

**Beauty and Joy of Computing**

**Limits of Computing**


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(Slides inspired by Dan Garcia's slides.)

**Computer Science Research Areas**

- Artificial Intelligence
- Biosystems & Computational Biolo
- Database Management Systems
- Graphics
- Human-Computer Interaction
- Networking
- Programming Systems
- Scientific Computing
- Security
- Systems
  - **Theory**
    - Complexity theory
    - ...



[www.eecs.berkeley.edu/Research/Areas/]

**Revisiting Algorithm Complexity**

A variety of problems that:

- are tractable with efficient solutions in reasonable time
- are intractable
- are solvable approximately, not optimally
- have no known efficient solution
- are not solvable

**Revisiting Algorithm Complexity**

Recall:

- **running time** of an algorithm: how many steps does the algorithm take as a function of the size of the input
- various **orders of growth**, for example:
  - constant
  - logarithmic
  - linear
  - quadratic
  - cubic
  - exponential

Examples ?

**Revisiting Algorithm Complexity**

Recall:

- **running time** of an algorithm: how many steps does the algorithm take as a function of the size of the input
- various **orders of growth**, for example:
  - constant
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} **Efficient:**  
order of growth is polynomial  
Such problems are said to be "in P" (for polynomial)

**Intractable Problems**

- Can be solved, but not fast enough; for example
  - exponential running time
- also, when the running time is polynomial with a huge exponent (e.g.,  $f(n) = n^{10}$ )
- in such cases, can solve only for small n...

**Hamiltonian Cycle**

**Input:** cities with road connections between some pairs of cities

**Output:** possible to go through all such cities (every city exactly once) ?

Notice: YES/NO problem  
(such problems are called **decision problems**)

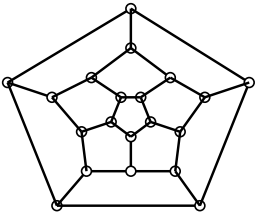
**Hamiltonian Cycle**

**Input:** cities with road connections between some pairs of cities

**Output:** possible to go through all such cities (every city exactly once) ?

PEER INSTRUCTION:  
For this input, is there a Hamiltonian cycle ?

(a) Answer YES  
(b) Answer NO

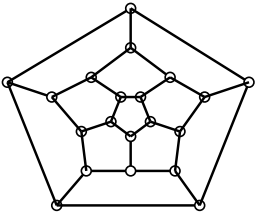


**Hamiltonian Cycle**

**Input:** cities with road connections between some pairs of cities

**Output:** possible to go through all such cities (every city exactly once) ?

What did you do to solve the problem ?



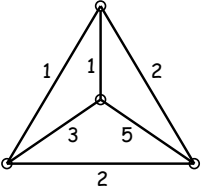
**Traveling Salesman Problem**

**Input:** cities with road connections between pairs of cities, roads have lengths

**Output:** find a route that goes through all the cities, returns to the origin, and minimizes the overall traveled length

PEER INSTRUCTION:  
For this input, what is the shortest possible length ?

(a) total length 7  
(b) total length 8  
(c) total length 9  
(d) total length 10

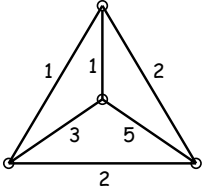


**Traveling Salesman Problem**


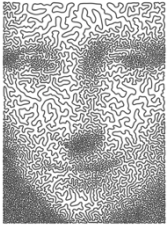
**Input:** cities with road connections between pairs of cities, roads have lengths

**Output:** find a route that goes through all the cities, returns to the origin, and minimizes the overall traveled length

Not a decision problem...  
But we can ask:  
Is there a route shorter than x ?



**Traveling Salesman Problem**

David Applegate, Robert Bixby, Vašek Chvátal, William Cook      Bob Bosch (TSP Art)

### Hamiltonian Cycle vs Traveling Salesman

- suppose we have a magic device that solves the Traveling Salesman Problem
- can we use it to solve the Hamiltonian Cycle ?

