

CS 121: Lecture 26

What we didn't cover

Madhu Sudan

<https://madhu.seas.harvard.edu/courses/Fall2020>

Book: <https://introtcs.org>

How to contact us { The whole staff (faster response): [CS 121 Piazza](#)
Only the course heads (slower): cs121.fall2020.course.heads@gmail.com

Announcements:

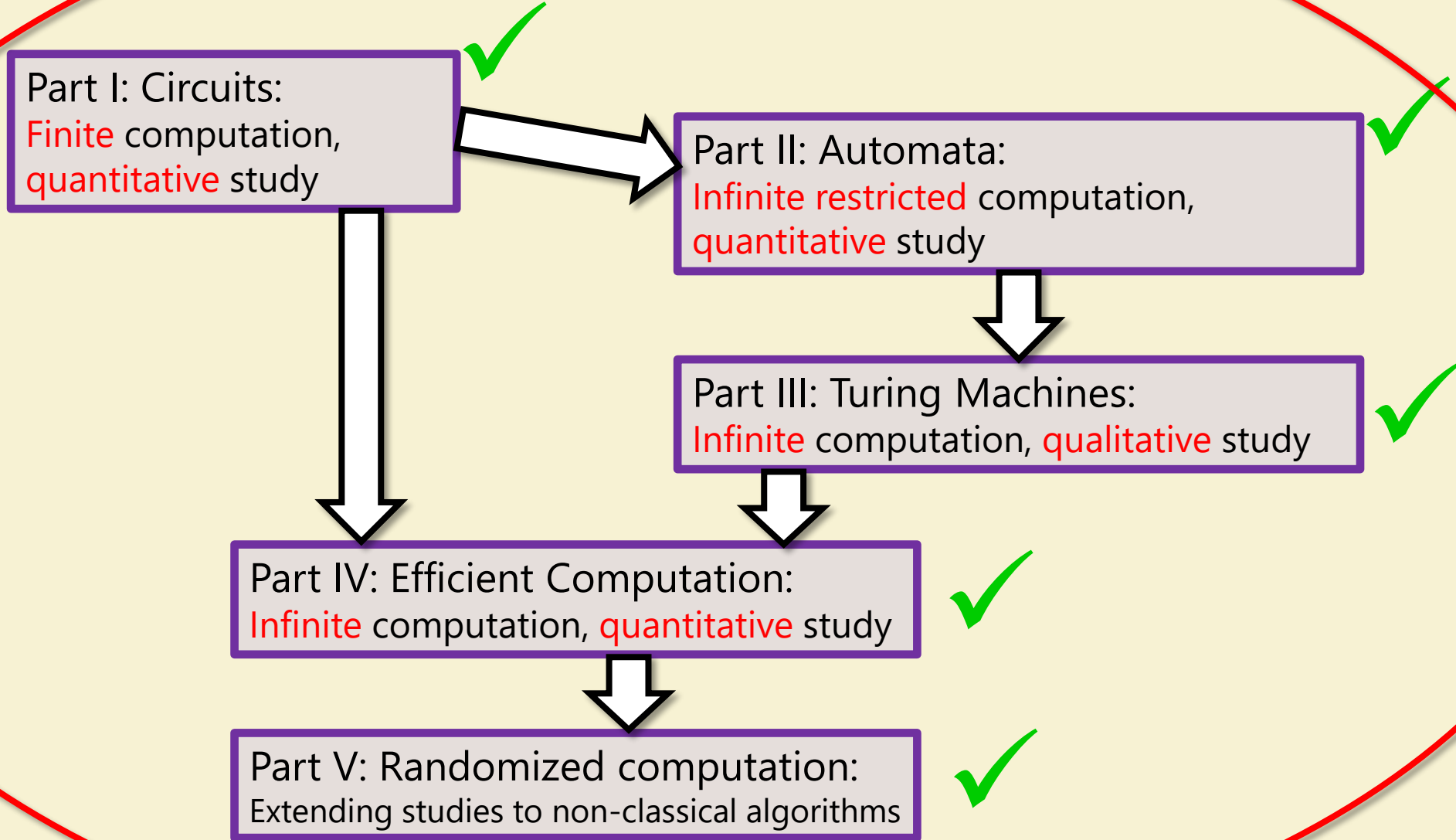


- Advanced section: Yael Kalai (Proofs in CS: Probabilistic Checking, Interaction, Zero Knowledge, Delegation)
- Final Exam (any 3hrs between [1:21pm 12/10 – 1:21pm 12/12])

Prime time: 1:21 – 5:21 on 12/10
Next: 8:00_{am} – 12:00 noon on 12/11

- Homework 6 due today
- Piazza posts on review material for final.

Where we are:



Summary of the course

- Turing Machines!
 - Compute everything computable ...
 - (weaker models exist (circuits, DFA) but they don't compute everything)
 - In fact ... there exists one TM that computes everything computable!
 - ... but some problems not computable ☹️
- Can be used to measure complexity ...
 - P = poly time = efficient
 - EXP \neq P inefficient
 - NP \neq P? desired to be efficient, believed inefficient.
- STCT Challengers: Randomness and Quantum
 - BPP (can do stuff not known to be in P), status also unknown

STCT = Strong
Turing Church
Thesis

$T(n)$ any how
 $\Rightarrow T(n)^c$
on TM.

