terms in series	
0.0	0.100000E+01	0.100000E+01	1	
10.0	0.453999E-04	0.453999E-04	44	
20.0	0.206115E-08	0.487460E-08	72	
30.0	0.935762E-13	-0.342134E-04	100	
40.0	0.424835E-17	-0.221033E+01	127	
50.0	0.192875E-21	-0.833851E+05	155	
60.0	0.875651E-26	-0.850381E+09	171	
70.0	0.397545E-30	NaN	171	
80.0	0.180485E-34	NaN	171	
90.0	0.819401E-39	NaN	171	
100.0	0.372008E-43	NaN	171	

```
// program to compute exp(-x) without exponentials
using namespace std
#include <iostream>
#include <cmath>
#define TRUNCATION 1.0E-10
int main()
  int loop, n;
  double x, term, sum;
  for(loop = 0; loop <= 100; loop += 10)
    x = (double) loop; // initialization
    sum = 1.0;
    term = 1;
    n = 1;
```

#### Last statements

# Results $\exp(-x)$

#### More Problems

NOTE 1 TODICITIS				
X	$\exp\left(-x\right)$	Series	Number of terms in series	
0.000000	0.10000000E+01	0.10000000E+01	1	
10.000000	0.45399900E-04	0.45399900E-04	44	
20.000000	0.20611536E-08	0.56385075E-08	72	
30.000000	0.93576230E-13	-0.30668111E-04	100	
40.000000	0.42483543E-17	-0.31657319E+01	127	
50.000000	0.19287498E-21	0.11072933E+05	155	
60.000000	0.87565108E-26	-0.33516811E+09	182	
70.000000	0.39754497E-30	-0.32979605E+14	209	
80.000000	0.18048514E-34	0.91805682E+17	237	
90.000000	0.81940126E-39	-0.50516254E+22	264	
100.000000	0.37200760E-43	-0.29137556E+26	291	

#### Most used formula for derivatives

#### 3 point formulae

First derivative  $(f_0 = f(x_0), f_{-h} = f(x_0 - h))$  and  $f_{+h} = f(x_0 + h)$ 

$$\frac{f_h - f_{-h}}{2h} = f_0' + \sum_{i=1}^{\infty} \frac{f_0^{(2j+1)}}{(2j+1)!} h^{2j}.$$

Second derivative

$$\frac{f_h - 2f_0 + f_{-h}}{h^2} = f_0'' + 2\sum_{i=1}^{\infty} \frac{f_0^{(2j+2)}}{(2j+2)!} h^{2j}.$$

$$\epsilon = log_{10} \left( \left| \frac{f''_{\mathsf{computed}} - f''_{\mathsf{exact}}}{f''_{\mathsf{exact}}} \right| \right),$$

$$\epsilon_{\mathsf{tot}} = \epsilon_{\mathsf{approx}} + \epsilon_{\mathsf{ro}}.$$

For the computed second derivative we have

$$f_0'' = \frac{f_h - 2f_0 + f_{-h}}{h^2} - 2\sum_{j=1}^{\infty} \frac{f_0^{(2j+2)}}{(2j+2)!} h^{2j},$$

and the truncation or approximation error goes like

$$\epsilon_{\text{approx}} pprox rac{f_0^{(4)}}{12} h^2.$$

If we were not to worry about loss of precision, we could in principle make h as small as possible. However, due to the computed expression in the above program example

$$f_0'' = \frac{f_h - 2f_0 + f_{-h}}{h^2} = \frac{(f_h - f_0) + (f_{-h} - f_0)}{h^2},$$

we reach fairly quickly a limit for where loss of precision due to the subtraction of two nearly equal numbers becomes crucial. If  $(f_{\pm h} - f_0)$  are very close, we have  $(f_{\pm h} - f_0) \approx \epsilon_M$ , where  $|\epsilon_M| \leq 10^{-7}$  for single and  $|\epsilon_M| \leq 10^{-15}$  for double precision, respectively.