This is called a **reduction**. Find a solution to one problem, then all others that reduce to it can be solved!

### P vs NP

Recall: P = problems with polynomial-time algorithms

We do not know how to solve Hamiltonian Cycle or Traveling Salesman in polynomial time! (No efficient solution known.)

But...

If we "guess" a permutation of the cities, we can easily **verify** whether they form a cycle of length shorter than x.

**NP** = problems whose solutions can be efficiently verified (N stands for non-deterministic [guessing]; P is for polynomial)

### P vs NP

P = problems with polynomial-time algorithms

NP = problems whose solutions can be efficiently verified

The BIG OPEN PROBLEM in CS: **Is P = NP ???**

\$1,000,000 reward  
<http://www.claymath.org/millennium-problems>

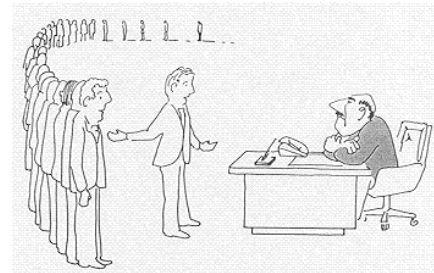
A problem is **NP-hard** if all problems in NP reduce to it.

I.e., efficiently solving an NP-hard problem gives efficient algorithms for all problems in NP!

An NP-hard problem is **NP-complete** if it is in NP.

Examples: Hamiltonian Cycle, Traveling Salesman Problem, ...

### NP-complete problem: what to do ?



What to tell your boss if they ask you to solve an NP-complete problem:  
"I can't find an efficient solution but neither can all these famous people."

<http://max.cs.kzoo.edu/~kschultz/CS510/ClassPresentations/NPCartoons.html>

### NP-complete problem: what to do ?

Another option: **approximate** the solution

- Seems unlikely to solve exactly but sometimes can get "close" to the optimum

- For example, traveling salesman:

- If the input is a metric (satisfies the triangle inequality), then we can efficiently find a solution that is not worse than 1.5x optimum

### Beyond NP: Unsolvable problems

Are there problems that, no matter how much time we use, we cannot solve ?

Some terminology:

- Decision problems: YES/NO answer

- Algorithm is a **solution** if it produces the correct answer in a finite amount of time

- Problem is **decidable** if it has a solution



Alan Turing  
proved that not all  
problems are decidable!

### Review: Proof by Contradiction

How many primes are there ?



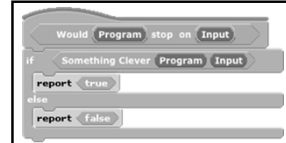
Euclid

[www.hisschemoller.com/wp-content/uploads/2011/01/euclides.jpg](http://www.hisschemoller.com/wp-content/uploads/2011/01/euclides.jpg)

### Beyond NP: The Halting Problem

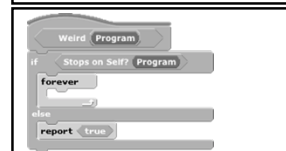
Input: a program and its input

Output: does the program eventually stop ?



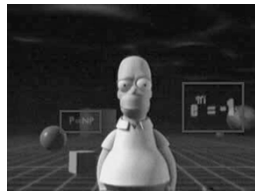
Turing's proof, by contradiction:

- Suppose somebody can solve it
- Write Stops on Self
- Write Weird
- Call Weird on itself...



### Conclusions

- Complexity theory: important part of CS
- If given an important problem, rather than try to solve it yourself, see if others have tried similar problems
- If you do not need an exact solution, approximation algorithms might help
- Some problems are not solvable!



<http://www.win.tue.nl/~gwoegi/P-versus-NP.htm>

### P = NP ?

PF'03



\* SORRY, THIS CARTOON IS TOO SMALL TO CONTAIN THE PROOF

Pavel Pudlák