

Theory of Computation CS6160

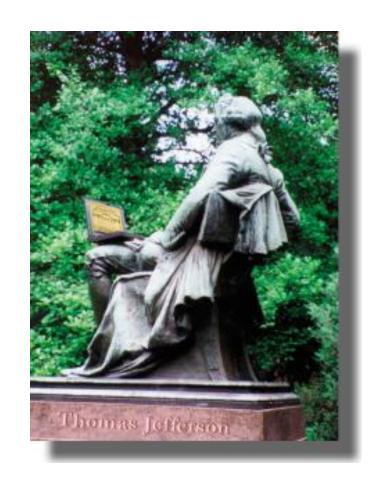
Gabriel Robins

Department of

Computer Science

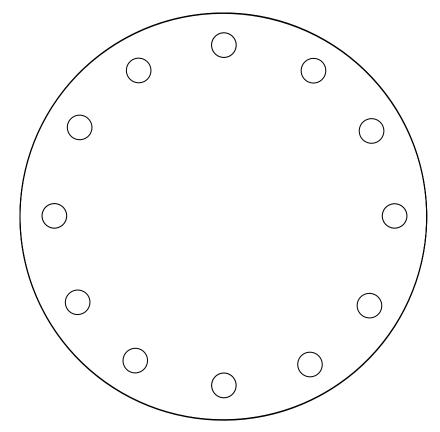
University of Virginia

www.cs.virginia.edu/robins/theory_grad



Problem: Can 5 test tubes be spun simultaneously in a 12-hole centrifuge in a balanced way?



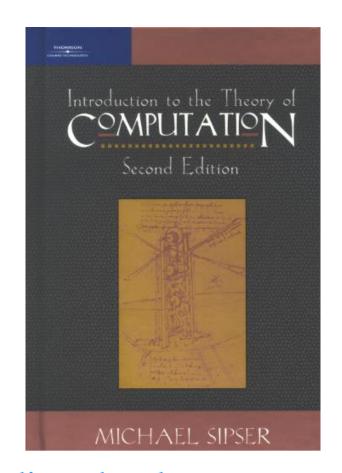


- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

Theory of Computation (CS6160) - Textbook

Textbook:

Introduction to the Theory of Computation, by Michael Sipser (MIT), 2nd Edition, 2005



Good Articles / videos:

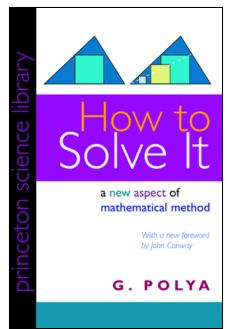
www.cs.virginia.edu/~robins/CS_readings.html

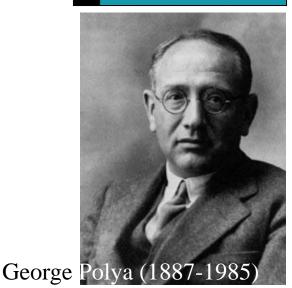
Theory of Computation (CS6160)

Required reading:

How to Solve It, by George Polya (MIT), Princeton University Press, 1945

A classic on problem solving





Theory of Computation (CS6160)

Good algorithms textbook:

Introduction to Algorithms by Cormen et al (MIT) Third Edition, 2009



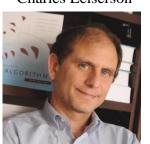
Thomas Cormen



Ronald Rivest

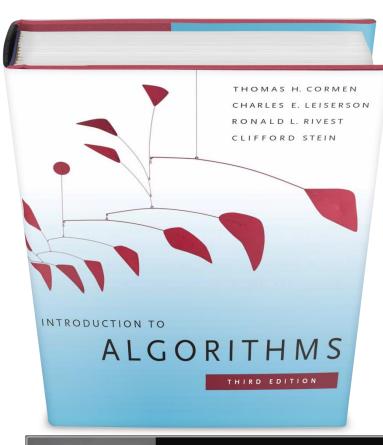


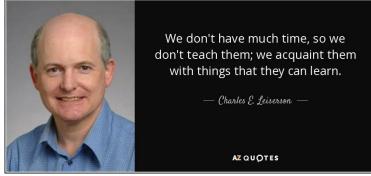
Charles Leiserson



Clifford Stein







computer science

Introduction to Algorithms

Thomas H. Cormen, Charles E. Leiserson, Ronald L. Rivest, and Clifford Stein Third Edition

Some books on algorithms are rigorous but incomplete; others cover masses of material but lack rigor. *Introduction to Algorithms* uniquely combines rigor and comprehensiveness. The book covers a broad range of algorithms in depth, yet makes their design and analysis accessible to all levels of readers. Each chapter is relatively self-contained and can be used as a unit of study. The algorithms are described in English and in a pseudocode designed to be readable by anyone who has done a little programming. The explanations have been kept elementary without sacrificing depth of coverage or mathematical rigor.

The first edition became a widely used text in universities worldwide as well as the standard reference for professionals. The second edition featured new chapters on the role of algorithms, probabilistic analysis and randomized algorithms, and linear programming. The third edition has been revised and updated throughout. It includes two completely new chapters, on van Emde Boas trees and multithreaded algorithms, and substantial additions to the chapter on recurrences (now called "Divide-and-Conquer"). It features improved treatment of dynamic programming and greedy algorithms and a new notion of edge-based flow in the material on flow networks. Many new exercises and problems have been added for this edition.

As of the third edition, this textbook is published exclusively by the MIT Press.

Thomas H. Cormen is Professor of Computer Science and former Director of the Institute for Writing and Rhetoric at Dartmouth College. Charles E. Leiserson is Professor of Computer Science and Engineering at MIT. Ronald L. Rivest is Andrew and Erna Viterbi Professor of Electrical Engineering and Computer Science at MIT. Chifford Stein is Professor of Industrial Engineering and Operations Research at Columbia University.

"In light of the explosive growth in the amount of data and the diversity of computing applications, efficient algorithms are needed now more than ever. This beautifully written, thoughtfully organized book is the definitive introductory book on the design and analysis of algorithms. The first half offers an effective method to teach and study algorithms; the second half then engages more advanced readers and curious students with compelling material on both the possibilities and the challenges in this fascinating field."

-Shang-Hua Teng, University of Southern California

"Introduction to Algorithms, the 'bible' of the field, is a comprehensive textbook covering the full spectrum of modern algorithms: from the fastest algorithms and data structures to polynomial-time algorithms for seemingly intractable problems, from classical algorithms in graph theory to special algorithms for string matching, computational geometry, and number theory. The revised third edition notably adds a chapter on van Emde Boas trees, one of the most useful data structures, and on multithreaded algorithms, a topic of increasing importance."

—Daniel Spielman, Department of Computer Science, Yale University

"As an educator and researcher in the field of algorithms for over two decades, I can unequivocally say that the Cormen book is the best textbook that I have ever seen on this subject. It offers an incisive, encyclopedic, and modern treatment of algorithms, and our department will continue to use it for teaching at both the graduate and undergraduate levels, as well as a reliable research reference."

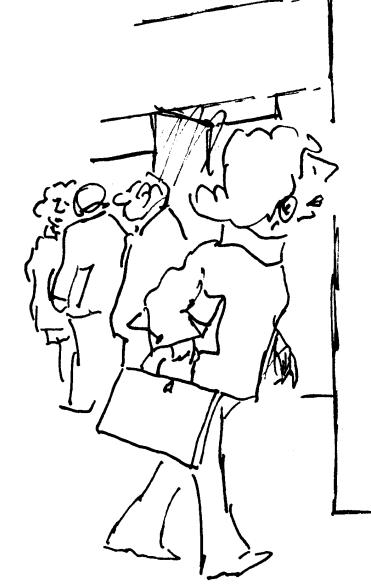
-Gabriel Robins, Department of Computer Science, University of Virginia

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The MIT Press

Massachusetts Institute of Technology Cambridge, Massachusetts 02142 http://mitpress.mit.edu 978-0-262-03384-8





SCHOOL OF OLOGY

ANTHROP 301

ARCHAE 126

BACTERI 109

BI 326

ENTOM 217

ETYM 221

GE 204

PALEONT 113

PHYSI 312

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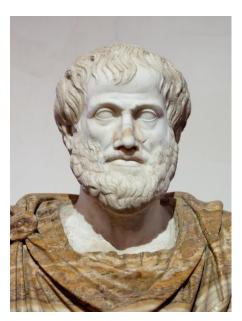
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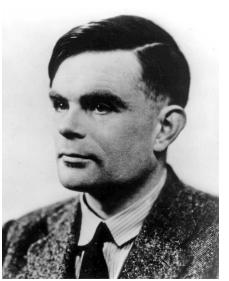
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Theory of Computation (CS6160) - Syllabus

A brief history of computing:

- Aristotle, Euclid, Archimedes, Eratosthenes
- Abu Ali al-Hasan ibn al-Haytham
- Fibonacci, Descartes, Fermat, Pascal
- Newton, Euler, Gauss, Hamilton
- Boole, De Morgan, Babbage, Ada Agusta
- Venn, Carroll, Cantor, Hilbert, Russell
- Hardy, Ramanujan, Ramsey
- Godel, Church, Turing, von Neumann
- Shannon, Kleene, Chomsky, Hoare
- McCarthy, Erdos, Knuth, Backus, Dijkstra



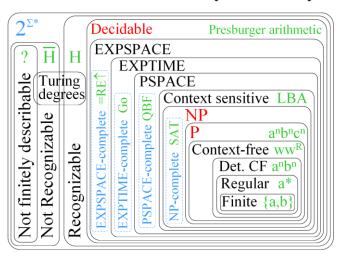


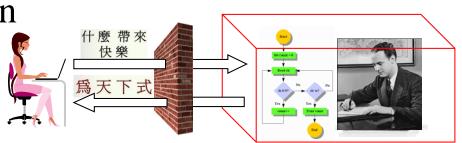
Theory of Computation Syllabus (continued)

Beyond the Chomsky Hierarchy:

- Review of automata & languages
- Two-way and infinite automata
- Generalized finite automata
- State set minimization
- Deterministic context-free languages
- Counter automata and languages
- Ambiguity in grammars and languages
- Nondeterminism & alternation
- Context-sensitive grammars
- The Turing Test

The Extended Chomsky Hierarchy

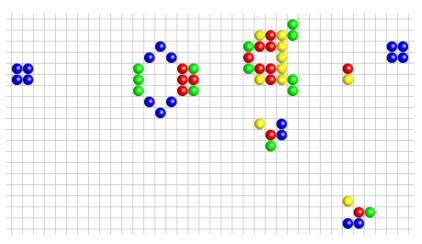


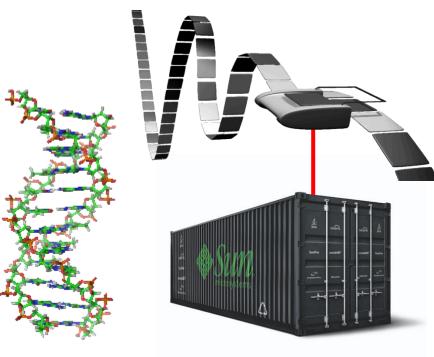


Theory of Computation Syllabus (continued)

Advanced Undecidability:

- Context-free intersections
- Post correspondence problem
- Linear-bounded automata
- Turing reducibilities
- Computational universality
- Conway's Game of Life
- Busy beaver problem
- The recursion theorem
- Oracles and relativizations
- Non-recognizability
- Turing degrees
- Randomness and entropy

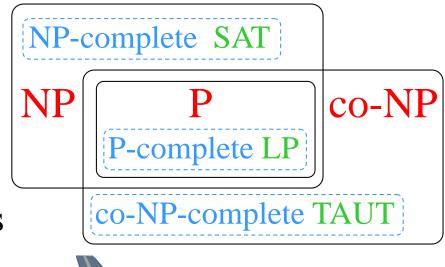




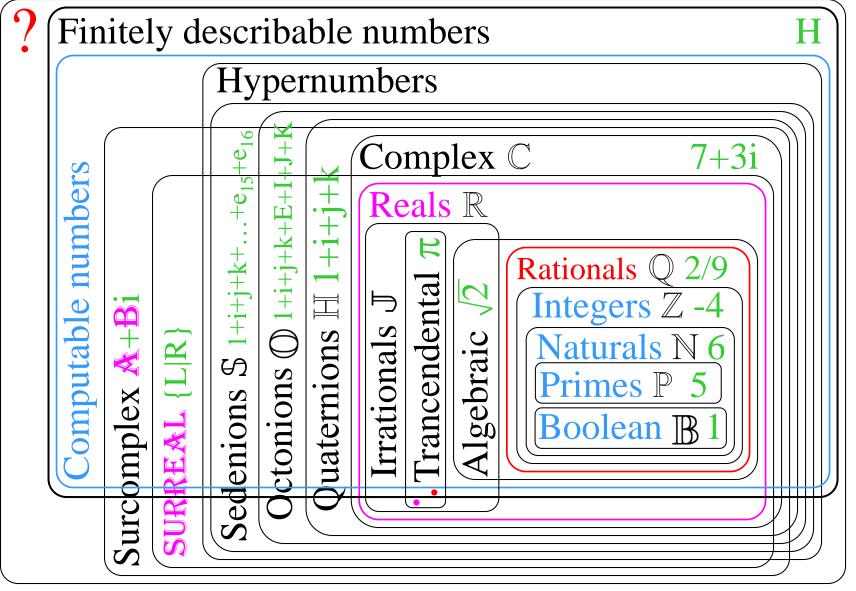
Theory of Computation Syllabus (continued)

Advanced complexity theory:

- Time and space complexity classes
- Complexity hierarchies / separations
- Density and gap theorems
- NP-completeness reloaded
- Problem reductions
- Graph colorability
- Set cover problem
- Knapsacks and subset sums
- Savitch's Theorem
- PSPACE completeness
- NL completeness
- Approximation algorithms
- Zero-knowledge proofs



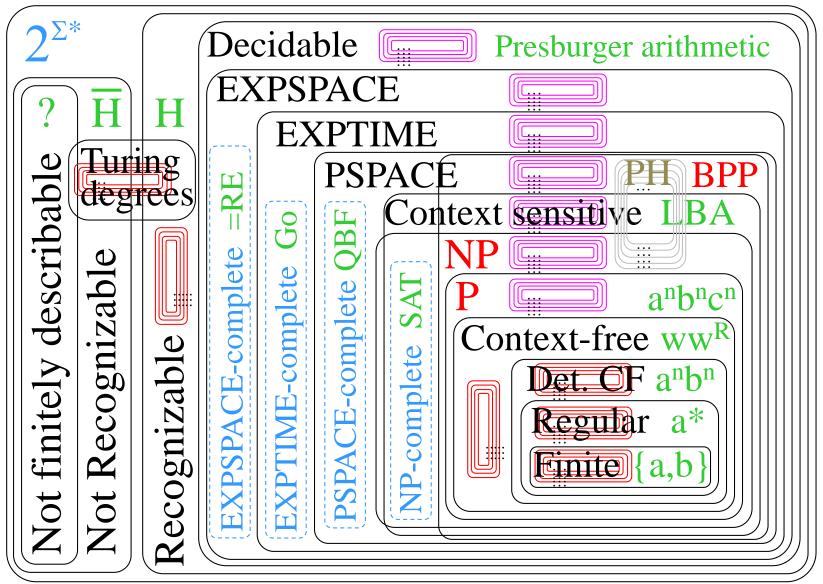
Generalized Numbers



Theorem: some real numbers are not finitely describable!