1. Quantum computing

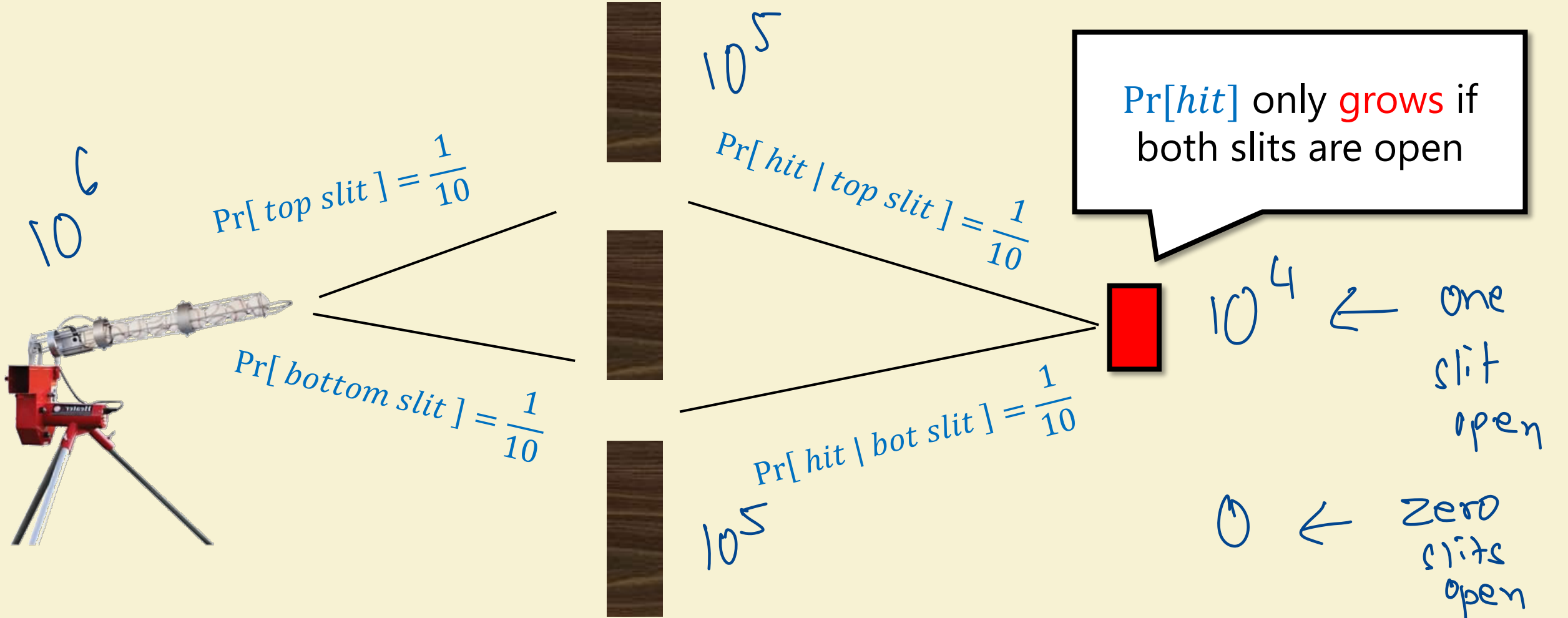
Physics 500BC-1920's: Clockwork universe

- A **physical theory** has basic objects ("particles") and **forces** between them.
- Given **state** of all particles at time t , can compute **state** at time $t + 1$
- If universe has N particles, we can **represent state** with $O(N)$ numbers and **compute** one time-step in $O(N)$ or $O(N^2)$ time.

Examples: Newtonian mechanics, Maxwell's equations, Special and general relativity (& TM Configurations!)

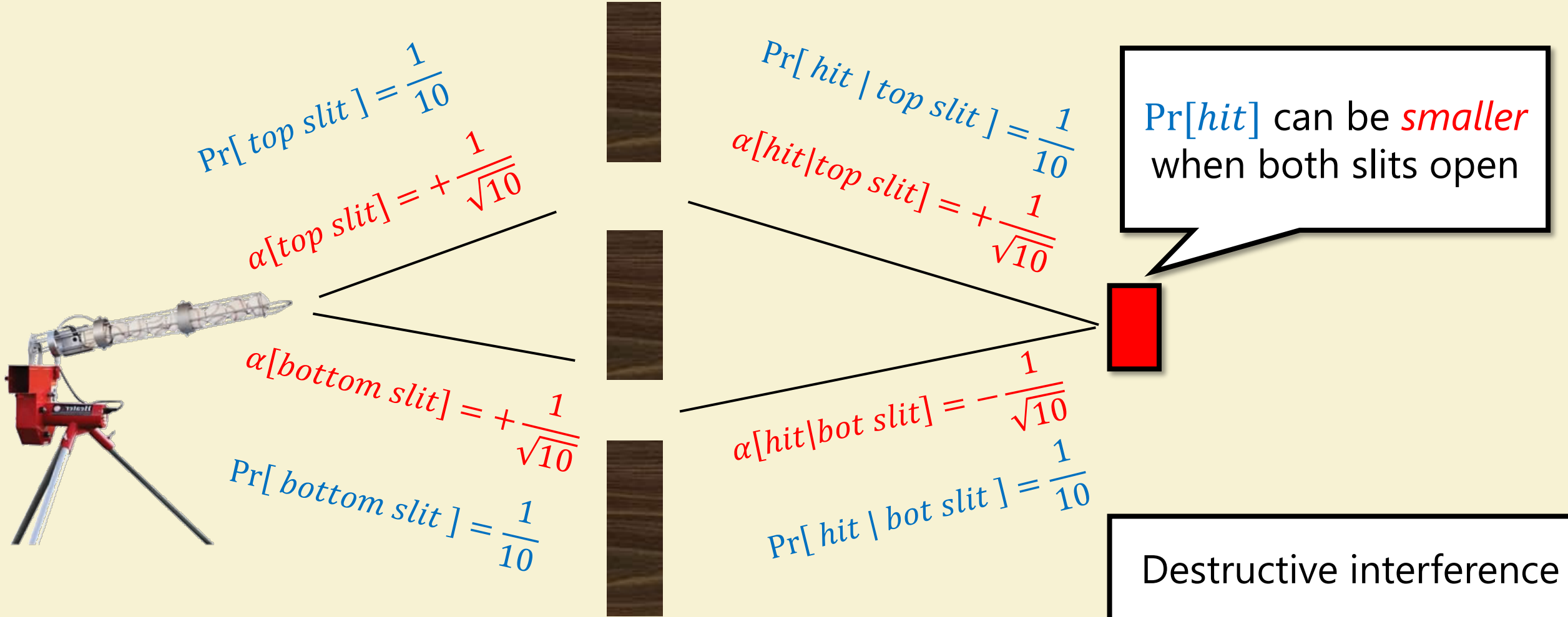
Quantum Mechanics is not a "clockwork" theory!

