## Computational Mathematics Lecture 1

Patrick E. Farrell

University of Oxford

### Section 1

Computational mathematics by example

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William Herschel, 1738-1822

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Astronomers had a theory for predicting the spacing between the planets, the Titius-Bode law:

$$d(n) = 0.4 + 0.3 \times 2^n, \quad n = -\infty, 0, 1, \dots$$



William Herschel, 1738-1822

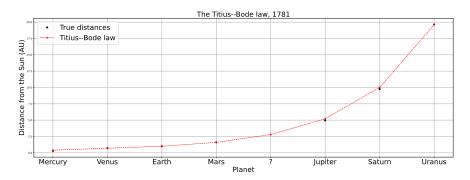
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On 1 January 1801, Giuseppe Piazzi discovered Ceres, almost exactly where the Titius-Bode law predicted!

But he could only observe it for 41 days before it was lost behind the Sun—not long enough to compute its orbit. How could it be found again?



Giuseppe Piazzi, 1746-1826



Carl Friedrich Gauss, 1777-1855

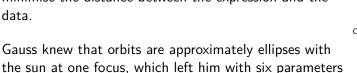
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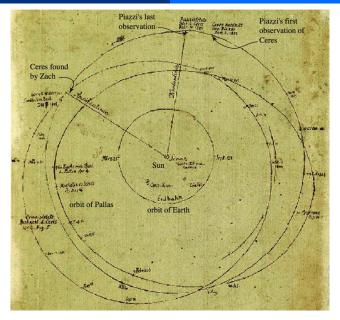
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Carl Friedrich Gauss, 1777-1855

Gauss knew that orbits are approximately ellipses with the sun at one focus, which left him with six parameters to estimate from Piazzi's 22 observations.

Gauss calculated for weeks on end; he published his prediction for Ceres' location in September 1801. On December 7, astronomers found Ceres again, almost exactly where he predicted.



Annotated sketch from Gauss' papers. Courtesy Georg-August-Universität Göttingen.

### Subsection 2

## Euler's Conjecture

It is possible to find two squares that sum to a square:

$$3^2 + 4^2 = 5^2,$$

and three cubes that sum to a cube:

$$3^3 + 4^3 + 5^3 = 6^3.$$



Leonhard Euler, 1707-1783

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But Euler could not find natural solutions to

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So, in 1769, Euler conjectured that

$$\exists k > 1, n > 1, a_1, \dots, a_n, b \in \mathbb{N}_+ : a_1^k + a_2^k + \dots + a_n^k = b^k \implies k \le n.$$

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In 1966, Leon J. Lander and Thomas R. Parkin discovered a counterexample:

### COUNTEREXAMPLE TO EULER'S CONJECTURE ON SUMS OF LIKE POWERS

BY L. J. LANDER AND T. R. PARKIN

Communicated by J. D. Swift, June 27, 1966

A direct search on the CDC 6600 yielded

$$27^5 + 84^5 + 110^5 + 133^5 = 144^5$$

as the smallest instance in which four fifth powers sum to a fifth power. This is a counterexample to a conjecture by Euler [1] that at least n nth powers are required to sum to an nth power, n > 2.

#### REFERENCE

1. L. E. Dickson, History of the theory of numbers, Vol. 2, Chelsea, New York, 1952, p. 648.

### Subsection 3

### The Four-Colour Theorem

In 1852, Francis Guthrie was colouring a map of the counties of England. He noticed he could satisfy the constraint that counties sharing a border were coloured differently with only four colours.



Francis Guthrie, 1831-1899

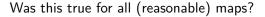
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Was this true for all (reasonable) maps?



Francis Guthrie, 1831-1899

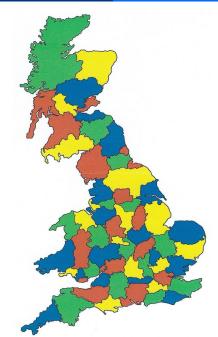
In 1852, Francis Guthrie was colouring a map of the counties of England. He noticed he could satisfy the constraint that counties sharing a border were coloured differently with only four colours.