Theorem: some finitely describable real numbers are not computable!

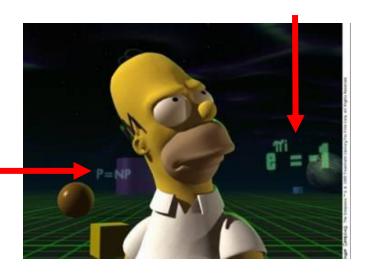
The Extended Chomsky Hierarchy



Dense infinite time & space complexity hierarchies (Other infinite complexity & descriptive hierarchies (

Overarching Philosophy

- Focus on the "big picture" & "scientific method"
- Emphasis on problem solving & creativity
- Discuss applications & practice
- A primary objective: have fun!







Prerequisites

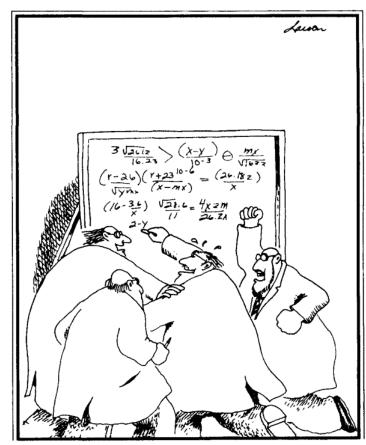
- Some discrete math & algorithms knowledge
- Ideally, should have taken CS2102
- Course will "bootstrap"
 (albeit quickly) from first principles
- Critical: Tenacity, patience



Course Organization

- Exams: probably take home
 - Decide by vote
 - Flexible exam schedule
- Problem sets:
 - Lots of problem solving
 - Work in groups! (max size 6 people)
 - Not formally graded
 - Most exam questions will come from these sets!
- Homeworks:
 - Will come from problem sets
 - Formally graded
- Readings: papers / videos / books
- Extra credit problems
 - In class & take-home
 - Find mistakes in slides, handouts, etc.
- Course materials posted on Web site

www.cs.virginia.edu/robins/theory_grad



"Go for it, Sidney! You've got it! You've got it! Good hands! Don't choke!"

Grading Scheme

•	Attendance	10%
		_ , ,

•	Homeworks	20%
		— • / • /

•	Readings	20%

- Midterm 25%
- Final 25%
- Extra credit 10%

Total: 110% +

Best strategy:

- Solve lots of problems!
- Do lots of readings / EC!



"Mr. Osborne, may I be excused? My brain is full."

• "Ninety percent of success is just showing up." – Woody Allen

Cheating Policy

- Cheating / plagiarism is strictly prohibited
- Serious penalties for violators
- Please review the UVa Honor Code
- Examples of Cheating / plagiarism:
 - Copying of solutions from others / Web
 - Sharing of solutions with others / Web
 - Cutting-and-pasting from other people / Ne
 - Copying article/book/m vie reviews from people / Web
 - Other people / Web solving entire problems for you
 - Providing other people Web with verbatim folutions
 - Submitting answers that yo don't under and!
 - This list is not exhaustive!

- Midway through the exam, Allen pulls out a bigger brain.
- We have automated cheating / plagiarism detection tools!
- We encourage collaborations / brainstorming
- Lets keep it positive (and lets not play "gotcha")

Contact Information

Professor Gabriel Robins

Office: 406 Rice Hall

Phone: (434) 982-2207

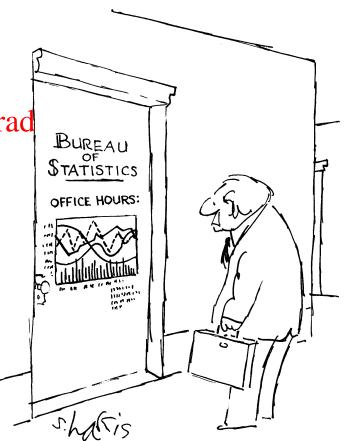
Email: robins@cs.virginia.edu

Web: www.cs.virginia.edu/robins

www.cs.virginia.edu/robins/theory_grad

Office hours: right after class

- Any other time
- By email (preferred)
- By appointment
- Q&A blog posted on class Web site



Course Readings

www.cs.virginia.edu/robins/CS_readings.html

Goal: broad exposure to lots of cool ideas & technologies!

- Required: total of at least 36 items over the semester
- Diversity: minimums in each of 3 categories:
 - 1. Minimum of 15 videos
 - 2. Minimum of 15 papers / Web sites
 - 3. Minimum of 6 books
- More than 36 total is even better! (extra credit)
- Some required items in each category
 - o Remaining "elective" items should be a diverse mix
- Submissions form: www.cs.virginia.edu/robins/theory_homework_grad

Required Readings

www.cs.virginia.edu/robins/CS_readings.html

- Required videos:
 - Last Lecture, Randy Pausch, 2007
 - Time Management, Randy Pausch, 2007
 - Powers of Ten, Charles and Ray Eames, 1977























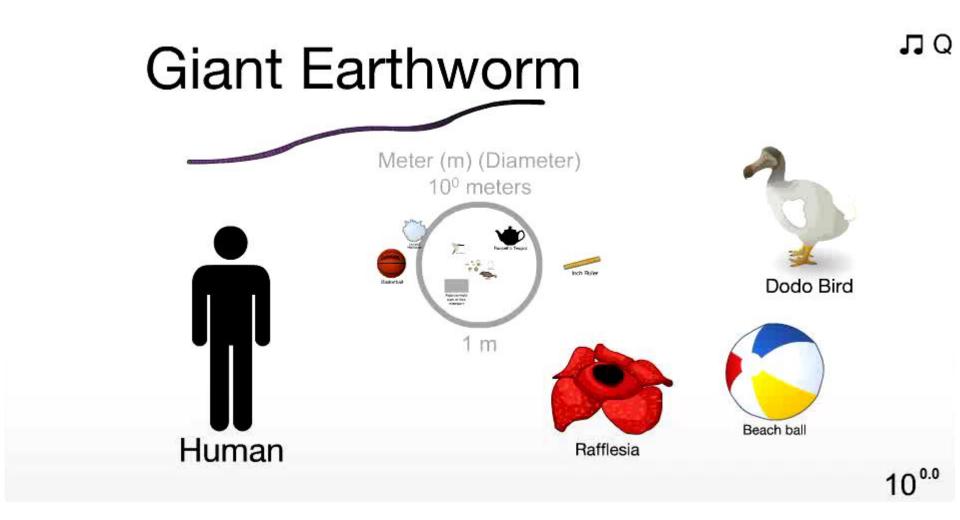






Required Reading

• "Scale of the Universe", Cary and Michael Huang, 2012

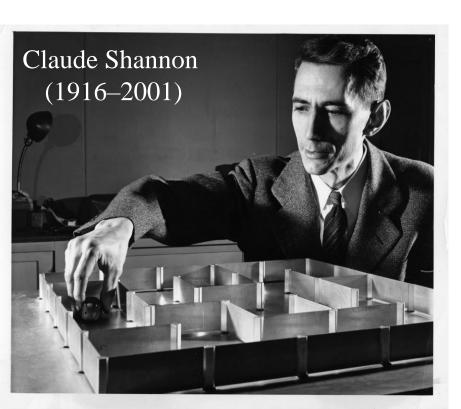


• 10^{-24} to 10^{26} meters \Rightarrow 50 orders of magnitude!

Required Readings

www.cs.virginia.edu/robins/CS_readings.html

- More required videos:
 - Claude Shannon Father of the Information Age, UCTV
 - The Pattern Behind Self-Deception, Michael Shermer, 2010





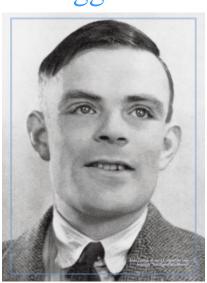
Required Readings

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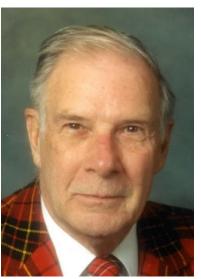
- Required articles:
 - Decoding an Ancient Computer, Freeth, 2009
 - Alan Turing's Forgotten Ideas, Copeland and Proudfoot, 1999
 - You and Your Research, Richard Hamming, 1986
 - Who Can Name the Bigger Number, Scott Aaronson, 1999



Antikythera computer, 200BC



Alan Turing



Richard Hamming Scott Aaronson



"BENEDICT CUMBERBATCH IS OUTSTANDING"

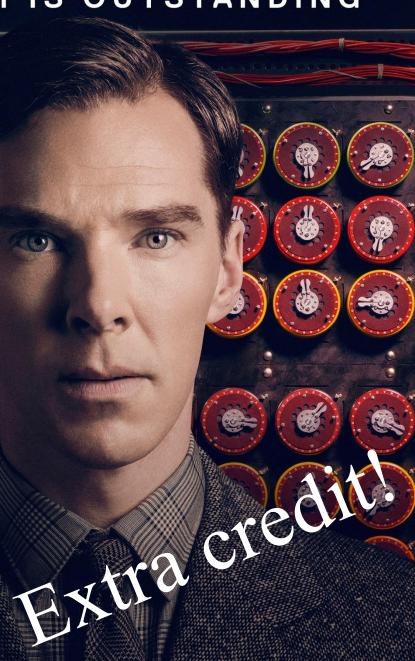


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Basic Concepts and Notation

Required reading

Gabriel Robins

"When I use a word," Humpty Dumpty said, in a rather scornful tone, "it means just what I choose it to mean -- neither more nor less."

A <u>set</u> is formally an undefined term, but intuitively it is a (possibly empty) collection of arbitrary objects. A set is usually denoted by curly braces and some (optional) restrictions. Examples of sets are $\{1,2,3\}$, $\{\text{hi, there}\}$, and $\{k \mid k \text{ is a perfect square}\}$. The symbol \in denotes set <u>membership</u>, while the symbol \notin denotes set <u>non-membership</u>; for example, $7 \in \{p \mid p \text{ prime}\}$ states that 7 is a prime number, while $q \notin \{0,2,4,6,...\}$ states that q is not an even number. Some <u>common sets</u> are denoted by special notation:

The natural numbers: $\mathbb{N} = \{1,2,3,...\}$

The <u>integers</u>: $\mathbb{Z} = \{...,-3,-2,-1,0,1,2,3,...\}$

The <u>rational numbers</u>: $\mathbb{Q} = \{ \frac{a}{b} \mid a, b \in \mathbb{Z}, b \neq 0 \}$

The <u>real numbers</u>: $\mathbb{R} = \{x \mid x \text{ is a real number}\}\$

The <u>empty set</u>: $\emptyset = \{\}$

DHANNES KEPLER'S UPHILL BATTLE



Discrete Math Review Slides

Symbolic Logic

Def: proposition - statement either true (T) or false (F)

Ex: 1 + 1 = 22 + 2 = 3

3 < 7

x + 4 = 5

"today is Monday"

Boolean Functions

- "and"
- "not"
- "nand

- "equivalence"

Logical Implication

"implies"

Truth table:



 $1 < x < y \Rightarrow x^3 < y^3$

"today is Sunday" ⇒ 1+1=3

Logical Equivalence

"biconditional"

"if and only if" ("iff") "necessary and sufficient" "logically equivalent" =

Truth table:

p	q	p⇔q
T	Т	T
T	F	F
F	Т	F
12	17	T

Ex: $p \Leftrightarrow p$

 $[(x=0) \lor (v=0)] \Leftrightarrow (xv=0)$ $min(x,y)=max(x,y) \Leftrightarrow x=y$

Predicates

Def:predicate - a function or formula involving some variables

Ex: let P(x) = "x > 3"x is the variable "x>3" is the predicate

P(5)

P(1)

Ex: $Q(x,y,z) = "x^2+y^2-z^2"$ Q(2,3,4)

O(3,4.5)

 $\forall x \exists y \ y \ge x$

 $\exists x \quad x \leq x - 1$ Combinations:

Quantifiers

Universal: "for all"

Ex: $\forall x \ x < x + 1$

F.x: $\exists x \ x = x^2$

 $\Leftrightarrow P(x_1) \wedge P(x_2) \wedge P(x_3) \wedge ...$

 $\forall x \ x \leq x^3$

Existential: "there exists" 3

 $\Leftrightarrow P(x_1) \vee P(x_2) \vee P(x_3) \vee ...$

 $\forall x P(x)$

 $\exists x P(x)$

Sets

Def: set - an unordered collection of elements

Venn Dogr

Def: two sets are equal iff they contain the same elements

Ex: $\{1, 2, 3\} = \{2, 3, 1\}$ $\{0\} \neq \{1\}$ ${3,5} = {3,5,3,3,5}$

Common Sets

 $N = \{1, 2, 3, 4, ...\}$ Naturals:

 $Z = \{..., -2, -1, 0, 1, 2,...\}$ Integers:

 $Q = \{ {a \atop b} \mid a,b \in \mathbb{Z}, b \neq 0 \}$ Rationals:

 $\Re - \{x \mid x \text{ a real } \#\}$ Reals: $\emptyset - \{\}$

Empty set:

Z⁺ = non-negative integers

97 = non-positive reals, etc.