Double slit experiment: classical view



$$\Pr[\text{hit}] = \Pr[\text{hit}|\text{top}] \cdot \Pr[\text{top}] + \Pr[\text{hit}|\text{bot}] \cdot \Pr[\text{bot}] = \frac{1}{10} \cdot \frac{1}{10} \cancel{\cdot} \frac{1}{10} \cdot \frac{1}{10} = \frac{2}{100} \quad \begin{matrix} \text{or two slits} \\ 0 \\ 100 \end{matrix}$$

Double slit experiment: quantum view*



$$\Pr[\text{hit}] = (\alpha[\text{hit} | \text{top}] \cdot \alpha[\text{top}] + \alpha[\text{hit} | \text{bot}] \cdot \alpha[\text{bot}])^2 = \left(\frac{1}{\sqrt{10}} \cdot \frac{1}{\sqrt{10}} - \frac{1}{\sqrt{10}} \cdot \frac{1}{\sqrt{10}} \right)^2 = 0$$

Quantum weirdness II

Measuring if an event happens **collapses** the amplitude – the event happens with probability α^2 and doesn't happen with probability $1 - \alpha^2$

An event can depend on particles that are far from each other – measurement can create **"spooky correlations at a distance"**.

Implications to computing

$$\sum_{a \in \{0,1\}^m} \left(\sum_{x \mid f(x)=a} 2^{-n} \right) \cdot |a|$$

- Probabilistic computing:

- Let $f: \{0,1\}^n \rightarrow \{0,1\}^m$ be polytime computable
- Can put computer in the configuration $2^{-n} \cdot \sum_{x \in \{0,1\}^n} f(x)$
- Allows us to compute "average(f)", "variance(f)" etc.

- Quantum computing:

- Let $f: \{0,1\}^n \rightarrow \{0,1\}^m$ be polytime computable
- Can put computer in the configuration $2^{-\frac{n}{2}} \cdot \sum_{x \in \{0,1\}^n} (-1)^{x_0} f(x)$
- Allows us to compute ?

$$2^{-\frac{n}{2}} \cdot \sum_{x \in \{0,1\}^n} (-1)^{x_0} f(x)$$

$$\begin{aligned} -1 & \text{ if } x_0 = 1 \\ 1 & \text{ if } x_0 = 0 \end{aligned}$$

Some quantum computing history

- **1981:** Feynman talks about difficulty of simulating quantum physics with classical computers, speculates maybe a different computer would work.
- **1985:** David Deutsch starts studying quantum computers in their own right.
- **1993:** Bernstein and Vazirani give formal definitions, first formal evidence of exponential speedup. BQP
- **Spring 1994:** Simons gives "period finding" algorithm for functions $f: \mathbb{Z}_2^n \rightarrow \mathbb{Z}_2^n$.
- **Fall 1994:** Shor gives "period finding" algorithm for functions $f: \mathbb{Z}_N \rightarrow \mathbb{Z}_N$ and show it implies a polynomial-time factoring algorithm. Field explodes. Given integer A , can factor it int time $\text{poly}(\log A)$

More details:

- Model: Quantum Turing Machine or (uniform) Quantum circuits
 - Uniform circuit = constructed in time poly in its size.
- Complexity Measure: Quantum time/Quantum size (equal up to poly factors, due to uniformity)
- Complexity Class: BQP – Boolean functions computable in Poly time.

Bounded-Error

Quantum

Poly time .

Thms: $P \subseteq BQP$, $BPP \subseteq BQP$, $BQP \subseteq EXP$

Moral of the story

- Importance of STCT!
 - Axioms of quantum physics being tested by STCT!
 - Tools used to establish tests: from CS 121/221/321....