This is equivalent to colouring a *graph*: each region is a vertex, and adjacent regions are connected with an edge.



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He then proved that for each element of the unavoidable set, a graph containing that fragment could be coloured with four colours. Done!



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While the proof was wrong, the basic strategy was right.



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Kenneth Appel, 1932-2013



Wolfgang Haken, 1928–2022

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With a computer, they found an unavoidable set with 1834 cases, and programmed it to mechanically check that in each case the graph can be coloured with four colours.

The proof took over 1000 hours of computer time.



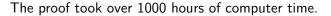
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Since then, many theorems have been proven with computer-assisted proofs, among them

- Kepler's conjecture on packing cannonballs;
- Keller's conjecture on tiling Euclidean space;
- Feigenbaum's conjecture in dynamical systems.



Kenneth Appel, 1932-2013



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### Subsection 4

# Crystallography

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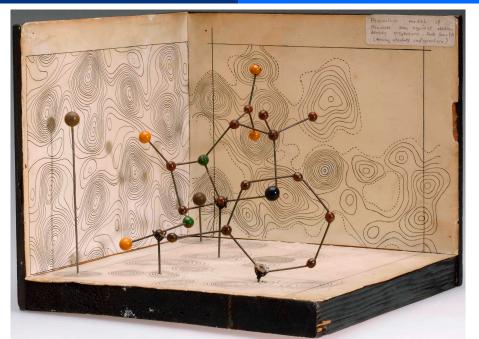
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The calculations involved least squares, Fourier analysis, and extensive use of group theory.



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In 1964 she won the Nobel Prize in Chemistry for her identification of penicillin and vitamin  $B_{12}$ .



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These problems might be in pure mathematics (Euler's Conjecture in number theory, the Four-Colour Theorem in graph theory), or in applied mathematics (Gauss' discovery of the orbit of Ceres, Hodgkin's work in crystallography).

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Computational mathematics is an ancient subject; it did not begin with the invention of computers. Instead, computers were invented to speed up computational mathematics!

### In 1985, Paul Halmos wrote

When you try to prove a theorem, you don't just list the hypotheses, and then start to reason. What you do is trial and error, experimentation, guesswork. You want to find out what the facts are.



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## As G. H. Hardy wrote,

The theory of numbers, more than any other branch of mathematics, began by being an experimental science. Its most famous theorems have all been conjectured, sometimes a hundred years or more before they were proved; and they have been suggested by the evidence of a mass of computations.



Paul Halmos, 1916-2006



Godfrey Hardy, 1877–1947

# Section 2

# **Practicalities**

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- to solve mathematical problems with computers;
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On a pragmatic point, a very large fraction of Oxford mathematics graduates will pursue careers where programming is useful, if not essential. These include

- mathematical research;
- scientific research;
- quantitative finance;

- teaching;
- data science:
- management consulting.





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Python was invented by Guido van Rossum in 1989.



Guido van Rossum, 1956-

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Weeks	Chapters to read	Optional chapters	Problem sheet to start
1–2 MT	1–3	-	-
3–4 MT	4–5	-	l.1
5–6 MT	7	8	1.2
7–8 MT	10	-	1.3
1–2 HT	12–13	-	1.4

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There are four two-hour demonstration sessions for this course; three this term, and one next term. In demonstration session n you start problem sheet n, and return it for marking in demonstration session n+1.

#### **Practicalities**

None of the work this term is formally assessed. Work collaboratively with your friends and ask your tutors for advice.

This term's work forms the basis for your projects in Hilary and Trinity terms. Three projects will be announced; you choose two of them. The projects are done in the same manner as the problem sheets for this term, but with more emphasis on interweaving coding, mathematics, and discussion.

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These submissions must be your own unaided work. No Al.

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(Optionally) bring your laptops along to the next lecture to follow along with installation.