Subsets

Subset notation: $S \subset T \Leftrightarrow (x \in S \Rightarrow x \in T)$



Proper subset:

 $S \subset T \Leftrightarrow ((S \subset T) \land (S \neq T))$ $S=T \Leftrightarrow ((T \subseteq S) \land (S \subseteq T))$

 $\forall S \ \emptyset \subset S$

 $\forall S \ S \subset S$

Union:

 $S \cup T = \{x \mid x \in S \lor x \in T\}$

Intersection:

 $S \cap T = \{x \mid x \in S \land x \in T\}$



- · Universal set: U (everything)
- · Set complement: S' or \$\bar{S}\$ $S' = \{x \mid x \notin S\} = U - S$



Disjoint sets:



 $S - T = S \cap T$

 $S - S = \emptyset$

DeMorgan's Laws

 $(S \cup T)' = S' \cap T'$



 $(S \cap T)' = S' \cup T'$



Boolean logic version:

 $(X \wedge Y)' = X' \vee Y'$ $(X \lor Y)' = X' \land Y'$

Function Types

 One-to-one function: "1-1" $a,b \in S \land a \neq b \Rightarrow f(a) \neq f(b)$

Ex: $f: \Re \rightarrow \Re$, f(x)=2x is 1-1 $g(x)-x^2$ is not 1-1

Onto function:

 $\forall t \in T \exists s \in S \ni f(s) = t$

Ex: $f: Z \rightarrow Z$, f(x)=13-x is onto $g(x)-x^2$ is not onto

1-to-1 Correspondence

 1-to-1 correspondence: f:S↔T f is both 1-1 and onto



Ex: $f: \Re \leftrightarrow \Re \ni f(x) = x$ (identity)

h: N \leftrightarrow Z \ni h(x)= $\frac{x-1}{2}$, x odd, , x even.

Generalized Cardinality

· S is at least as large as T: $|S \ge T| \Rightarrow \exists f: S \rightarrow T, f \text{ onto}$

i.e., "S covers T"

Ex: $r: \mathbb{R} \rightarrow \mathbb{Z}$, r(x) = round(x)

 $\Rightarrow |\Re| \ge |Z|$

S and T have same cardinality: $|S = |T| \Rightarrow |S| \ge |T| \land |T| \ge |S|$

∃ 1-1 correspondence S↔T

· Generalizes finite cardinality: $\{1, 2, 3, 4, 5\} \ge \{a, b, c\}$

Infinite Sets

Infinite set: |S > k ∀k∈Z

 \exists 1-1 corres. $f:S \leftrightarrow T$, $S \subset T$

Ex: $\{p \mid p \text{ prime}\}, \Re$

Countable set: |S ≤ N|

Ex: \emptyset , {p | p prime}, N, Z

· S is strictly smaller than T: $|S| \leq |T| \implies |S| \leq |T| \land |S| \neq |T|$

• Uncountable set: |N| < |S| Ex: $|N| \le \Re$

 $|N| \le [0,1] - \{x \mid x \in \Re, 0 \le x \le 1\}$

Thm: ∃ 1-1 correspondence Q↔N Pf (dove-tailing):

Thm: $|\Re| > N$ Pf (diagonalization):

Assume ∃ 1-1 corres. $f: \Re \leftrightarrow \mathbb{N}$ Construct $x \in \Re$:

f(1)=2.518281828...f(2)=1.4.4213562...f(3)=1.617033989...

 $X = 0.871... \neq f(K) \ \forall K \in \mathbb{N}$

 \Rightarrow f not a 1-1 correspondence

→ contradiction

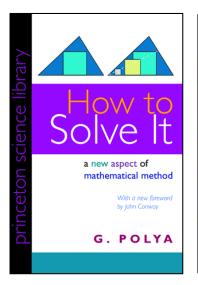
⇒ ℜ is uncountable

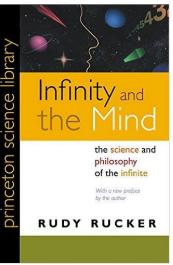
Required Readings

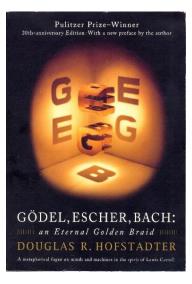
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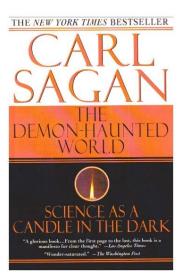
Required books:

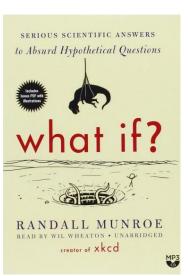
- "How to Solve It", Polya, 1957
- "Infinity and the Mind", Rucker, 1995
- "Godel, Escher, Bach", Hofstadter, 1979
- "The Demon-Haunted World", Sagan, 2009
- "What If", Munroe, 2014











Required Readings

www.cs.virginia.edu/robins/CS_readings.html

- Remaining videos / articles / books are "electives"
- At least 2 submissions per week (due 11:59pm Mon)
- At most 2 submissions per day
- This policy is intended to help you avoid "cramming"
- "Cramming" is highly correlated with cheating!
- Length: 1-2 paragraphs per article / video
 1-2 pages per book
- Books are worth more credit than articles / videos
- Additional readings beyond 36 are welcome! (extra credit)
- Submissions form: www.cs.virginia.edu/robins/theory_homework_grad

• Theory and Algorithms:

- Who Can Name the Bigger Number, Scott Aaronson, 1999
- The Limits of Reason, Gregory Chaitin, Scientific American, March 2006, pp. 74-81.
- Breaking Intractability, Joseph Traub and Henryk Wozniakowski,
 Scientific American, January 1994, pp. 102-107.
- Confronting Science's Logical Limits, John Casti, Scientific American, October 1996, pp. 102-105.
- Go Forth and Replicate, Moshe Sipper and James Reggia, Scientific American, August 2001, pp. 34-43.
- The Science Behind Sudoku, Jean-Paul Delahaye, Scientific American, June 2006, pp. 80-87.
- The Traveler's Dilemma, Kaushik Basu, Scientific American, June 2007, pp. 90-95.

Biological Computing:

- Computing with DNA, Leonard Adleman, Scientific American, August 1998, pp. 54-61.
- Bringing DNA Computing to Life, Ehud Shapiro and Yaakov Benenson, Scientific American, May 2006, pp. 44-51.
- Engineering Life: Building a FAB for Biology, David Baker et al., Scientific American, June 2006, pp. 44-51.
- Big Lab on a Tiny Chip, Charles Choi, Scientific American,
 October 2007, pp. 100-103.
- DNA Computers for Work and Play, Macdonald et al, Scientific American, November 2007, pp. 84-91.

Quantum Computing:

- Quantum Mechanical Computers, Seth Lloyd, Scientific American, 1997, pp. 98-104.
- Quantum Computing with Molecules, Gershenfeld and Chuang,
 Scientific American, June 1998, pp. 66-71.
- Black Hole Computers, Seth Lloyd and Jack Ng, Scientific American, November 2004, pp. 52-61.
- Computing with Quantum Knots, Graham Collins, Scientific American, April 2006, pp. 56-63.
- The Limits of Quantum Computers, Scott Aaronson, Scientific American, March 2008, pp. 62-69.
- Quantum Computing with Ions, Monroe and Wineland,
 Scientific American, August 2008, pp. 64-71.

History of Computing:

- The Origins of Computing, Campbell-Kelly, Scientific American, September 2009, pp. 62-69.
- Ada and the First Computer, Eugene Kim and Betty Toole,
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- Malware Goes Mobile, Mikko Hypponen, Scientific American,
 November 2006, pp. 70-77.
- RFID Powder, Tim Hornyak, Scientific American, February 2008, pp. 68-71.
- Can Phishing be Foiled, Lorrie Cranor, Scientific American,
 December 2008, pp. 104-110.

• Future of Computing:

- Microprocessors in 2020, David Patterson, Scientific American, September 1995, pp. 62-67.
- Computing Without Clocks, Ivan Sutherland and Jo Ebergen, Scientific American, August 2002, pp. 62-69.
- Making Silicon Lase, Bahram Jalali, Scientific American, February 2007,
 pp. 58-65.
- A Robot in Every Home, Bill Gates, Scientific Am, January 2007, pp. 58-65.
- Ballbots, Ralph Hollis, Scientific American, October 2006, pp. 72-77.
- Dependable Software by Design, Daniel Jackson, Scientific American, June 2006, pp. 68-75.
- Not Tonight Dear I Have to Reboot, Charles Choi, Scientific American,
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- Self-Powered Nanotech, Zhong Lin Wang, Scientific American, January 2008, pp. 82-87.

• The Web:

- The Semantic Web in Action, Lee Feigenbaum et al., Scientific American,
 December 2007, pp. 90-97.
- Web Science Emerges, Nigel Shadbolt and Tim Berners-Lee, Scientific American, October 2008, pp. 76-81.

• The Wikipedia Computer Science Portal:

- Theory of computation and Automata theory
- Formal languages and grammars
- Chomsky hierarchy and the Complexity Zoo
- Regular, context-free & Turing-decidable languages
- Finite & pushdown automata; Turing machines
- Computational complexity
- List of data structures and algorithms



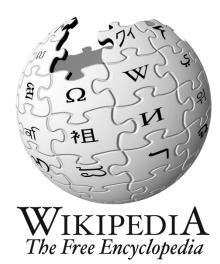
Other "Elective" Readings

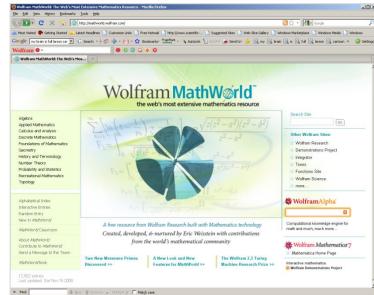
www.cs.virginia.edu/robins/CS_readings.html

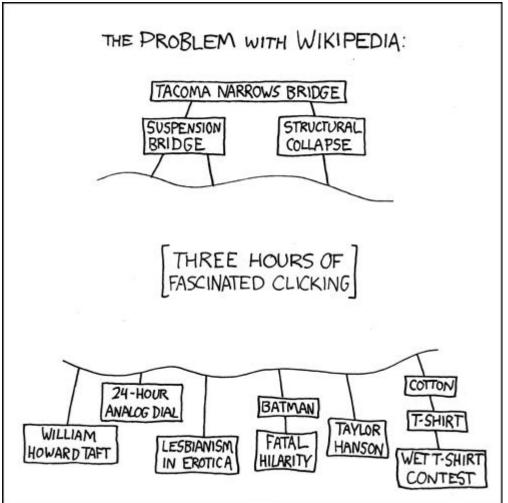
- The Wikipedia Math Portal:
 - Problem solving
 - List of Mathematical lists
 - Sets and Infinity
 - Discrete mathematics
 - Proof techniques and list of proofs
 - Information theory & randomness
 - Game theory
- Mathematica's "Math World"

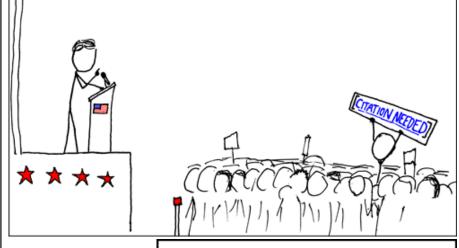


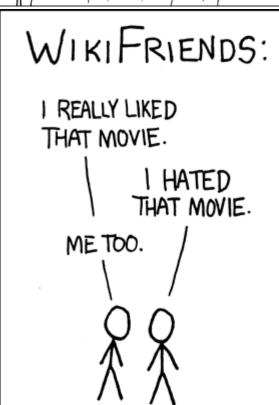
www.cs.virginia.edu/robins/theory_homework_grad





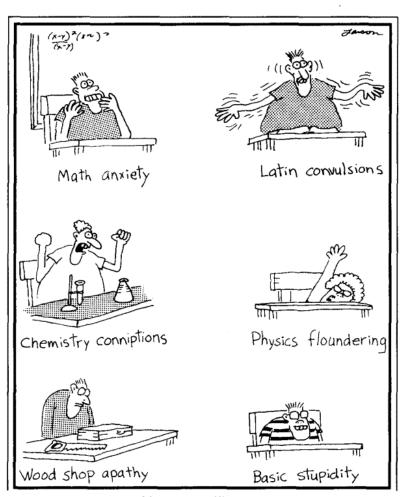






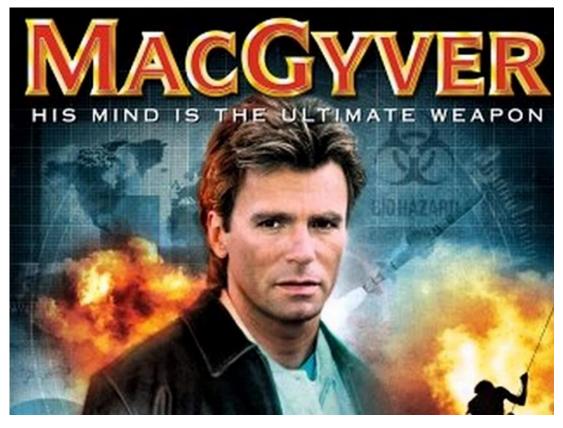
Good Advice

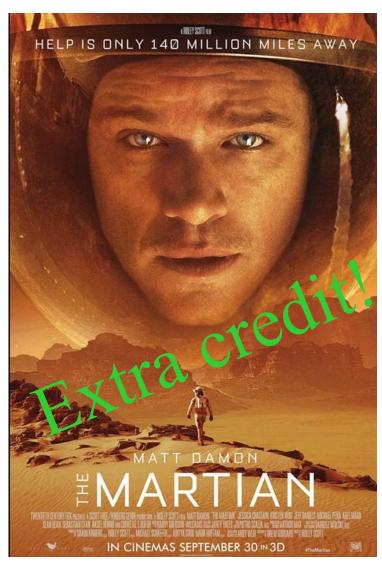
- Ask questions ASAP
- Solve problems ASAP
- Work in study groups
- Do not fall behind
- "Cramming" won't work
- Do lots of extra credit
- Attend every lecture
- Visit class Website often
- Solve lots of problems



Classroom afflictions

Goal: Become a more effective problem solver!