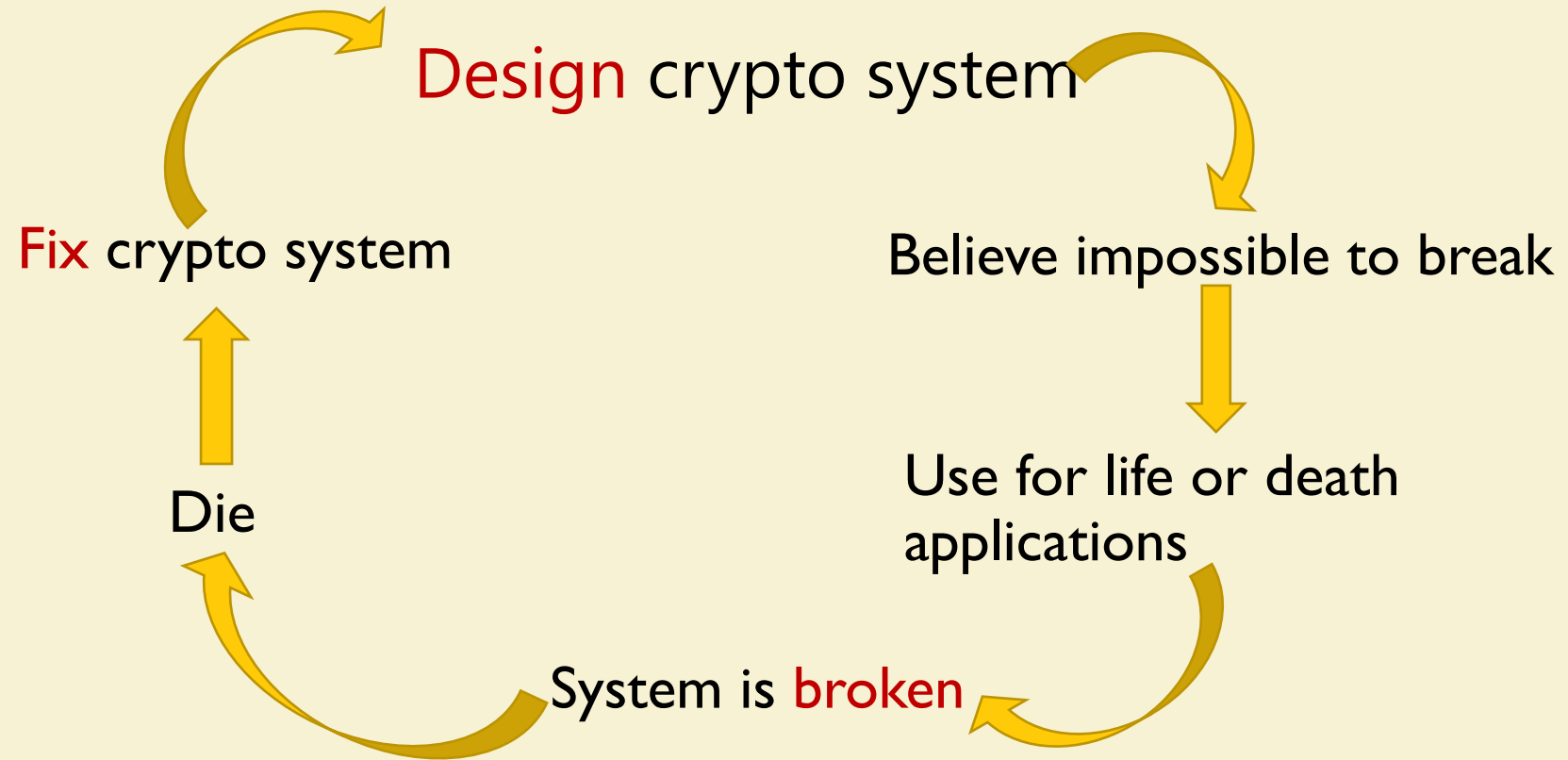
Chapter 23 in text!

2. Cryptography

Cryptography

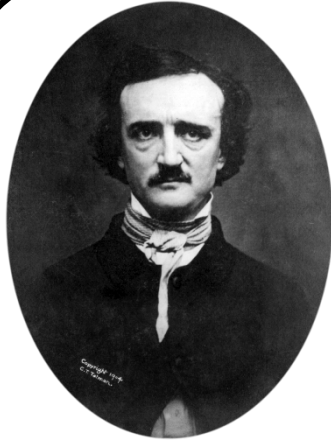
- Very subtle – long history of people getting it wrong
- Can't be taught in one class, not even one term
- Our focus is connection between **cryptography**, **computational complexity**, and **randomness**.

History of Crypto: 3000BC-1976



History of Crypto: 3000BC-1976

Design crypto system



“Human ingenuity cannot concoct a cipher which human ingenuity cannot resolve.”

Edgar Allan Poe, 1841

System is broken

Example 1: Mary's cipher



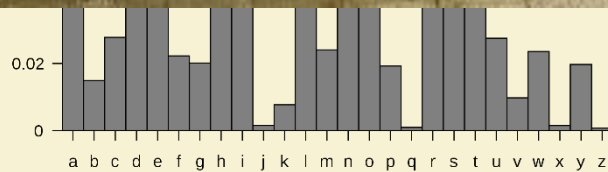
Mary queen of Scots
cousin of Elizabeth I
Communist

A	B	C	D	E	F	G	H	I
1	2	3	4	5	6	7	8	9

Sir Francis Walsingham



Handwritten text in a cipher script, likely the Mary's cipher, consisting of several lines of characters.



Example 2: Enigma

A typewriter that based on wires and rotor setting would emit different letter for every keypress.



About 10^{113} possibilities to set the wirings and rotors.

Lightspeed supercomputer will take $\gg 10^{17}$ years to check them all

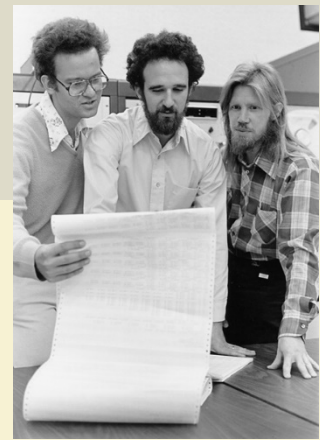
(universe is only 10^{10} years old)

Believed impossible to break by Germans.

Broken (following Polish advances) via heroic efforts by British at Bletchley park

- Cut German U-Boat success in sinking ships by ~90%
- Sank about 60% of German U-Boats in Mediterranean
- Crucial to success of Normandy D-day landing.