Practicalities

ightarrow the Lander–Parkin counterexample

# Computational Mathematics Lecture 2

Patrick E. Farrell

University of Oxford

## How to submit problem sheets

### A brief tour of the course

Week 3-4 MT

Week 5-6 MT

Week 7-8 MT

Week 1-2 HT

### Software installation

## Section 1

How to submit problem sheets

How to submit problem sheets

ightarrow using publish.py

#### Section 2

#### A brief tour of the course

#### Week 3-4 MT teaches

- ▶ arithmetic,
- ► conditionals,
- ▶ iteration.

Week 3–4 MT ends with a code for *bisection*, an algorithm for finding  $x^\star$  such that  $f(x^\star)=0$ .

It is based on the following theorem, a corollary of the Intermediate Value Theorem.

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## Bolzano's theorem (1817)

If  $f:[a,b]\to\mathbb{R}$  is continuous with f(a)f(b)<0, then there exists  $x^\star\in(a,b)$  with  $f(x^\star)=0$ .

The statement f(a)f(b) < 0 is just a fancy way of saying f(a) and f(b) have opposite signs.



Bernhard Bolzano, 1781-1848

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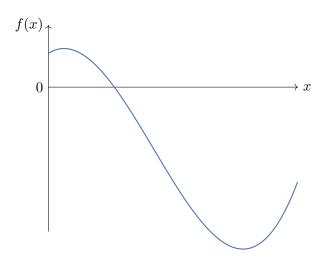
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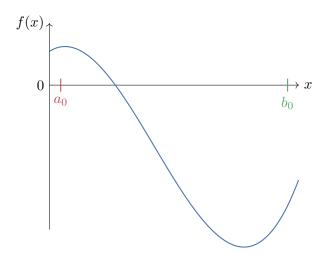


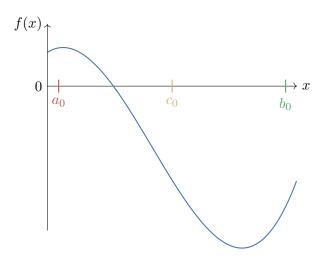
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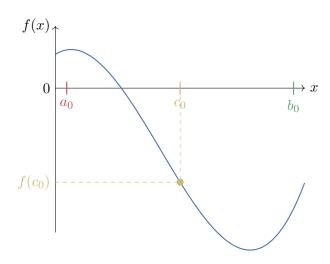
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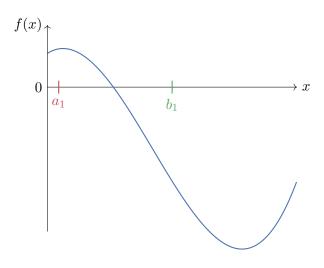
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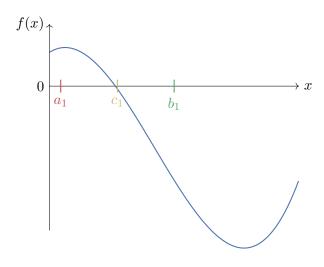