Submissions Web form: www.cs.virginia.edu/robins/theory_homework_grad

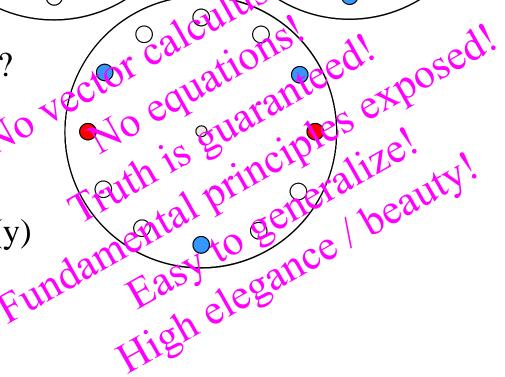
Problem: Can 5 test tubes be spun simultaneously in a

12-hole centrifuge in a balanced way?





- Why are 3 test tubes balanced?
- Symmetry:
- Can you merge solutions?
- Superposition!
- Linearity! f(x + y) = f(x) + f(y)
- Can you spin 7 test tubes?
- **Complementarity!**
- Empirical testing...



Problem:
$$1 + 2 + 3 + 4 + ... + 100 = ?$$

Proof: Induction...

$$=(100*101)/2$$

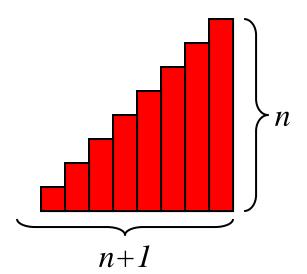
= 5050

$$1 + 2 + 3 + \dots + 99 + 100$$

 $100 + 99 + 98 + \dots + 2 + 1$

$$101 + 101 + 101 + \dots + 101 + 101 = 100*101$$

$$\sum_{i=1}^{n} i = \frac{n(n+1)}{2}$$



Drawbacks of Induction

- You must a priori know the formula / result
- Easy to make mistakes in inductive proof
- Mostly "mechanical" ignores intuitions
- Tedious to construct
- Difficult to check
- Hard to understand
- Not very convincing
- Generalizations not obvious
- Does not "shed light on truth"
- Obfuscates connections



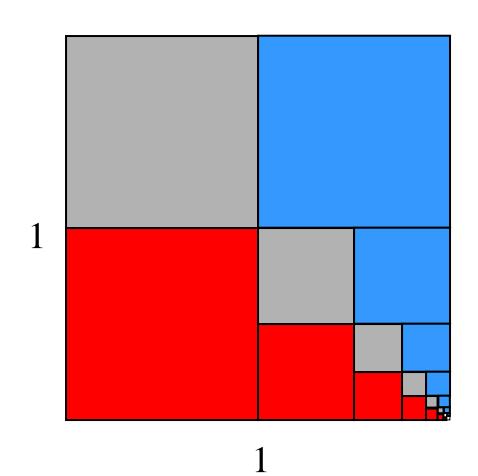
Conclusion: only use induction as a last resort! (i.e., rarely)

Problem: $(1/4) + (1/4)^2 + (1/4)^3 + (1/4)^4 + \dots = ?$

$$\sum_{i=1}^{\infty} \frac{1}{4^i} = ?$$

Extra Credit:

Problem: $(1/4) + (1/4)^2 + (1/4)^3 + (1/4)^4 + \dots = ?$



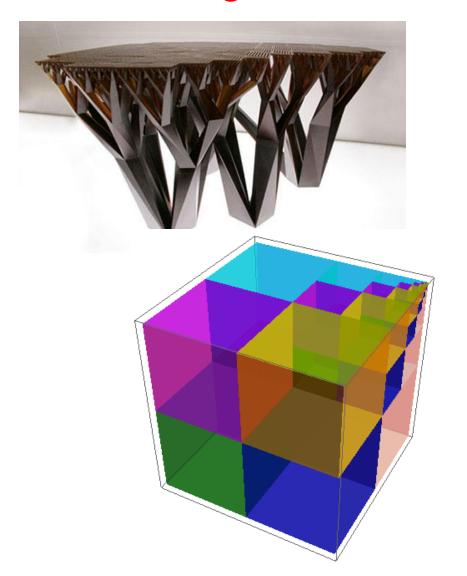
$$\sum_{i=1}^{\infty} \frac{1}{4^i} = \frac{1}{3}$$

Problem: $(1/8) + (1/8)^2 + (1/8)^3 + (1/8)^4 + \dots = ?$

$$\sum_{i=1}^{\infty} \frac{1}{8^i} = ?$$

Extra Credit:

Problem: $(1/8) + (1/8)^2 + (1/8)^3 + (1/8)^4 + ... = ?$



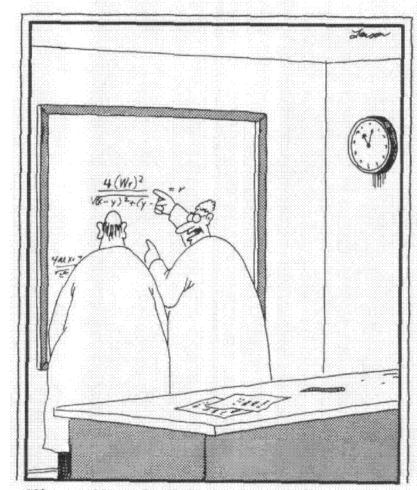
$$\sum_{i=1}^{\infty} \frac{1}{8^i} = \frac{1}{7}$$



Problem: $1^3 + 2^3 + 3^3 + 4^3 + ... + n^3 = ?$

$$\sum_{i=1}^{n} \mathbf{i}^3 = ?$$

Extra Credit:

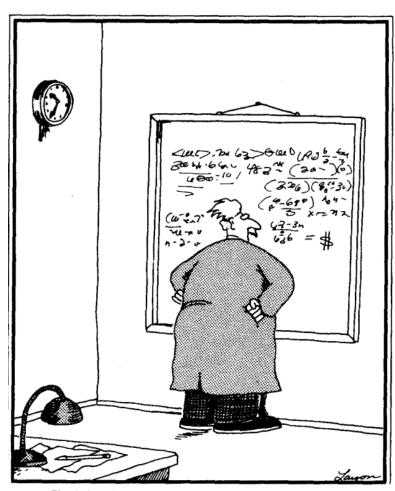


"Yes, yes, I know that, Sidney ... everybody knows that! ... But look: Four wrongs squared, minus two wrongs to the fourth power, divided by this formula, do make a right."

Problem: Prove that $\sqrt{2}$ is irrational.

Extra Credit: find a short, induction-free proof.

- What approaches fail?
- What techniques work and why?
- Lessons and generalizations



Einstein discovers that time is actually money.

Problem: Prove that there are an infinity of primes.

Extra Credit: Find a short, induction-free proof.

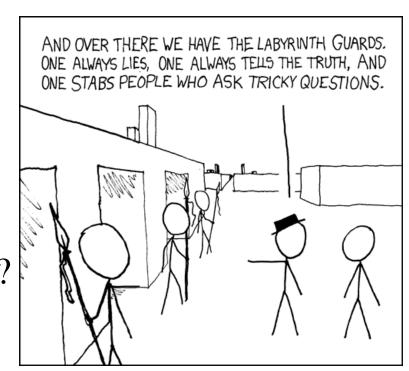
- What approaches fail?
- What techniques work and why?
- Lessons and generalizations



Problem: True or false: there arbitrary long blocks of consecutive composite integers.

Extra Credit: find a short, induction-free proof.

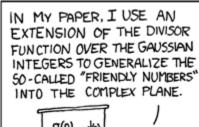
- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

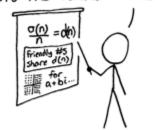


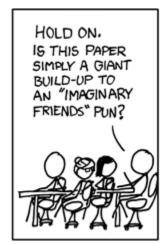
Problem: Are the complex numbers closed under exponentiation? E.g., what is the value of iⁱ?

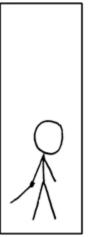


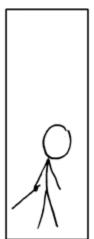


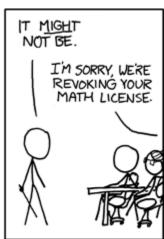








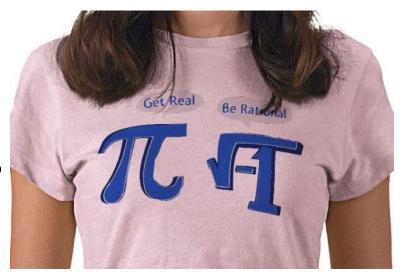




Problem: Does exponentiation preserve irrationality? i.e., are there two irrational numbers x and y such that x^y is rational?

Extra Credit: find a short, induction-free proof.

- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

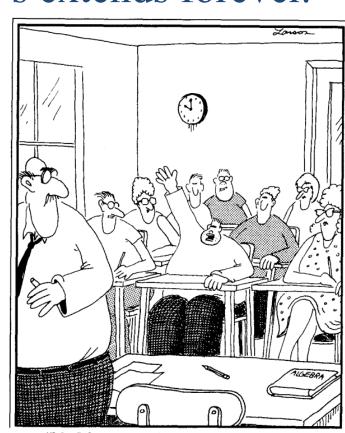


Problem: Solve the following equation for X:

$$X^{X^{X^{X^{X}}}} = 2$$

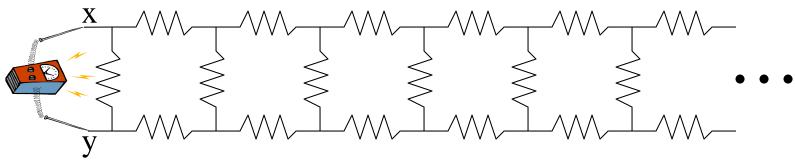
where the stack of exponentiated x's extends forever.

- What approaches fail?
- What techniques work and why?
- Lessons and generalizations

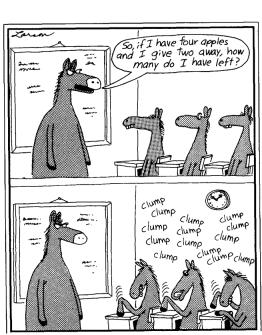


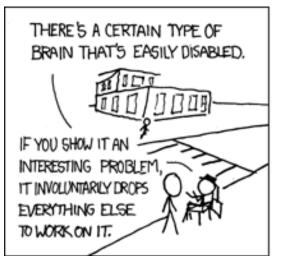
"Mr. Osborne, may I be excused? My brain is full."

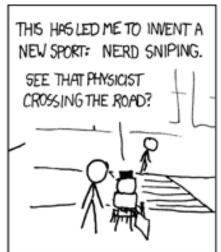
Problem: For the given infinite ladder of resistors of resistance R each, what is the resistance measured between points x and y?

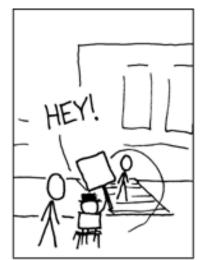


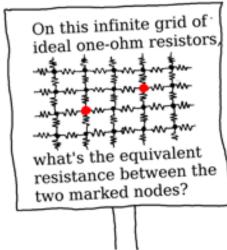
- What approaches fail?
- What techniques work and why?
- Lessons and generalizations





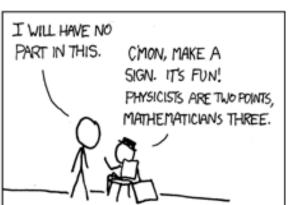






ITS... HMM. INTERESTING.
MAYBE IF YOU START WITH ...
NO, WAIT. HMM...YOU COULD-





Historical Perspectives

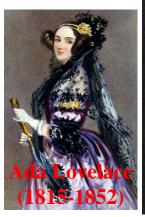


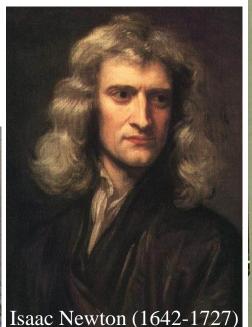
Historical Perspectives

- Knowing the "big picture" is empowering
- Science and mathematics builds heavily on past
- Often the simplest ideas are the most subtle
- Most fundamental progress was done by a few
- We learn much by observing the best minds
- Research benefits from seeing connections
- The field of computer science has many "parents"
- We get inspired and motivated by excellence
- The giants can show us what is possible to achieve
- It is fun to know these things!