We have then

$$|f_0''| = \left| \frac{(f_h - f_0) + (f_{-h} - f_0)}{h^2} \right| \le \frac{2\epsilon_M}{h^2}.$$

Our total error becomes

$$|\epsilon_{\mathsf{tot}}| \leq \frac{2\epsilon_M}{h^2} + \frac{f_0^{(4)}}{12}h^2.$$

It is then natural to ask which value of h yields the smallest total error. Taking the derivative of  $|\epsilon_{\mathsf{tot}}|$  with respect to h results in

$$h = \left(\frac{24\epsilon_M}{f_0^{(4)}}\right)^{1/4}.$$

With double precision and x = 10 we obtain

$$h \approx 10^{-4}$$
.

Beyond this value, it is essentially the loss of numerical precision which takes over.

Due to the subtractive cancellation in the expression for f'' there is a pronounced detoriation in accuracy as h is made smaller and smaller.

It is instructive in this analysis to rewrite the numerator of the computed derivative as

$$(f_h - f_0) + (f_{-h} - f_0) = (e^{x+h} - e^x) + (e^{x-h} - e^x),$$

as

$$(f_h - f_0) + (f_{-h} - f_0) = e^{x}(e^h + e^{-h} - 2),$$

since it is the difference  $(e^h + e^{-h} - 2)$  which causes the loss of precision.

X	h = 0.01	h = 0.001	h = 0.0001	h = 0.0000001	Exact
0.0	1.000008	1.000000	1.000000	1.010303	1.000000
1.0	2.718304	2.718282	2.718282	2.753353	2.718282
2.0	7.389118	7.389057	7.389056	7.283063	7.389056
3.0	20.085704	20.085539	20.085537	20.250467	20.085537
4.0	54.598605	54.598155	54.598151	54.711789	54.598150
5.0	148.414396	148.413172	148.413161	150.635056	148.413159

The results for $x = 10$ are shown in the Table				
h	$e^h + e^{-h}$	$e^{h} + e^{-h} - 2$		
$10^{-1}$	2.0100083361116070	$1.0008336111607230 \times 10^{-2}$		
$10^{-2}$	2.0001000008333358	$1.0000083333605581 \times 10^{-4}$		
$10^{-3}$	2.0000010000000836	$1.0000000834065048 \times 10^{-6}$		
$10^{-5}$	2.0000000099999999	$1.0000000050247593 \times 10^{-8}$		
$10^{-5}$	2.0000000001000000	$9.9999897251734637 \times 10^{-11}$		
$10^{-6}$	2.0000000000010001	$9.9997787827987850 \times 10^{-13}$		
$10^{-7}$	2.00000000000000098	$9.9920072216264089 \times 10^{-15}$		
$10^{-8}$	2.00000000000000000	0.00000000000000000000000000000000000		
$10^{-9}$	2.00000000000000000	$1.1102230246251565 \times 10^{-16}$		
10 <sup>-10</sup>	2.00000000000000000	0.00000000000000000000000000000000000		

#### Overview of week 35

- ► Thursday: Repetition from last week
- Numerical differentiation
- ► C/C++ programming details, pointers, read/write to/from file
- Friday: Intro to linear Algebra and presentation of project 1.
- ▶ Matrices in C++ and Fortran2008
- ► Gaussian elimination and discussion of project 1.
- Computer-Lab: start project 1. Reading asssignments and preparation for project 1: sections 2.5 and 3.1 for general C++ and Fortran features. Sections 6.1-6.4 (till page 182) are relevant for project 1.

#### Technical Matter in C/C++: Pointers

A pointer specifies where a value resides in the computer's memory (like a house number specifies where a particular family resides on a street).

A pointer points to an address not to a data container of any kind! Simple example declarations:

```
using namespace std; // note use of namespace
int main()
{
    // what are the differences?
    int var;
    cin >> var;
    int *p, q;
    int *s, *t;
    int * a new[var];    // dynamic memory allocation
    delete [] a;
```

#### Technical Matter in C/C++: Pointer example I

```
using namespace std; // note use of namespace
int main()
{
  int var;
  int *p;
  p = &var;
  var = 421;
  printf("Address of integer variable var : %p\n", &var);
  printf("Its value: %d\n", var);
  printf("Value of integer pointer p : %p\n",p);
  printf("The value p points at : %d\n",*p);
  printf("Address of the pointer p : %p\n",&p);
  return 0;
}
```