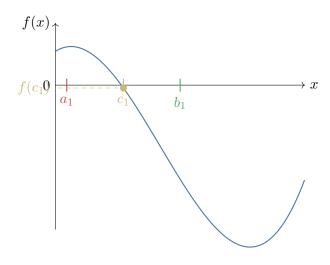


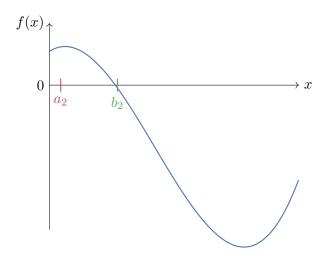


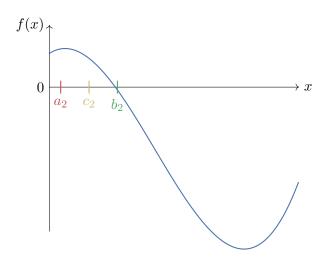


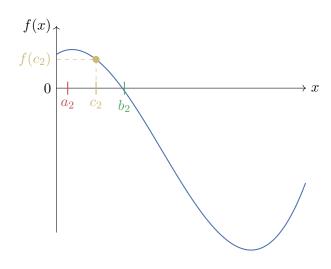


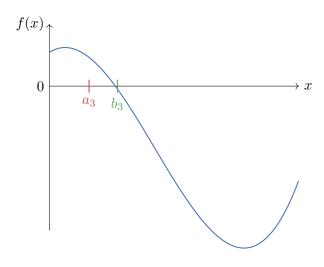


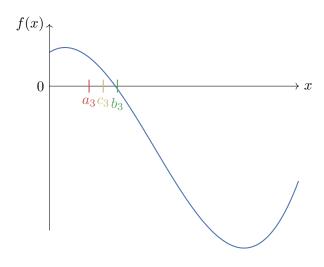


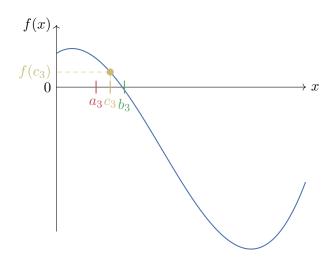


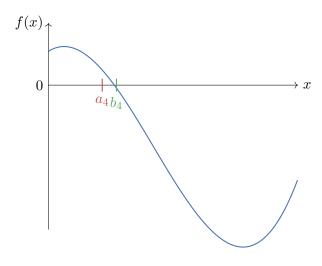












ightarrow bisection.py

How can we use this to compute an approximation to  $\pi$ ?

#### Week 5-6 MT teaches

- ▶ lists, tuples
- ▶ dictionaries, sets,
- ▶ functions,
- ▶ plotting.

Week 5-6 MT ends with a naïve code for primality testing, checking whether a given integer is prime or not.

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$$ightarrow$$
 isprime.py

Can we make isprime (9999991111111) faster?

Week 7–8 MT introduces *symbolic computing*, the use of computers to automate the kind of mathematical manipulations you do on paper.

This includes expanding and simplifying expressions, differentiating and integrating functions, calculating limits, and solving equations.

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# In 1843, describing Charles Babbage's Analytical Engine, Ada Lovelace wrote

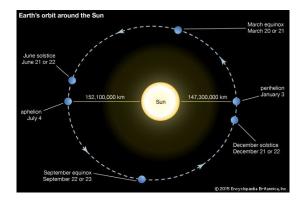
Many persons who are not conversant with mathematical studies imagine that because the business of the engine is to give its results in numerical notation, the nature of its processes must consequently be arithmetical and numerical rather than algebraic and analytical. This is an error. The engine can arrange and combine its numerical quantities exactly as if they were letters or any other general symbols; and in fact it might bring out its results in algebraic notation were provisions made accordingly.



Ada Lovelace, 1815-1852

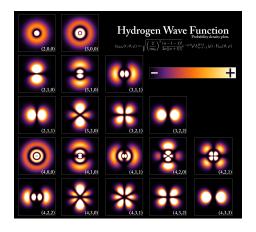
In the associated problem sheet, we use symbolic computing to

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In the associated problem sheet, we use symbolic computing to

- ▶ derive the equations for the orbit of the Earth around the Sun;
- explore the wave function of the hydrogen atom.

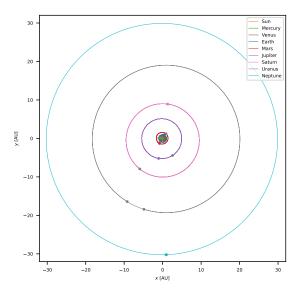


Week 1–2 HT introduces *numerical* computing, a powerful expansion of the conception of what it means to solve a mathematical problem.

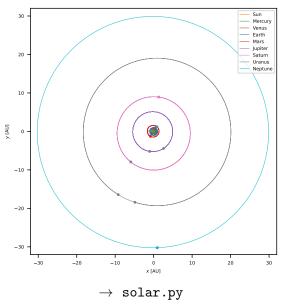
#### We will study

- numerical linear algebra,
- numerical quadrature of integrals,
- ▶ least squares and curve-fitting,
- numerical solution of ODE initial value problems.

Week  $1-2\ HT$  ends with a code for numerically simulating the solar system.



Week 1–2 HT ends with a code for numerically simulating the solar system.



#### Section 3

# Software installation

 $\rightarrow$  Windows