"Standing on the Shoulders of Giants"

- Aristotle, Euclid, Archimedes, Eratosthenes
- Abu Ali al-Hasan ibn al-Haytham
- Fibonacci, Descartes, Fermat, Pascal
- Newton, Euler, Gauss, Hamilton
- Boole, De Morgan
- Babbage, Ada Lovelace
- Venn, Carroll



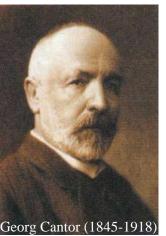




"Standing on the Shoulders of Giants"

- Cantor, Hilbert, Russell
- Hardy, Ramanujan, Ramsey
- Gödel, Church, Turing
- von Neumann, Shannon
- Kleene, Chomsky
- Hoare, McCarthy, Erdos
- Knuth, Backus, Dijkstra

Many others...









Curie Galileo G. Pasteus



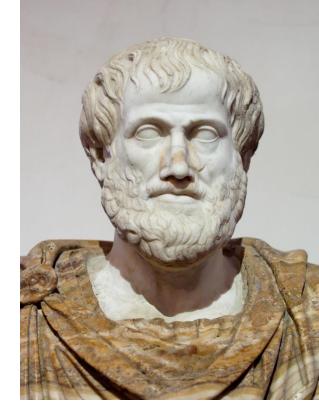
MAKING PHILOSOPHY ACCESSIBLE: POP-UP PLATO



Historical Perspectives

Aristotle (384BC-322BC)

- Founded Western philosophy
- Student of Plato
- Taught Alexander the Great
- "Aristotelianism"
- Developed the "scientific method"
- One of the most influential people ever
- Wrote on physics, theatre, poetry, music, logic, rhetoric, politics, government, ethics, biology, zoology, morality, optics, science, aesthetics, psychology, metaphysics, ...
- Last person to know everything known in his own time!
- "Almost every serious intellectual advance has had to begin with an attack on some Aristotelian doctrine." – Bertrand Russell







APISTOTENHE



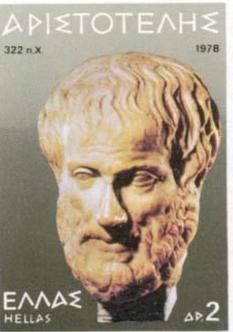


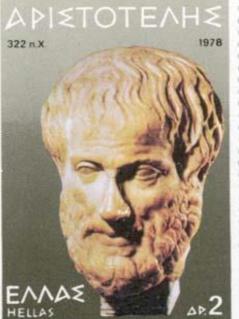




- Aristotle (384-322 B.C.)



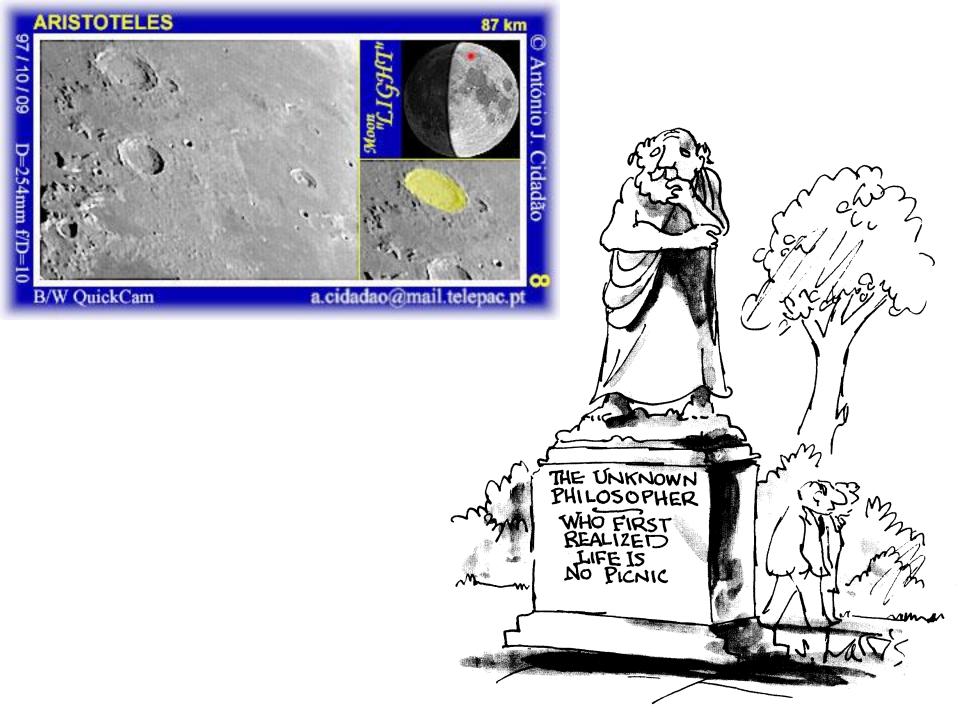








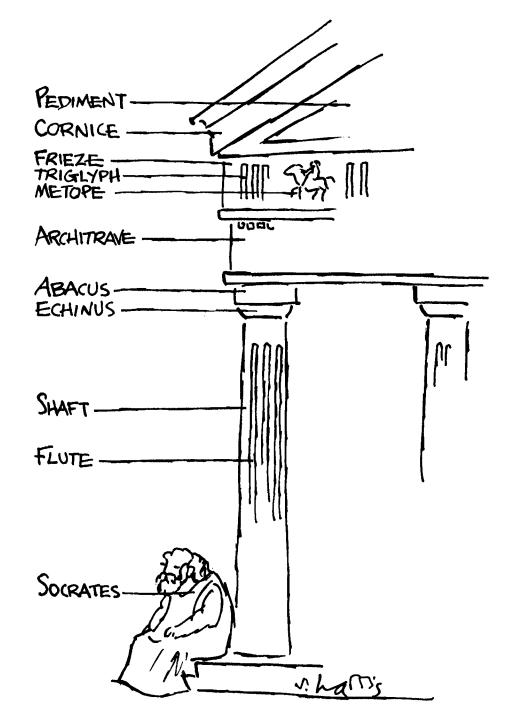








"What I especially like about being a philosopher-scientist is that I don't have to get my hands dirty."



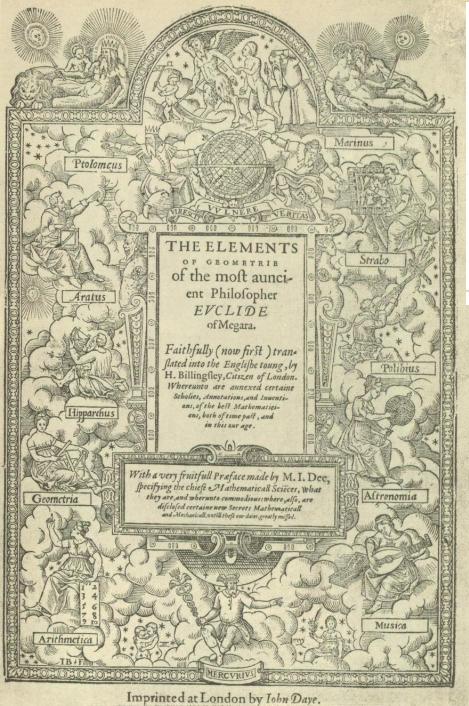
Historical Perspectives

Euclid (325BC-265BC)

- Founder of geometry
 & the axiomatic method
- "Elements" oldest and most impactful textbook
- Unified logic & math
- Introduced rigor and "Euclidean" geometry
- Influenced all other fields of science:
 Copernicus, Kepler, Galileo, Newton,
 Russell, Lincoln, Einstein & many others









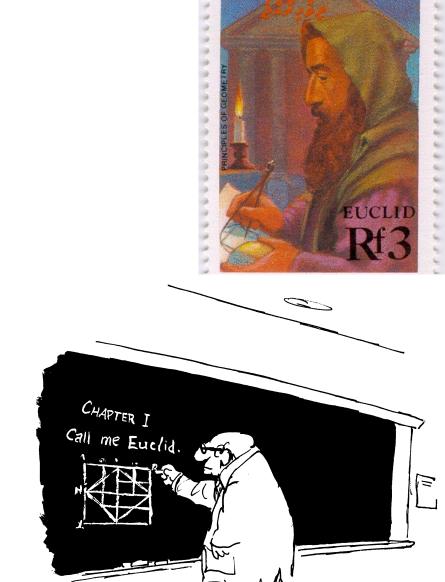


Euclid's Straight-Edge and Compass Geometric Constructions C3 Extra credit!









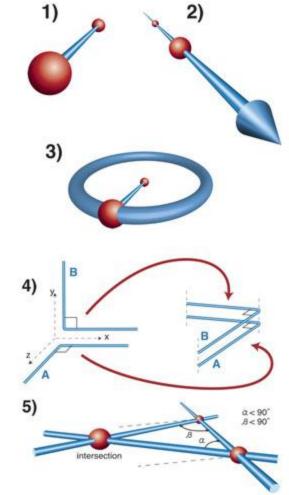
Euclid's Axioms

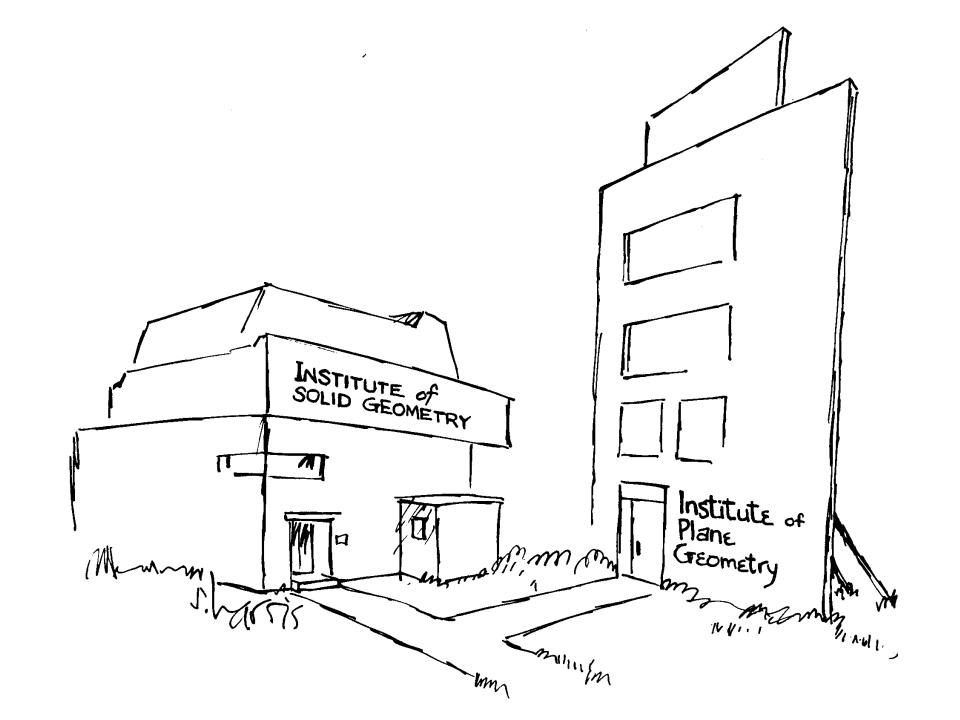
- 1: Any two points can be connected by exactly one straight line.
- 2: Any segment can be extended indefinitely into a straight line.
- 3: A circle exists for any given center and radius.
- 4: All right angles are equal to each other.
- 5: The parallel postulate: Given a line and a point off that line, there is exactly one line passing through the point, which does not intersect the first line.

The first 28 propositions of Euclid's Elements were proven without using the parallel postulate!

Theorem [Beltrami, 1868]: The parallel postulate is independent of the other axioms of Euclidean geometry.

The parallel postulate can be modified to yield non-Euclidean geometries!

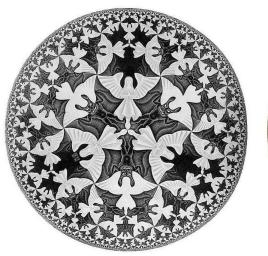


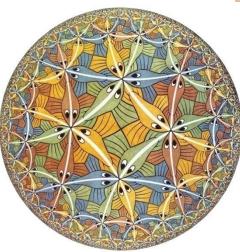


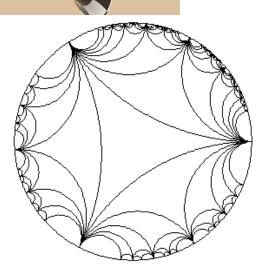
Non-Euclidean Geometries

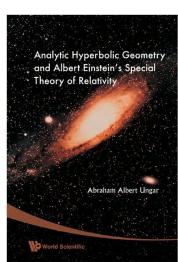
Hyperbolic geometry: Given a line and a point off that line, there are an infinity of lines passing through that point that do not intersect the first line.

- Sum of triangle angles is less than 180°
- Different triangles have different angle sum
- Triangles with same angles have same area
- There are no similar triangles
- Used in relativity theory







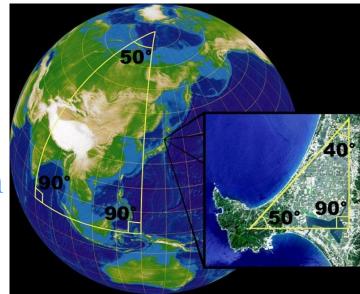


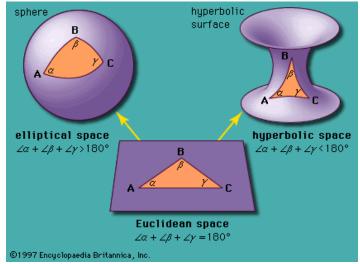
Non-Euclidean Geometries

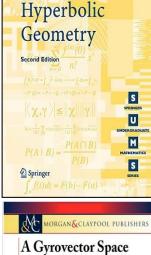
Spherical / Elliptic geometry: Given a line and a point off that line, there are no lines passing through that point that do not

intersect the first line.