#### Dissection: Pointer example I

#### Discussion

#### Pointer example II

```
int matr[2];
int *p;
p = &matr[0];
matr[0] = 321;
matr[1] = 322;
printf("\nAddress of matrix element matr[1]: %p",&matr[0]);
printf("\nValue of the matrix element matr[1]; %d",matr[0]);
printf("\nValue of the matrix element matr[2]: %p",&matr[1]);
printf("\nValue of the matrix element matr[2]: %d\n", matr[1]);
printf("\nValue of the pointer p: %p",p);
printf("\nThe value p points to: %d",*p);
printf("\nThe value that (p+1) points to %d\n",*(p+1));
printf("\nAddress of pointer p: %p\n",&p);
```

#### Dissection: Pointer example II

#### Output of Pointer example II

```
Address of the matrix element matr[1]: 0xbfffef70 Value of the matrix element matr[1]; 321 Address of the matrix element matr[2]: 0xbfffef74 Value of the matrix element matr[2]: 322 Value of the pointer: 0xbfffef70 The value pointer points at: 321 The value that (pointer+1) points at: 322 Address of the pointer variable: 0xbfffef6c
```

## File handling; C way cont.

```
#include <fstream>
// input and output file as global variable
ofstream ofile;
ifstream ifile;
```

```
int main(int argc, char* argv[])
  char *outfilename:
  //Read in output file, abort if there are too
  //few command-line arguments
  if( argc <= 1 ){
    cout << "Bad Usage: " << argv[0] <<</pre>
      " read also output file on same line" << endl;
    exit(1);
  else{
    outfilename=argv[1];
  ofile.open(outfilename);
  . . . . .
  ofile.close(); // close output file
```

```
int main(int argc, char* argv[])
  char *infilename;
  // Read in input file, abort if there are too
  // few command-line arguments
  if( argc <= 1 ){
    cout << "Bad Usage: " << argv[0] <<</pre>
      " read also input file on same line" << endl;
    exit(1);
  else{
    infilename=argv[1];
  ifile.open(infilename);
  . . . .
  ifile.close(); // close input file
```

```
const char* filename1 = "myfile";
ifstream ifile(filename1);
string filename2 = filename1 + ".out"
ofstream ofile(filename2); // new output file
ofstream ofile(filename2, ios_base::app); // append

// Read something from the file:
double a; int b; char c[200];
ifile >> a >> b >> c; // skips white space in between

// Can test on success of reading:
if (!(ifile >> a >> b >> c)) ok = 0;
```

### Call by value or reference

C++ allows the programmer to use solely call by reference (note that call by reference is implemented as pointers). To see the difference between C and C++, consider the following simple examples. In C we would write

```
int n: n =8:
    func(&n); /* &n is a pointer to n */
    void func(int *i)
      *i = 10; /* n is changed to 10 */
whereas in C++ we would write
    int n; n =8;
    func(n); // just transfer n itself
    void func(int& i)
      i = 10; // n is changed to 10
```

#### Call by value or reference

The reason why we emphasize the difference between call by value and call by reference is that it allows the programmer to avoid pitfalls like unwanted changes of variables. However, many people feel that this reduces the readability of the code.

### Call by value and reference, F90/95

In Fortran we can use INTENT(IN), INTENT(OUT), INTENT(INOUT) to let the program know which values should or should not be changed.

```
SUBROUTINE coulomb_integral(np,lp,n,l,coulomb)
USE effective_interaction_declar
USE energy_variables
USE wave_functions
IMPLICIT NONE
INTEGER, INTENT(IN) :: n, l, np, lp
INTEGER :: i
REAL(KIND=8), INTENT(INOUT) :: coulomb
REAL(KIND=8) :: z_rel, oscl_r, sum_coulomb
...
```

This hinders unwanted changes and increases readability.

### Object orientation

#### Why object orientation?

- Three main topics: objects, class hierarchies and polymorphism
- ► The aim here is to be to be able to write a more general code which can easily be tailored to new situations.
- ▶ Polymorphism is a term used in software development to describe a variety of techniques employed by programmers to create flexible and reusable software components. The term is Greek and it loosely translates to "many forms". Strategy: try to single out the variables needed to describe a given system and those needed to describe a given solver. !split

### Object orientation

In programming languages, a polymorphic object is an entity, such as a variable or a procedure, that can hold or operate on values of differing types during the program's execution. Because a polymorphic object can operate on a variety of values and types, it can also be used in a variety of programs, sometimes with little or no change by the programmer. The idea of write once, run many, also known as code reusability, is an important characteristic to the programming paradigm known as Object-Oriented Programming (OOP).