Modern Cryptography (1976-)



"We stand today on the brink of a revolution in cryptography"

Whit Diffie and Martin Hellman, 1976



	Data	Cycles	Person-years	Result
Mary's cipher	10^4 bytes	N/A	1	✗ Broken
Enigma	10^7 bytes	10^{13}	10^5	✗ Broken
1976				
Diffie-Hellman/RSA	10^{22} bytes	10^{25}	10^8	✓ Unbroken!

DH/RSA are *simpler* than Enigma, and allow *public* encryption key

Security through obscurity  Security through simplicity

Modern cryptography

Today we stand on a brink
of a revolution in cryptography

- Key insight: $NP \neq P$ on steroids
- There exist "one-way" functions $f: \{0,1\}^n \rightarrow \{0,1\}^n$ such that:
 - f is easy to compute (in $\text{poly}(n)$ time)
 - f is hard to invert (Given $f(x)$, hard to find any x' such that $f(x') = f(x)$)
 - (Exercise: Prove that if $NP=P$, then such functions don't exist!)
- 3 Phases of modern crypto:
 - Phase 1: Diffie/Hellman, Rivest/Shamir/Adleman: Realized above, and used sheer ingenuity to build some crypto primitives (encryption, signature, key distribution)
 - Phase 2: Blum/Goldwasser/Micali/Yao: Used principles of CS (!!!reductions!!!) to "automate" development of cryptography. Start with o.w.f., + build almost everything else from them! Proven secure unless owf breaks.
 - Phase 3: ... Barak/Gentry/Sahai/Waters ... : Ingenuity+Principles: Homomorphic Encryption, Obfuscation

Computational Secrecy

There are not in nature two real, absolute beings, indiscernible from each other", Gottfried Wilhelm Leibniz



"Identity of Indiscernibles Principle"

a.k.a "If two distributions cannot be distinguished by polynomial-time algorithms, they may as well be the same"

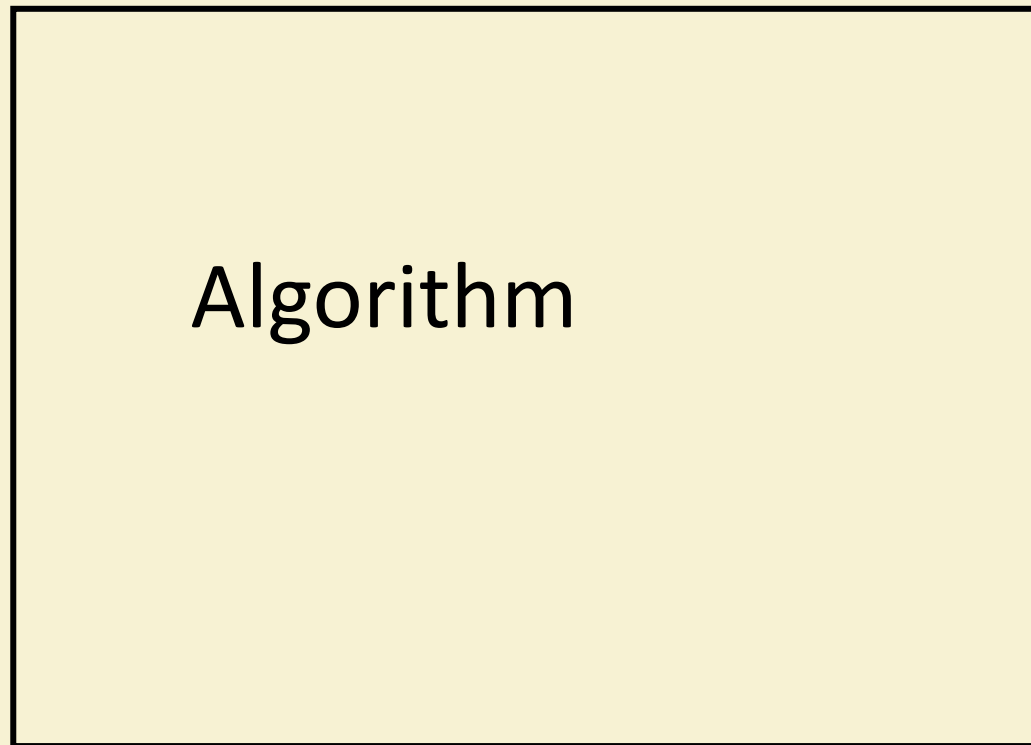
Cryptography vs. security



What we *didn't* see

(and where to see it.)