- Lines are geodesics "great circles"
- Sum of triangle angles is $> 180^{\circ}$
- Not all triangles have same angle sum
- Figures can not scale up indefinitely
- Area does not scale as the square
- Volume does not scale as the cube
- The Pythagorean theorem fails
- Self-consistent, and complete







Approach to

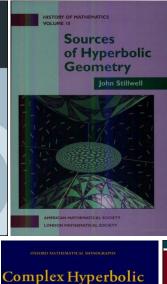
H. S. M. COXETER

James W. Anderson

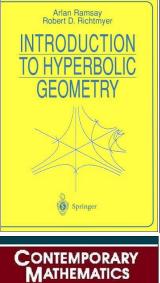


Hyperbolic Geometry





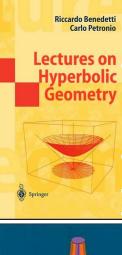
Geometry

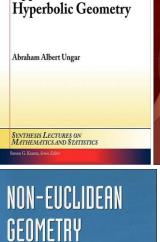


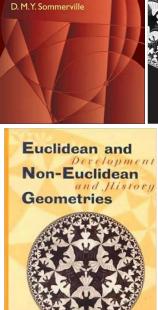
Complex Manifolds and Hyperbolic Geometry

Clifford J. Earle

William J. Harvey Sev'ı n Recilias-Pishmish

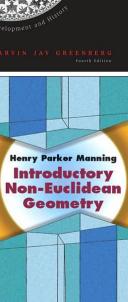


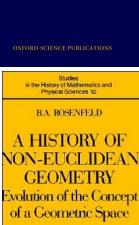


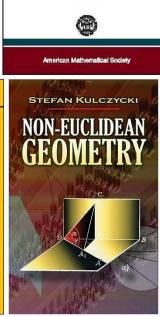


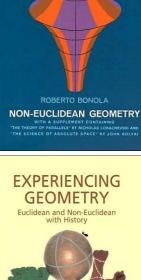
Marvin Jay Greenberg

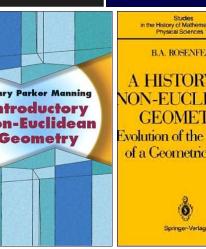
THE ELEMENTS OF NON-EUCLIDEAN GEOMETRY

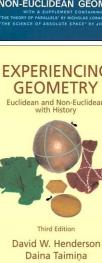














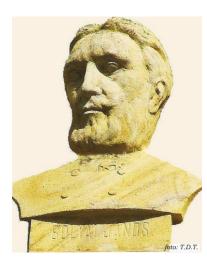
Founders of Non-Euclidean Geometry

János Bolyai (1802-1860)









Nikolai Ivanovich Lobachevsky (1792-1856)

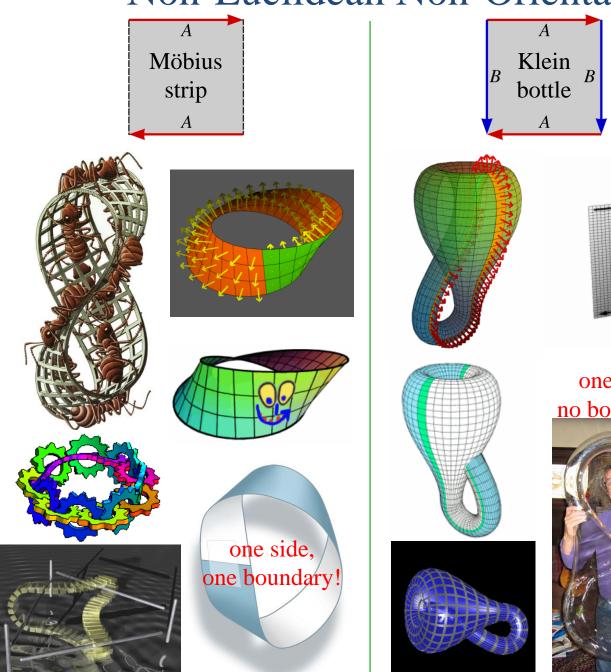


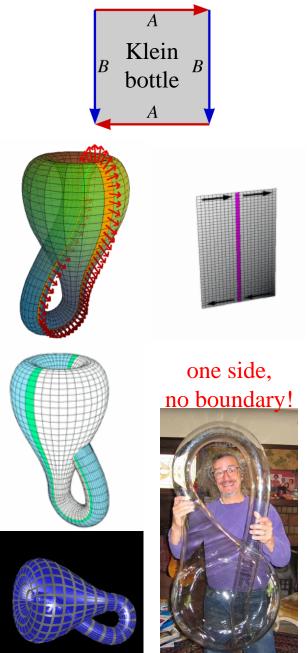


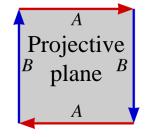


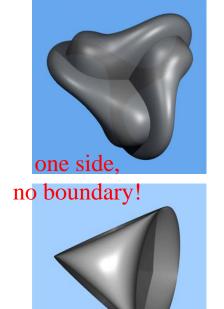


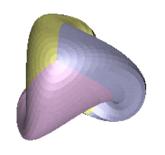
Non-Euclidean Non-Orientable Surfaces



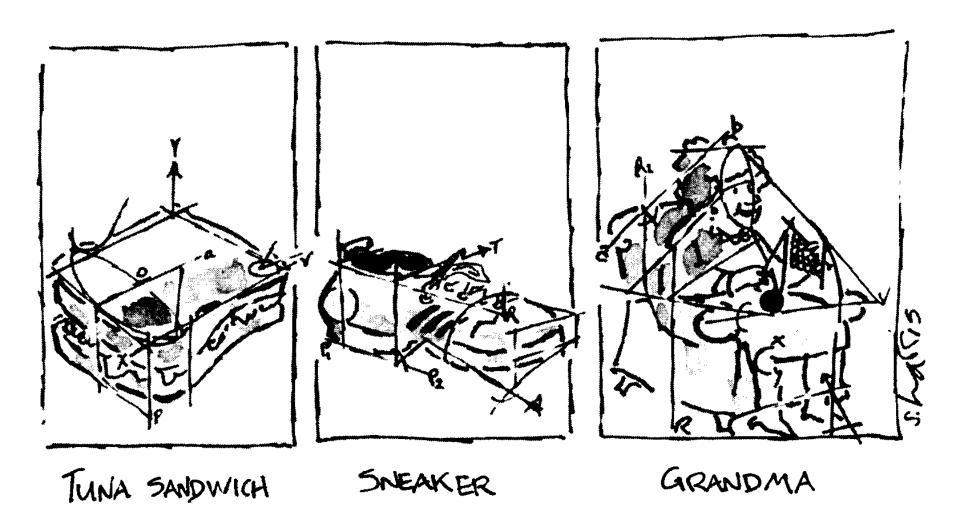








THE GEOMETRY OF EVERYDAY LIFE



Problem: A man leaves his house and walks one mile south. He then walks one mile west and sees a Bear. Then he walks one mile north back to his house. What color was the bear?

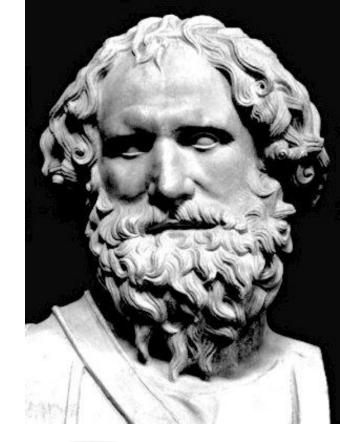


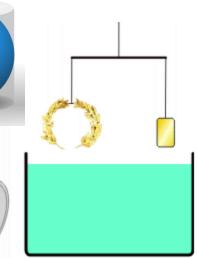
Problem: Is the house location unique?

Historical Perspectives

Archimedes of Syracuse (287-212 BC)

- Mathematician, physicist, engineer, inventor, astronomer
- Leading scientist of classical antiquity
- Originated hydrostatics, mechanics
 Archimedean screw, spiral, lever
- Discovered Archimedes' principle
- Used infinitesimals, approximated Pi
- Designed siege and naval weapons
- Invented large number notation

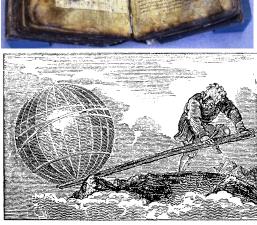








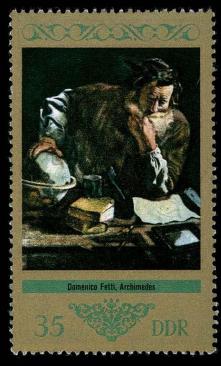




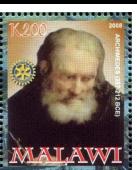


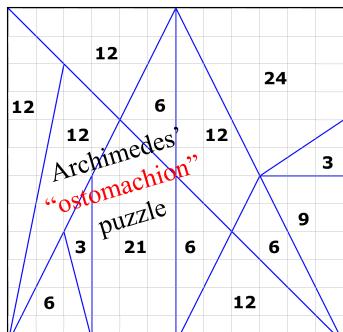
















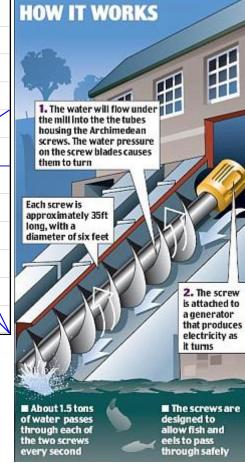






















"THERE GOES ARCHIMEDES WITH HIS CONFOUNDED LEVER AGAIN"

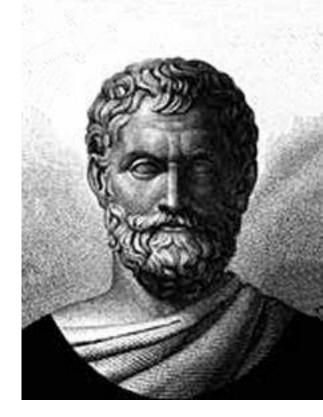


"The periodic table."

Historical Perspectives

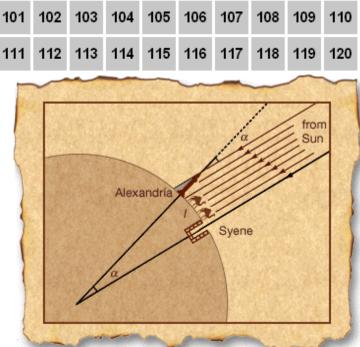
Eratosthenes (276BC-194BC)

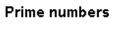
- Chief librarian at Library of Alexandria
- Measured the Earth's size (<1% error!)
- Calculated the Earth-Sun distance
- Invented latitude and longtitude
- Primes "Sieve of Eratosthenes"
- Chronology of ancient history
- Wrote on astronomy, geography, history, mathematics, philosophy, and literature

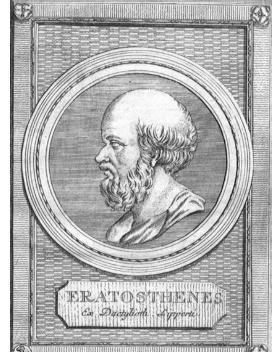


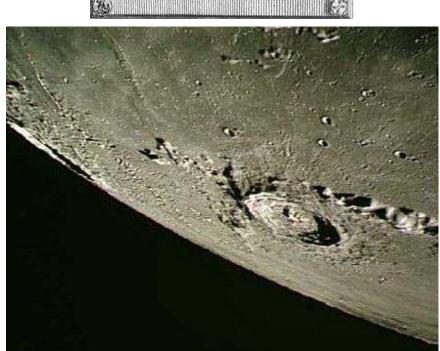
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61	62	63	64	65	66	67	68	69	70
71	72	73	74	75	76	77	78	79	80
81	82	83	84	85	86	87	88	89	90
91	92	93	94	95	96	97	98	99	100
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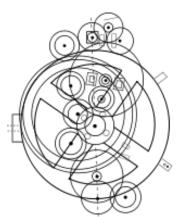


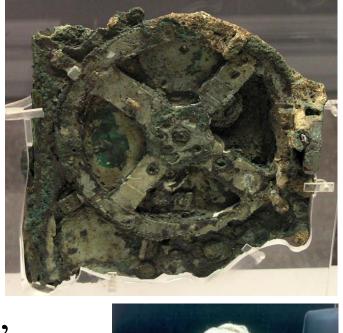
An Ancient Computer: The Antikythera

- Oldest known mechanical computer
- Built around 150-100 BCE!
- Calculates eclipses and astronomical positions of sun, moon, and planets
- Very sophisticated for its era
- Contains dozens of intricate gears
- Comparable to 1700's Swiss clocks
- Has an attached "instructions manual"
- Still the subject of ongoing research