OOP describes an approach to programming where a program is viewed as a collection of interacting, but mostly independent software components. These software components are known as objects in OOP and they are typically implemented in a programming language as an entity that encapsulates both data and procedures.

#### Programming classes

In Fortran a vector or matrix start with 1, but it is easy to change a vector so that it starts with zero or even a negative number. If we have a double precision Fortran vector which starts at -10 and ends at 10, we could declare it as REAL(KIND=8) :: vector(-10:10). Similarly, if we want to start at zero and end at 10 we could write REAL(KIND=8) :: vector(0:10). We have also seen that Fortran allows us to write a matrix addition A = B + C as A = B + C. This means that we have overloaded the addition operator so that it translates this operation into two loops and an addition of two matrix elements  $a_{ii} = b_{ii} + c_{ii}$ .

The way the matrix addition is written is very close to the way we express this relation mathematically. The benefit for the programmer is that our code is easier to read. Furthermore, such a way of coding makes it more likely to spot eventual errors as well. In Ansi C and C++ arrays start by default from i=0. Moreover, if we wish to add two matrices we need to explicitly write out the two loops as

```
\begin{array}{lll} & \text{for}(i=0 \ ; \ i < n \ ; \ i++) \ \{ \\ & \text{for}(j=0 \ ; \ j < n \ ; \ j++) \ \{ \\ & \text{a[i][j]=b[i][j]+c[i][j]} \end{array}
```

However, the strength of C++ is the possibility to define new data types, tailored to some particular problem. Via new data types and overloading of operations such as addition and subtraction, we can easily define sets of operations and data types which allow us to write a matrix addition in exactly the same way as we would do in Fortran. We could also change the way we declare a C++ matrix elements  $a_{ij}$ , from a[i][j] to say a(i,j), as we would do in Fortran. Similarly, we could also change the default range from 0: n-1 to 1: n.

To achieve this we need to introduce two important entities in C++ programming, classes and templates.

The function and class declarations are fundamental concepts within C++. Functions are abstractions which encapsulate an algorithm or parts of it and perform specific tasks in a program. We have already met several examples on how to use functions. Classes can be defined as abstractions which encapsulate data and operations on these data. The data can be very complex data structures and the class can contain particular functions which operate on these data. Classes allow therefore for a higher level of abstraction in computing. The elements (or components) of the data type are the class data members, and the procedures are the class member functions.

Classes are user-defined tools used to create multi-purpose software which can be reused by other classes or functions. These user-defined data types contain data (variables) and functions operating on the data.

A simple example is that of a point in two dimensions. The data could be the x and y coordinates of a given point. The functions we define could be simple read and write functions or the possibility to compute the distance between two points.

and  $z = x \cdot y = -7.61 + i12.03$ .

C++ has a class complex in its standard template library (STL). The standard usage in a given function could then look like

// Program to calculate addition and multiplication of two complex num

We proceed by splitting our task in three files.

We define first a header file complex.h which contains the declarations of the class. The header file contains the class declaration (data and functions), declaration of stand-alone functions, and all inlined functions, starting as follows

```
#ifndef Complex_H
#define Complex_H
// various include statements and definitions
#include <iostream> // Standard ANSI-C++ include files
#include <new>
#include ....

class Complex
{...
definition of variables and their character
};
// declarations of various functions used by the class
...
#endif
```

Next we provide a file complex.cpp where the code and algorithms of different functions (except inlined functions) declared within the class are written. The files complex.h and complex.cpp are normally placed in a directory with other classes and libraries we have defined.

Finally, we discuss here an example of a main program which uses this particular class. An example of a program which uses our complex class is given below. In particular we would like our class to perform tasks like declaring complex variables, writing out the real and imaginary part and performing algebraic operations such as adding or multiplying two complex numbers.