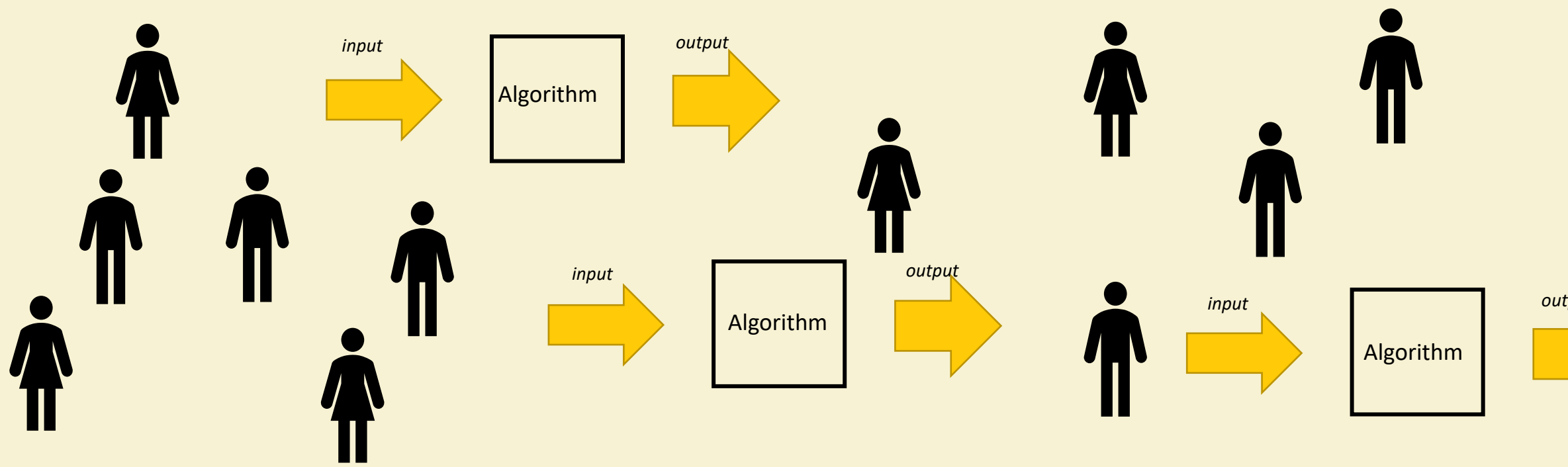
input



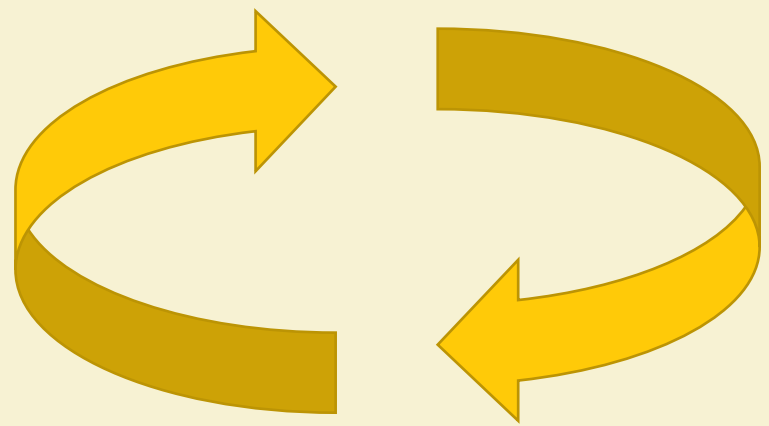
Algorithm

output

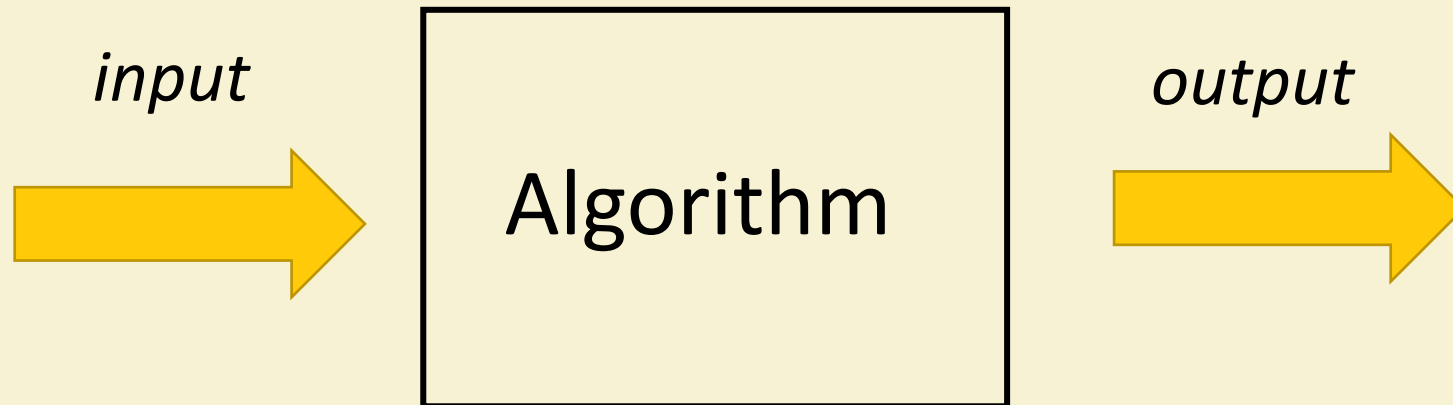




Data



Decisions



Who supplies the input? And what do we do with the output?

Incentives, mechanism design (CS 13x, 23x)

Privacy , Fairness (CS126, CS208)

Cryptography/security(CS 127/227, CS 263, MIT 6.857, MIT 6.875)

Average case complexity, learning, generalization (CS 181, 183, 228)

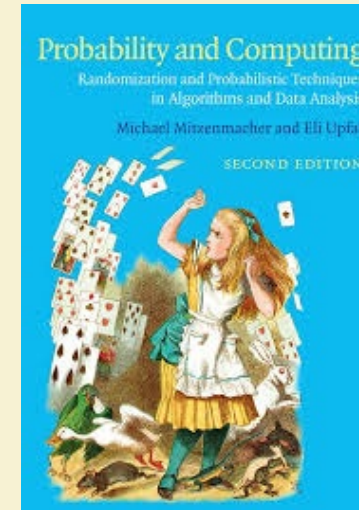
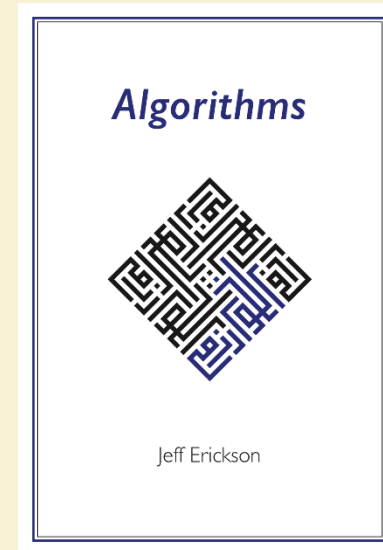
Surprising algorithms and data structures

<http://algorithms.wtf/>

Multiply n bit numbers in $\ll n^2$ time.