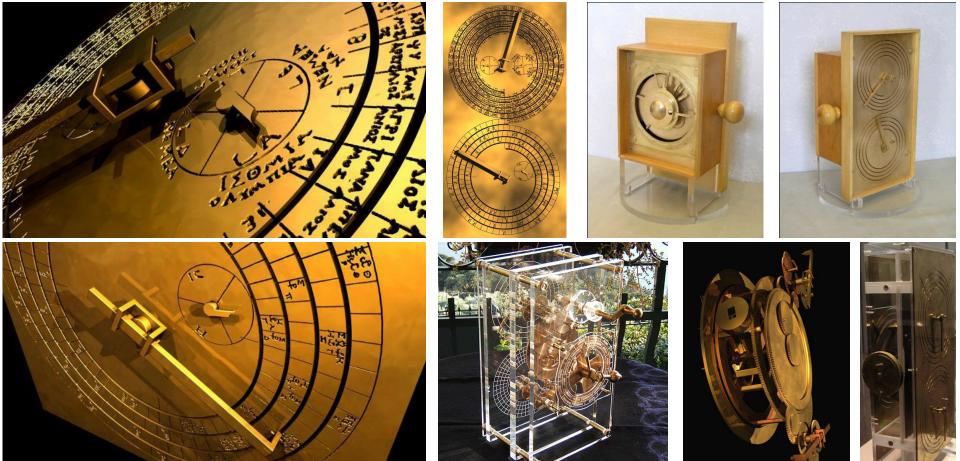




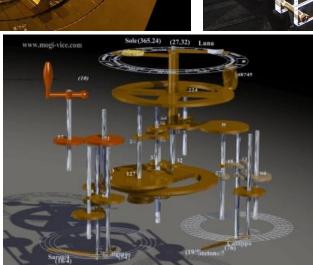




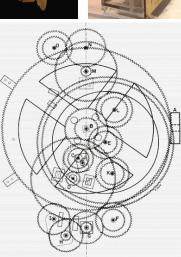


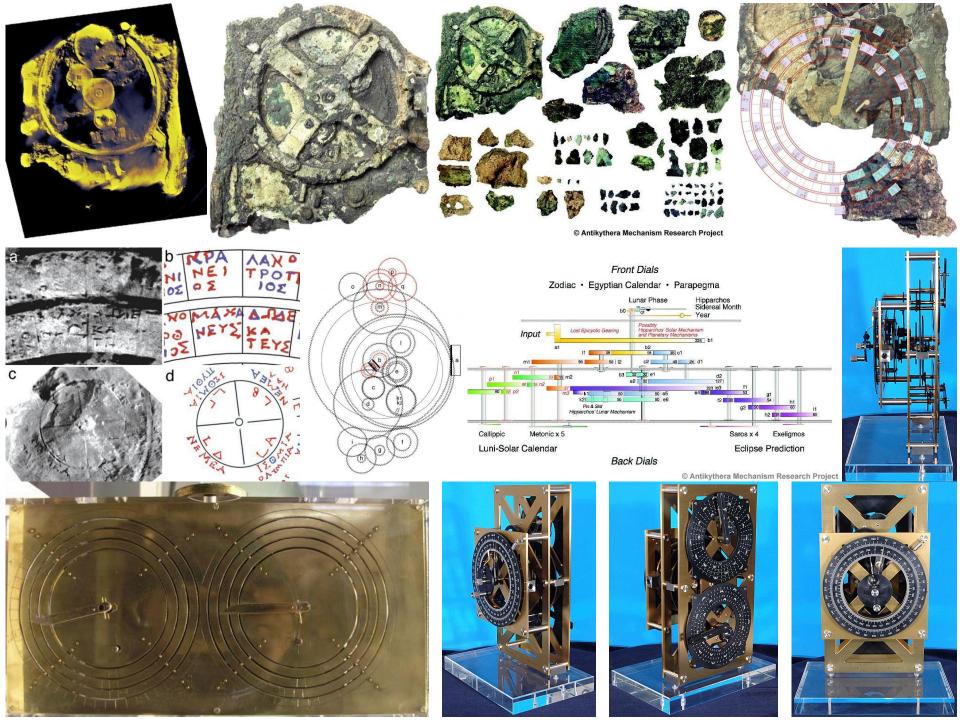


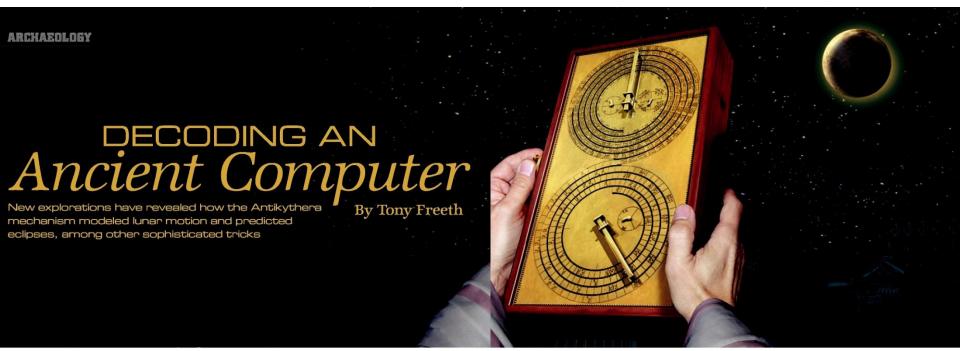












KEY CONCEPTS

- The Antikythera mechanism is a unique mechanical calculator from second-century B.C. Greece. Its sophistication surprised archaeologists when it was discovered in 1901. But no one had anticipated its true power.
- Advanced imaging tools have finally enabled researchers to reconstruct how the device predicted lunar and solar eclipses and the motion of the moon in the sky.
- Inscriptions on the mechanism suggest that it might have been built in the Greek city of Syracuse (now in modern Sicily), perhaps in a tradition that originated with Archimedes.

-The Editors

f it had not been for two storms 2,000 years apart in the same area of the Mediterranean, the most important technological artifact from the ancient world could have been lost forever.

The first storm, in the middle of the 1st century B.C., sank a Roman merchant vessel laden with Greek treasures. The second storm, in A.D. 1900, drove a party of sponge divers to shelter off the tiny island of Antikythera, between Crete and the mainland of Greece. When the storm subsided, the divers tried their luck for sponges in the local waters and chanced on the wreck. Months later the divers returned, with backing from the Greek government. Over nine months they recovered a hoard of beautiful ancient Greek objects—rare bronzes, stunning glassware, amphorae, pottery and jewelry—in one of the first major underwater archaeological excavations in history.

One item attracted little attention at first: an undistinguished, heavily calcified lump the size of a phone book. Some months later it fell apart, revealing the remains of corroded bronze gearwheels—all sandwiched together and with teeth just one and a half millimeters long—along with plates covered in scientific scales and Greek in plates covered in pla

scriptions. The discovery was a shock: until then, the ancients were thought to have made gears only for crude mechanical tasks.

Three of the main fragments of the Antikythera mechanism, as the device has come to be known, are now on display at the Greek National Archaeological Museum in Athens. They look small and fragile, surrounded by imposing bronze statues and other artistic glories of ancient Greece. But their subtle power is even more shocking than anyone had imagined at first.

I first heard about the mechanism in 2000. I was a filmmaker, and astronomer Mike Edmunds of Cardiff University in Wales contacted me because he thought the mechanism would make a great subject for a TV documentary. I learned that over many decades researchers studying the mechanism had made considerable progress, suggesting that it calculated astronomical data, but they still had not been able to fully grasp how it worked. As a former mathematician, I became intensely interested in understanding the mechanism myself.

Edmunds and I gathered an international collaboration that eventually included historians, astronomers and two teams of imaging experts. In the past few years our group has reconstructed how nearly all the surviving parts worked and what functions they performed. The mechanism calculated the dates of lunar and solar eclipses, modeled the moon's subtle apparent motions through the sky to the best of the available knowledge, and kept track of the dates of events of social significance, such as the Olympic Games. Nothing of comparable technological sophistication is known anywhere in the world for at least a millennium afterward. Had this unique specimen not survived, historians would have thought that it could not have existed at that time.

Early Pioneers

German philologist Albert Rehm was the first person to understand, around 1905, that the Antikythera mechanism was an astronomical calculator. Half a century later, when science historian Derek J. de Solla Price, then at the Institute for Advanced Study in Princeton, N.J., described the device in a Scientific American article, it still had revealed few of its secrets.

The device, Price suggested, was operated by turning a crank on its side, and it displayed its output by moving pointers on dials located on its front and back. By turning the crank, the user could set the machine on a certain date as indi-

cated on a 365-day calendar dial in the front. (The dial could be rotated to adjust for an extra day every four years, as in today's leap years.) At the same time, the crank powered all the other gears in the mechanism to yield the information corresponding to the set date.

A second front dial, concentric with the calendar, was marked out with 360 degrees and with the 12 signs representing the constellations of the zodiac [see box on pages 80 and 81]. These are the constellations crossed by the sun in its apparent motion with respect to the "fixed" stars—"motion" that in fact results from Earth's orbiting the sun—along the path called the ecliptic. Price surmised that the front of the mechanism probably had a pointer showing where along the ecliptic the sun would be at the desired date.

In the surviving fragments, Price identified the remains of a dozen gears that had been part of the mechanism's innards. He also estimated their tooth counts—which is all one can do given that nearly all the gears are damaged and incomplete. Later, in a landmark 1974 study, Price described 27 gears in the main fragment and provided improved tooth counts based on the first x-rays of the mechanism, by Greek radiologist Charalambos Karakalos.

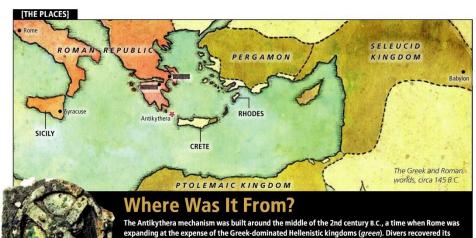
ANCIENT GREEKS knew how to calculate the recurring patterns of lunar eclipses thanks to observations made for centuries by the Babylonians. The Antikythera mechanism would have done those calculations for them—or perhaps for the wealthy Romans who could afford to own it. The depiction here is based on a theoretical reconstruction by the author and his collaborators.

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corroded remnants (including fragment at left) in A.D. 1901 from a shipwreck near the island of Antikythera. The ship sank around 65 B.C. while carrying Greek artistic treasures, perhaps from Pergamon to

Greek inventor Archimedes had lived there and may have left behind a technological tradition.

Rome. Rhodes had one of the major traditions of Greek astronomy, but the latest evidence points to a Corinthian origin. Syracuse, which had been a Corinthian colony in Sicily, is a possibility: the great

[THE AUTHOR]

Tony Freeth's academic background is in mathematics and mathematical logic (in which he holds a Ph.D.). His award-winning career as a filmmaker culminated in a series of documentaries about increasing crop yields in sub-Saharan Africa, featuring the late Nobel Peace Prize Laureate Norman Borlaug, Since 2000 Freeth has returned to an academic focus with research on the Antikythera mechanism. He is managing director of the film and television production company Images First, and he is now developing a film on the mechanism.



Tooth counts indicate what the mechanism calculated. For example, turning the crank to give a full turn to a primary 64-tooth gear represented the passage of a year, as shown by a pointer on the calendar dial. That primary gear was also paired to two 38-tooth secondary gears, each of which consequently turned by 64/38 times for every year. Similarly, the motion relayed from gear to gear throughout the mechanism; at each step, the ratio of the numbers of gear teeth represents a different fraction. The motion eventually transmitted to the pointers, which thus turned at rates corresponding to different astronomical cycles. Price discovered that the ratios of one of these gear trains embodied

Price, like Rehm before him, suggested that the mechanism also contained epicyclic gearing-gears spinning on bearings that are themselves attached to other gears, like the cups on a Mad Hatter teacup ride. Epicyclic gears extend the range of formulas gears can calculate beyond multiplications of fractions to additions and subtractions. No other example of epicyclic gearing is known to have existed in Western technology for another 1,500 years.

an ancient Babylonian cycle of the moon.

Several other researchers studied the mechanism, most notably Michael Wright, a curator at the Science Museum in London, in collaboration

with computer scientist Allan Bromley of the University of Sydney. They took the first threedimensional x-rays of the mechanism and showed that Price's model of the mechanism had to be wrong. Bromley died in 2002, but Wright persisted and made significant advances. For example, he found evidence that the back dials, which at first look like concentric rings, are in fact spirals and discovered an epicyclic mechanism at the front that calculated the phase of the moon.

Wright also adopted one of Price's insights, namely that the dial on the upper back might be a lunar calendar, based on the 19-year, 235lunar-month cycle called the Metonic cycle. This calendar is named after fifth-century B.C. astronomer Meton of Athens-although it had been discovered earlier by the Babylonians-and is still used today to determine the Jewish festival of Rosh Hashanah and the Christian festival of Easter. Later, we would discover that the pointer was extensible, so that a pin on its end could follow a groove around each successive turn of the spiral.

BladeRunner in Athens

As our group began its efforts, we were hampered by a frustrating lack of data. We had no access to the previous x-ray studies, and we did not even have a good set of still photographs.

Two images in a science magazine-x-rays of a goldfish and an enhanced photograph of a Babvlonian clay tablet-suggested to me new ways o get better data.

We asked Hewlett-Packard in California to perform state-of-the-art photographic imaging and X-Tek Systems in the U.K. to do three-dimensional x-ray imaging. After four years of careful diplomacy, John Seiradakis of the Aristotle University of Thessaloniki and Xenophon Moussas of the University of Athens obtained the required permissions, and we arranged for the imaging teams to bring their tools to Athens, a necessary step because the Antikythera mechanism is too fragile to travel.

Meanwhile we had a totally unexpected call from Mary Zafeiropoulou at the museum. She had been to the basement storage and found boxes of bits labeled "Antikythera." Might we be interested? Of course we were interested. We now had a total of 82 fragments, up from about 20.

The HP team, led by Tom Malzbender, assembled a mysterious-looking dome about five feet across and covered in electronic flashbulbs that provided lighting from a range of different angles. The team exploited a technique from the computer gaming industry, called polynomial exture mapping, to enhance surface details. Inscriptions Price had found difficult to read were now clearly legible, and fine details could be enhanced on the computer screen by controlling the reflectance of the surface and the angle of the lighting. The inscriptions are essentially an instruction manual written on the outer plates.

A month later local police had to clear the streets in central Athens so that a truck carrying the BladeRunner, X-Tek's eight-ton x-ray machine, could gain access to the museum. The BladeRunner performs computed tomography similar to a hospital's CT scan, but with finer detail. X-Tek's Roger Hadland and his group had specially modified it with enough x-ray power to penetrate the fragments of the Antikythera mechanism. The resulting 3-D reconstruction was wonderful: whereas Price could see only a puzzle of overlapping gears, we could now isolate layers inside the fragment and see all the fine details of the gear teeth.