We include the header file complex.h and define four different complex variables. These are  $a=0.1+\imath 1.3$ ,  $b=3.0+\imath 0$  (note that if you don't define a value for the imaginary part this is set to zero),  $c=5.0-\imath 2.3$  and d=b. Thereafter we have defined standard algebraic operations and the member functions of the class which allows us to print out the real and imaginary part of a given variable.

```
class Complex
{
private:
    double re, im; // real and imaginary part
public:
    Complex ();
    Complex (double re, double im = 0.0); // Definition of a complex vac
    Complex (const Complex& c); // Usage: Complex c(a);
    Complex& operator= (const Complex& c); // c = a; // equate two const.
```

The class is defined via the statement class Complex. We must first use the key word class, which in turn is followed by the user-defined variable name Complex. The body of the class, data and functions, is encapsulated within the parentheses {...}.

Data and specific functions can be private, which means that they cannot be accessed from outside the class. This means also that access cannot be inherited by other functions outside the class. If we use protected instead of private, then data and functions can be inherited outside the class.

The key word public means that data and functions can be accessed from outside the class. Here we have defined several functions which can be accessed by functions outside the class. The declaration friend means that stand-alone functions can work on privately declared variables of the type (re, im). Data members of a class should be declared as private variables.

The first public function we encounter is a so-called constructor, which tells how we declare a variable of type Complex and how this variable is initialized. We have chose three possibilities in the example above:

A declaration like Complex c; calls the member function Complex() which can have the following implementation

```
Complex:: Complex () { re = im = 0.0; }
```

meaning that it sets the real and imaginary parts to zero. Note the way a member function is defined. The constructor is the first function that is called when an object is instantiated.

Another possibility is

```
Complex:: Complex () {}
```

which means that there is no initialization of the real and imaginary parts. The drawback is that a given compiler can then assign random values to a given variable.

A call like Complex a(0.1,1.3); means that we could call the member function 'Complex(double, double)'as

```
Complex:: Complex (double re_a, double im_a) {
   re = re_a; im = im_a; }
```

The simplest member function are those we defined to extract the real and imaginary part of a variable. Here you have to recall that these are private data, that is they invisible for users of the class. We obtain a copy of these variables by defining the functions

```
double Complex:: Re () const { return re; }} // getting the real part
double Complex:: Im () const { return im; } // and the imaginary pa
```

Note that we have introduced the declaration const. What does it mean? This declaration means that a variabale cannot be changed within a called function.

If we define a variable as const double p=3; and then try to change its value, we will get an error when we compile our program. This means that constant arguments in functions cannot be changed.

```
// const arguments (in functions) cannot be changed:
void myfunc (const Complex& c)
{ c.re = 0.2; /* ILLEGAL!! compiler error... */ }
```

If we declare the function and try to change the value to 0.2, the compiler will complain by sending an error message.

If we define a function to compute the absolute value of complex variable like

```
double Complex:: abs () { return sqrt(re*re + im*im);}
```

without the constant declaration and define thereafter a function myabs as

```
double myabs (const Complex& c)
{ return c.abs(); } // Not ok because c.abs() is not a const func.
```

the compiler would not allow the c.abs() call in myabs since Complex::abs is not a constant member function.

Constant functions cannot change the object's state. To avoid this we declare the function abs as

```
double Complex:: abs () const { return sqrt(re*re + im*im); }
```

C++ (and Fortran) allow for overloading of operators. That means we can define algebraic operations on for example vectors or any arbitrary object. As an example, a vector addition of the type  $\mathbf{c} = \mathbf{a} + \mathbf{b}$  means that we need to write a small part of code with a for-loop over the dimension of the array. We would rather like to write this statement as  $\mathbf{c} = \mathbf{a} + \mathbf{b}$ ; as this makes the code much more readable and close to eventual equations we want to code. To achieve this we need to extend the definition of operators.

Let us study the declarations in our complex class. In our main function we have a statement like d = b;, which means that we call d.operator= (b) and we have defined a so-called assignment operator as a part of the class defined as

```
Complex& Complex:: operator= (const Complex& c)
{
    re = c.re;
    im = c.im;
    return *this;
}
```

With this function, statements like Complex d = b; or Complex d(b); make a new object d, which becomes a copy of b. We can make simple implementations in terms of the assignment

```
Complex:: Complex (const Complex& c)
{ *this = c; }
```

which is a pointer to "this object", \*this is the present object, so \*this = c; means setting the present object equal to c, that is this->operator= (c);

The meaning of the addition operator + for Complex objects is defined in the function Complex operator+ (const Complex& a, const Complex& b); // a The compiler translates c = a + b; into c = operator+ (a, b);. Since this implies the call to function, it brings in an additional overhead. If speed is crucial and this function call is performed inside a loop, then it is more difficult for a given compiler to perform optimizations of a loop.