Multiply $n \times n$ matrices in $\ll n^3$ time.

Solve linear programming in $\text{poly}(n)$ time.



<http://www.designofapproxalgs.com/>

Answer query “ $i \in S?$ ” in $O(1)$ time. (*dictionaries, hash tables*)

Answer query “ $\text{dist}(u, v) < k?$ ” in $\ll n$ time. (*distance oracles, nearest neighbors*)

CS 124, CS 222/223, MIT 6.854

More on computational complexity

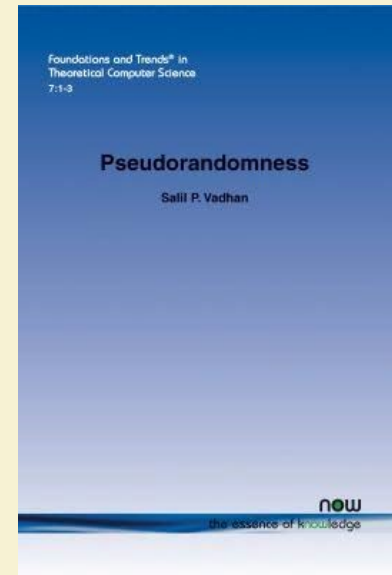
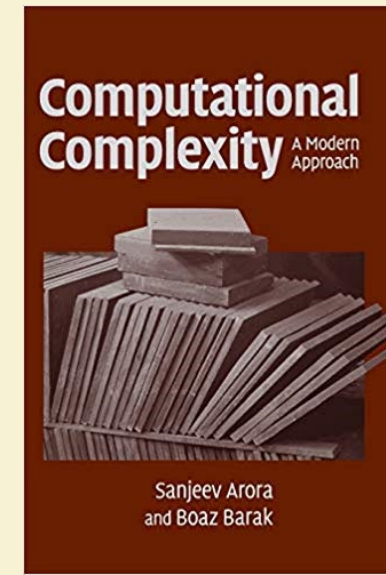
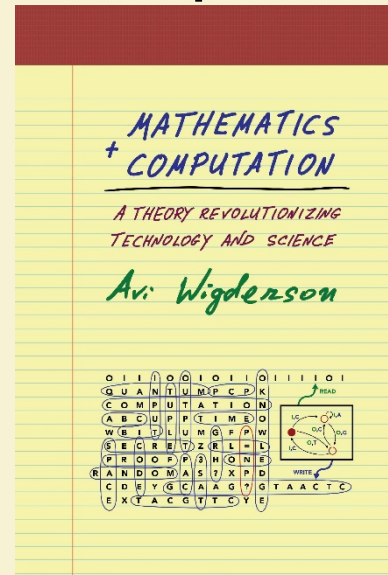
- Hardness of approximation and probabilistically checkable proofs.
- Lower bounds for concrete computational models.
(For general Boolean circuits, can't rule out $6n$ gate circuit for 3SAT!)
- Derandomization from weaker assumptions.

CS 221 , MIT 6.841

<https://www.math.ias.edu/avi/book>

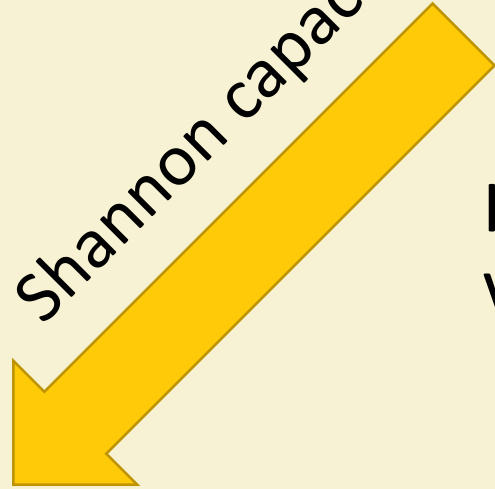
<https://theory.cs.princeton.edu/complexity/>

<https://people.seas.harvard.edu/~salil/pseudorandomness/>




Information Theory / Entropy


Shannon capacity



KL div.
VC dim.