Unexpectedly, the x-rays revealed more than 2,000 new text characters that had been hidden deep inside the fragments. (We have now identified and interpreted a total of 3,000 characters out of perhaps 15,000 that existed originally.) In Athens, Moussas and Yanis Bitsakis, also at the University of Athens, and Agamemnon Tselikas of the Center for History and Palaeography be-

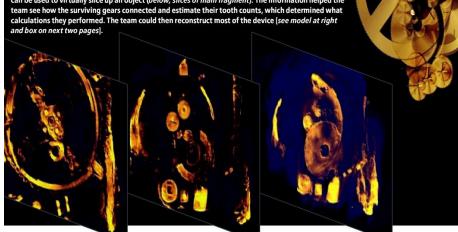
Historians would have thought that SOMETHING

SO COMPLEX could not have existed at the time.

[THE RECONSTRUCTION]

Anatomy of a Relic

Computed tomography—a 3-D mapping obtained from multiple x-ray shots—enabled the author and his colleagues to get inside views of the Antikythera mechanism's remnants. For example, a CT scan can be used to virtually slice up an object (below, slices of main fragment). The information helped the



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gan to discover inscriptions that had been invisible to human eyes for more than 2,000 years. One translated as "... spiral subdivisions 235...," confirming that the upper back dial was a spiral describing the Metonic calendar.

[INSIDE THE ANTIKYTHERA MECHANISM]

EGYPTIAN

of a year.

CALENDAR DIAL

Displayed 365 days

Date pointer

Solar pointer

PLANETARY POINTERS (HYPOTHETICAL)

May have shown

the positions of

the planets on

the zodiac dial

FRONT-PLATE INSCRIPTIONS

Described the rising and setting times

of important stars throughout the year

Astronomical

Clockwork

ZODIAC DIAL

Showed the 12

constellations along the ecliptic, the

sun's path in the sky.

LUNAR POINTER

Showed the posi-

tion of the moon

with respect to the

constellations on

the zodiac dial.

Babylon System

Back at home in London, I began to examine the CT scans as well. Certain fragments were clearly all part of a spiral dial in the lower back. An estimate of the total number of divisions in the dial's four-turn spiral suggested 220 to 225.

The prime number 223 was the obvious contender. The ancient Babylonians had discovered that if a lunar eclipse is observed-something that can happen only during a full moon-usually a similar lunar eclipse will take place 223 full moons later. Similarly, if the Babylonians saw a solar eclipse—which can take place only during a new moon—they could predict that 223 new moons later there would be a similar one (although they could not always see it: solar eclipses are visible only from specific locations, and ancient astronomers could not predict them reliably). Eclipses repeat this way because every 223 lunar months the sun, Earth and the moon return to approximately the same alignment with respect to one another, a periodicity known as the Saros cycle.

Between the scale divisions were blocks of symbols, nearly all containing Σ (sigma) or H (eta), or both. I soon realized that Σ stands for Σ elphyn (selene), Greek for "moon," indicating a lunar eclipse; H stands for Hlloo (helios), Greek for "sun," indicating a solar eclipse. The Babylonians also knew that within the 223-month period, eclipses can take place only in particular months, arranged in a predictable pattern and separated by gaps of five or six months; the distribution of symbols around the dial exactly matched that pattern.

I now needed to follow the trail of clues into the heart of the mechanism to discover where this new insight would lead. The first step was to find a gear with 223 teeth to drive this new Saros dial. Karakalos had estimated that a large gear visible at the back of the main fragment had 222 teeth. But Wright had revised this estimate to 223, and Edmunds confirmed this. With plausible tooth counts for other gears and with the addition of a small, hypothetical gear, this 223-tooth gear could perform the required calculation.

But a huge problem still remained unsolved and proved to be the hardest part of the gearing to crack. In addition to calculating the Saros cyThis exploded view of the mechanism shows all but one of the 30 known gears, plus a few that have been hypothesized. Turning a crank on the side activated all the gears in the mechanism and moved pointers on the front and back dials: the arrows colored blue, red and yellow explain how the motion transmitted from one gear to the next. The user would choose a date on the Egyptian, 365-day calendar dial on the front or on the Metonic, 235-lunar-month calen-

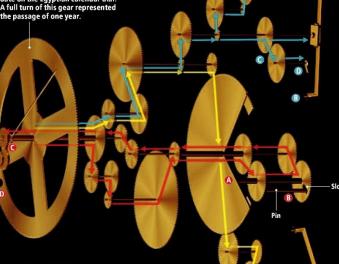
dar on the back and then read the astronomical predictions for that time—such as the position and phases of the moon—from the other dials. Alternatively, one could turn the crank to set a particular event on an astronomical dial and then see on what date it would occur. Other gears, now lost, may have calculated the positions of the sun and of some or all of the five planets known in antiquity and displayed them via pointers on the zodiac dial.

METONIC GEAR TRAIN

Calculated the month in the Metonic calendar, made of 235 lunar months, and displayed it via a pointer (a) on the Metonic calendar dial on the back. A pin (a) at the pointer's tip followed the spiral groove, and the pointer extended in length as it reached months marked on successive, outer twists. Auxiliary gears (a) turned a pointer (b) on a smaller dial indicating four-year cycles of Olympiads and other games. Other gears moved a pointer on another small dial (b), which may have indicated a 76-year cycle.

PRIMARY GEAR

When spun by the crank, it activated all other gears. It also directly moved a pointer that indicated the date on the Egyptian calendar dial. A full turn of this gear represented the passage of one year.

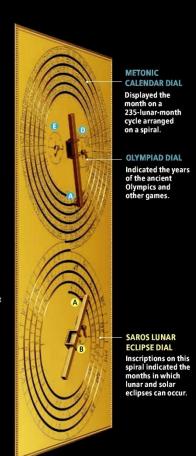


LUNAR GEAR TRAIN

A system that included epicyclic gears simulated variations in the moon's motion now know to stem from its changing orbital velocity. The epicyclic gears were attached to a larger gear (A like the cups on a Mad Hatter teacup ride. One gear turned the other via a pin-and-slot mechanism (B). The motion was then transmitted through the other gears and to the front of the mechanism. There, another epicyclic system (C) turned a half-black, half-white sphere (D) to show the lunar phases, and a pointer (E) showed the position of the mechanism.



Calculated the month in the 223-lunar-month Saros cycle of recurring eclipses. It displayed the month on the Saros dial with an extensible pointer $^{\circ}_{0}$, similar to the one on the Metonic dial. Auxiliary gears moved a pointer $^{\circ}_{0}$ on a smaller dial. That pointer made one third of a turn for each 223-month cycle to indicate that the corresponding eclipse time would be offset by eight hours.



cle, the large 223-tooth gear also carried the epicyclic system noticed by Price: a sandwich of two small gears attached to the larger gear in teacup-ride fashion. Each epicyclic gear also connected to another small gear. Confusingly, all four small gears appeared to have the same tooth count—50—which seemed nonsensical because the output would then be the same as the input.

After months of frustration, I remembered that Wright had observed that one of the two epicyclic gears has a pin on its face that engages with a slot on the other. His key idea was that the two gears turned on slightly different axes, separated by about a millimeter. As a consequence, the angle turned by one gear alternated between being slightly wider and being slightly narrower than the angle turned by the other gear. Thus, if one gear turned at a constant rate, the other gear's rate kept varying between slightly faster and slightly slower.

Ask for the Moon

Although Wright rejected his own observation, I realized that the varying rotation rate is precisely what is needed to calculate the moon's motion according to the most advanced astronomical theory of the second century B.C., the one often attributed to Hipparchos of Rhodes. Before Kepler (A.D. 1605), no one understood that orbits are elliptical and that the moon accelerates toward the perigee-its closest point to Earthand slows down toward the apogee, the opposite point. But the ancients did know that the moon's motion against the zodiac appears to periodically slow down and speed up. In Hipparchos's model, the moon moved at a constant rate around a circle whose center itself moved around a circle at a constant rate-a fairly good approximation of the moon's apparent motion. These circles on circles, themselves called epicycles, dominated astronomical thinking for the next 1,800 years.

There was one further complication: the apogee and perigee are not fixed, because the ellipse of the moon's orbit rotates by a full turn about every nine years. The time it takes for the body to get back to the perigee is thus a bit longer than the time it takes it to come back to the same point in the zodiac. The difference was just 0.112579655 turns a year. With the input gear having 27 teeth, the rotation of the large gear was slightly too big; with 26 teeth, it was slightly too small. The right result seemed to be about halfway in between. So I tried the impossible idea that the input gear had 26 ½ teeth. I pressed the key on my calculator, and it gave 0.112579655—

[A USER'S MANUAL]

How to Predict an Eclipse

Operating the Antikythera mechanism may have required only a small amount of practice and astronomical knowledge. After an initial calibration by an expert, the mechanism could provide fairly accurate predictions of events several decades in the past or future. The inscriptions on the Saros dial, coming at intervals of five or six months, corresponded to months when Earth, the sun and the moon come to a near alignment (and so represented potential solar and lunar eclipses) in a 223-lunar-month cycle. Once the month of an eclipse was known, the actual day could be calculated on the front dials using the fact that solar eclipses always happen during new moons and lunar eclipses during full moons.

exactly the right answer. It could not be a coincidence to nine places of decimals! But gears cannot have fractional numbers of teeth.

Then I realized that $26\frac{1}{2} \times 2 = 53$. In fact. Wright had estimated a crucial gear to have 53 teeth, and I now saw that that count made everything work out. The designer had mounted the pin and slot epicyclically to subtly slow down the period of its variation while keeping the basic rotation the same, a conception of pure genius. Thanks to Edmunds, we also realized that the epicyclic gearing system, which is in the back of the mechanism, moved a shaft that turned inside another, hollow shaft through the rest of the mechanism and to the front, so that the lunar motion could be represented on the zodiac dial and on the lunar phase display. All gear counts were now explained, with the exception of one small gear that remains a mystery to this day.

Further research has caused us to make some modifications to our model. One was about a small subsidiary dial that is positioned in the back, inside the Metonic dial, and is divided into four quadrants. The first clue came when I read the word "NEMEA" under one of the quadrants. Alexander Jones, a New York University historian, explained that it refers to the Nemean Games, one of the major athletic events in ancient Greece. Eventually we found, engraved round the four sectors of the dial, most of "ISTHMIA," for games at Corinth, "PYTHIA," for games at Delphi, "NAA," for minor games at Dodona, and "OLYMPIA," for the most important games of the Greek world, the Olympics. All games took place every two or four years. Previously we had considered the mechanism to be Metonic dial

Date pointer

Solar pointer

FIND ECLIPSE MONTH

CALCULATE DAY

Begin by turning the crank to set the current month and year on the Metonic calendar. The lower pointer will turn to the corresponding month on the Saros (eclipse) dial.

Turn the crank to move time forward until the pointer on the Saros dial points to an eclipse inscription. The inscription will indicate month and time of the day (but not the day) of an eclipse and whether it will be solar or lunar. Adjust the crank until the lunar and solar pointers are aligned (for a solar eclipse) or at 180 degrees (for a lunar eclipse). The Egyptian calendar pointer will move correspondingly and indicate the day of the eclipse.

purely an instrument of mathematical astronomy, but the Olympiad dial—as we named it—gave it an entirely unexpected social function.

Twenty-nine of the 30 surviving gears calculate cycles of the sun and the moon. But our studies of the inscriptions at the front of the mechanism have also yielded a trove of information on the risings and settings of significant stars and of the planets. Moreover, on the "primary" gearwheel at the front of the mechanism remnants of bearings stand witness to a lost epicyclic system that could well have modeled the back-and-forth motions of the planets along the ecliptic (as well as the anomalies in the sun's own motion). All these clues strongly support the inclusion of the sun and of at least some of the five planets known in ancient times—Mercury, Venus, Mars, Jupiter and Saturn.

Wright built a model of the mechanism with epicyclic systems for all five planets. But his ingenious layout does not agree with all the evidence. With its 40 extra gears, it may also be too complex to match the brilliant simplicity of the rest of the mechanism. The ultimate answer may still lie 50 meters down on the ocean floor.

Eureka?

The question of where the mechanism came from and who created it is still open. Most of the cargo in the wrecked ship came from the eastern Greek world, from places such as Pergamon, Kos and Rhodes. It was a natural guess that Hipparchos or another Rhodian astronomer built the mechanism. But text hidden between the 235 monthly scale divisions of the Metonic calendar contradicts this view. Some of the month names

were used only in specific locations in the ancient Greek world and suggest a Corinthian origin. If the mechanism was from Corinth itself, it was almost certainly made before Corinth was completely devastated by the Romans in 146 B.C. Perhaps more likely is that it was made to be used in one of the Corinthian colonies in northwestern Greece or Sicily.

Sicily suggests a remarkable possibility. The island's city of Syracuse was home to Archimedes, the greatest scientist of antiquity. In the first century B.C. Roman statesman Cicero tells how in 212 Archimedes was killed at the siege of Syracuse and how the victorious Roman general, Marcellus, took away with him only one piece of plunder—an astronomical instrument made by Archimedes. Was that the Antikythera mechanism? We believe not, because it appears to have been made many decades after Archimedes died. But it could have been constructed in a tradition of instrument making that originated with the eureka man himself.

Many questions about the Antikythera mechanism remain unanswered—perhaps the greatest being why this powerful technology seems to have been so little exploited in its own era and in succeeding centuries.

In Scientific American, Price wrote:

It is a bit frightening to know that just before the fall of their great civilization the ancient Greeks had come so close to our age, not only in their thought, but also in their scientific technology.

Our discoveries have shown that the Antikythera mechanism was even closer to our world than Price had conceived.

MORE TO EXPLORE

An Ancient Greek Computer.
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The Antikythera Mechanism Research Project: www. antikythera-mechanism.gr

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