The solution to this is to inline functions. We discussed inlining in chapter 2 of the lecture notes. Inlining means that the function body is copied directly into the calling code, thus avoiding calling the function. Inlining is enabled by the inline keyword

```
inline Complex operator+ (const Complex& a, const Complex& b)
{ return Complex (a.re + b.re, a.im + b.im); }
```

Inline functions, with complete bodies must be written in the header file complex.h.

```
Consider the case c = a + b; that is,
c.operator= (operator+ (a,b)); If operator+, operator=
and the constructor Complex(r,i) all are inline functions, this
transforms to
```

```
c.re = a.re + b.re;
c.im = a.im + b.im;
```

by the compiler, i.e., no function calls

The stand-alone function operator+ is a friend of the Complex class

Since we do not need to alter the re and im variables, we can get the values by Re() and Im(), and there is no need to be a friend function

```
inline Complex operator+ (const Complex& a, const Complex& b)
{ return Complex (a.Re() + b.Re(), a.Im() + b.Im()); }
```

The multiplication functionality can now be extended to imaginary numbers by the following code

```
inline Complex operator* (const Complex& a, const Complex& b)
{
  return Complex(a.re*b.re - a.im*b.im, a.im*b.re + a.re*b.im);
```

It will be convenient to inline all functions used by this operator.

To inline the complete expression a\*b;, the constructors and operator= must also be inlined. This can be achieved via the following piece of code

```
inline Complex:: Complex () { re = im = 0.0; }
inline Complex:: Complex (double re_, double im_)
{ ... }
inline Complex:: Complex (const Complex& c)
{ ... }
inline Complex:: operator= (const Complex& c)
{ ... }
```

```
// e, c, d are complex
e = c*d;
// first compiler translation:
e.operator= (operator* (c,d));
// result of nested inline functions
// operator=, operator*, Complex(double,double=0):
e.re = c.re*d.re - c.im*d.im;
e.im = c.im*d.re + c.re*d.im;
```

The definitions operator- and operator/ follow the same set up.

Finally, if we wish to write to file or another device a complex number using the simple syntax cout << c;, we obtain this by defining the effect of << for a Complex object as

```
ostream& operator<< (ostream& o, const Complex& c) { o << "(" << c.Re() << "," << c.Im() << ") "; return o;}
```

# Programming classes, templates

What if we wanted to make a class which takes integers or floating point numbers with single precision? A simple way to achieve this is copy and paste our class and replace double with for example int. C++ allows us to do this automatically via the usage of templates, which are the C++ constructs for parameterizing parts of classes. Class templates is a template for producing classes. The declaration consists of the keyword template followed by a list of template arguments enclosed in brackets.

We can therefore make a more general class by rewriting our original example as

```
template < class T >
class Complex
{
private:
    T re, im; // real and imaginary part
public:
    Complex ();
    Complex (T re, T im = 0); // Definition of a complex variable;
    Complex (const Complex& c); // Usage: Complex c(a);
    Complex& operator= (const Complex& c); // c = a; // equate two const
```

We can therefore make a more general class by rewriting our original example as

What it says is that Complex is a parameterized type with T as a parameter and T has to be a type such as double or float. The class complex is now a class template and we would define variables in a code as

```
Complex<double> a(10.0,5.1);
Complex<int> b(1,0);
```

## Programming classes

Member functions of our class are defined by preceding the name of the function with the template keyword. Consider the function we defined as Complex:: Complex (double re\_a, double im\_a). We would rewrite this function as

```
template<class T>
Complex<T>:: Complex (T re_a, T im_a)
{ re = re_a; im = im_a; }
```

The member functions are otherwise defined following ordinary member function definitions.