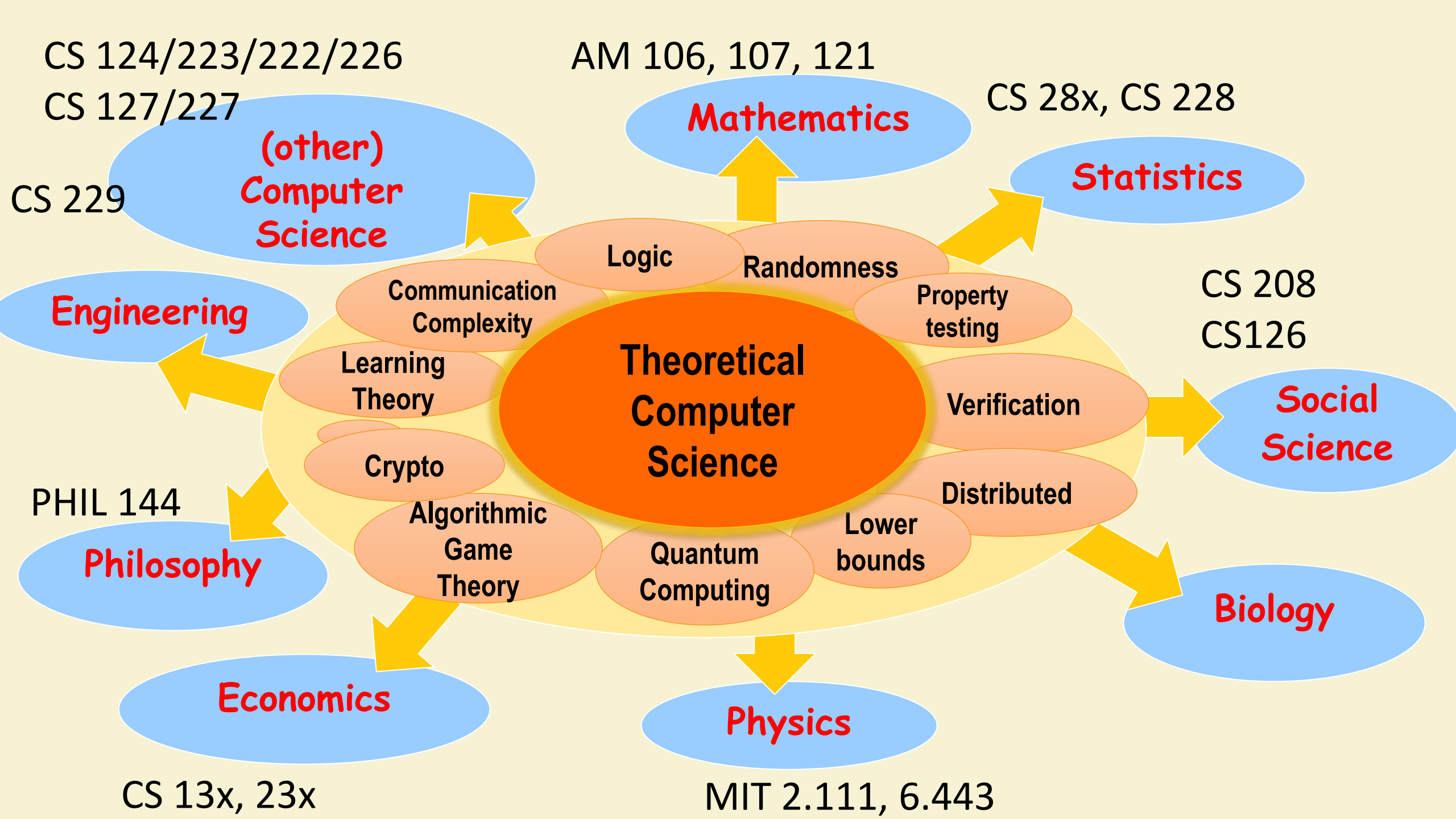
Communication
Complexity



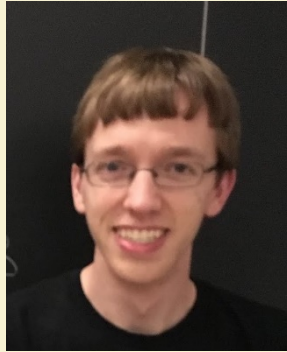
Error
correcting
codes CS 229

Machine
Learning
CS 18x/28x/ 228

Data CS 224/226
structures
lower bounds



Thank You to ...



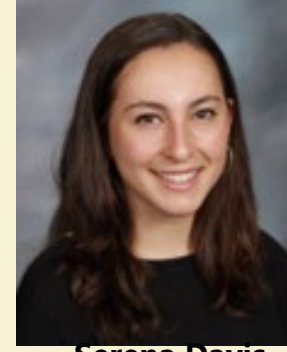
Adam Hesterberg



William Burke



Amy Wang



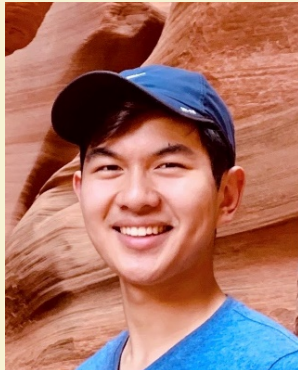
Serena Davis



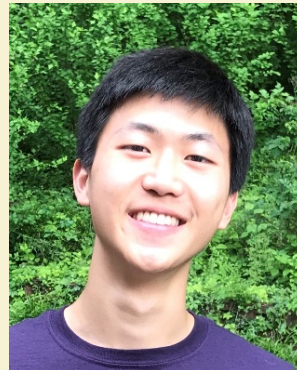
Nari Johnson



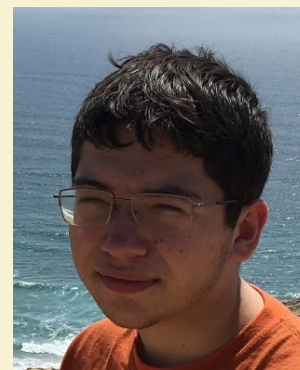
Joanna Boyland



Kevin Chen



Max Guo



Diego Gutierrez



Eric Lin



Ife Omidiran



James Roney



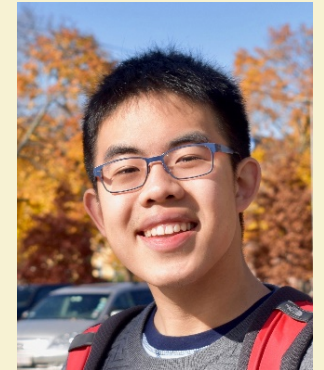
Noah Singer



Zuzanna Skoczylas



Sahana Srinivasan



Richard Xu