### Programming classes

### Here follows a very simple first class in the file squared.h

```
// Not all declarations here
// Class to compute the square of a number
template<class T>
class Squared{
  public:
    // Default constructor, not used here
    Squared(){}

    // Overload the function operator()
    T operator()(T x){return x*x;}
};
```

# Programming classes

### and we would use it as

```
#include <iostream>
#include "squared.h"
using namespace std;
int main(){
   Squared<double> s;
   cout << s(3) << endl;</pre>
```

### Unit Testing

Unit Testing is the practice of testing the smallest testable parts, called units, of an application individually and independently to determine if they behave exactly as expected. Unit tests (short code fragments) are usually written such that they can be preformed at any time during the development to continually verify the behavior of the code. In this way, possible bugs will be identified early in the development cycle, making the debugging at later stage much easier.

# Unit Testing, benefits

There are many benefits associated with Unit Testing, such as

- ▶ It increases confidence in changing and maintaining code. Big changes can be made to the code quickly, since the tests will ensure that everything still is working properly.
- Since the code needs to be modular to make Unit Testing possible, the code will be easier to reuse. This improves the code design.
- ▶ Debugging is easier, since when a test fails, only the latest changes need to be debugged.
  - ▶ Different parts of a project can be tested without the need to wait for the other parts to be available.
- ► A unit test can serve as a documentation on the functionality of a unit of the code.

## Simple example of unit test

Look up the guide on how to install unit tests for c++ at course webpage. This is the version with classes.

```
#include <unittest++/UnitTest++.h>
class MyMultiplyClass{
public:
   double multiply(double x, double y) {
        return x * y;
};
TEST(MyMath) {
   MyMultiplyClass my;
   CHECK_EQUAL(56, my.multiply(7,8));
}
int main()
{
   return UnitTest::RunAllTests();
```

# Simple example of unit test

#include <unittest++/UnitTest++.h>

And without classes

```
double multiply(double x, double y) {
     return x * y;
 TEST(MyMath) {
     CHECK_EQUAL(56, multiply(7,8));
 int main()
     return UnitTest::RunAllTests();
For Fortran users, the link at
http://sourceforge.net/projects/fortranxunit/ contains a
similar software for unit testing.
```

# The report: how to write a good scienfitic/technical report

### What should it contain? A typical structure

- An introduction where you explain the aims and rationale for the physics case and what you have done. At the end of the introduction you should give a brief summary of the structure of the report
- ► Theoretical models and technicalities. This is the methods section.
- Results and discussion
- Conclusions and perspectives
- Appendix with extra material
- Bibliography

Keep always a good log of what you do.

#### What should I focus on? Introduction

You don't need to answer all questions in a chronological order. When you write the introduction you could focus on the following aspects

- Motivate the reader, the first part of the introduction gives always a motivation and tries to give the overarching ideas
- What I have done
- ▶ The structure of the report, how it is organized etc

### What should I focus on? Methods sections

- Describe the methods and algorithms
- You need to explain how you implemented the methods and also say something about the structure of your algorithm and present some parts of your code
- ➤ You should plug in some calculations to demonstrate your code, such as selected runs used to validate and verify your results. The latter is extremely important!! A reader needs to understand that your code reproduces selected benchmarks and reproduces previous results, either numerical and/or well-known closed form expressions.

#### What should I focus on? Results

- Present your results
- Give a critical discussion of your work and place it in the correct context.
- Relate your work to other calculations/studies
- An eventual reader should be able to reproduce your calculations if she/he wants to do so. All input variables should be properly explained.
- Make sure that figures and tables should contain enough information in their captions, axis labels etc so that an eventual reader can gain a first impression of your work by studying figures and tables only.

### What should I focus on? Conclusions

- State your main findings and interpretations
- ▶ Try as far as possible to present perspectives for future work
- Try to discuss the pros and cons of the methods and possible improvements

#### What should I focus on? additional material

- Additional calculations used to validate the codes
- ▶ Selected calculations, these can be listed with few comments
- Listing of the code if you feel this is necessary

You can consider moving parts of the material from the methods section to the appendix. You can also place additional material on your webpage.

#### What should I focus on? References

- Give always references to material you base your work on, either scientific articles/reports or books.
- ▶ Refer to articles as: name(s) of author(s), journal, volume (boldfaced), page and year in parenthesis.
- Refer to books as: name(s) of author(s), title of book, publisher, place and year, eventual page numbers