

Computational complexity that matters & Other models of computation

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Monday, April 27, 2009

Summary from last week

- There exists no program solving the **Halting problem**
- There exists an infinite number of **unsolvable problems**
 - Fortunately, most problems we need to solve are solvable
- Being solvable does not mean not mean practically solvable
- Many optimization problems arising in applications take too much time to be solved exactly

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Computational Complexity

- Programs written were based on given algorithms
 - often used libraries
 - did not formally analyze programs with respect to their efficiency
 - did run-time comparisons
 - Some studies on the impact of the input size as well as the choice of the algorithm/data structure used

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Computational Complexity of a Problem

Refers to the time needed to solve the problem in terms of its input size n , independent of the machine

- For a graph, the input size is the number of nodes and the number of edges
- For detecting percolation in a grid, it is the size of the grid
- For the demon algorithm, it is the number of particles to simulate
 - Parameters driving the simulation are relevant as well
 - Exact simulation is not feasible

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Measuring complexity

- Measured as **$O(f(n))$** – (big-Oh-notation)
 - Time is bounded by $c \cdot f(n)$ for some constant c
 - Time is proportional to $f(n)$ (ignoring a constant)
- **Examples**
 - Binary search in a sorted list: $O(\log_2 n)$
 - Searching in an unsorted list: $O(n)$
 - Finding the connected components of a graph: proportional to the number of node and edges
 - MCL Clustering: bounded by $O(n^3)$ for a graph with n nodes; usually faster

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Performing $T(n)$ steps when executing 1 billion steps/second

n	$T(n) = n$	$T(n) = n^2$	$T(n) = n^3$	$T(n) = 2^n$
5	0.005 microsec	0.03 microsec	0.13 microsec	0.03 microsec
10	0.1 microsec	0.1 microsec	1 microsec	1 microsec
20	0.02 microsec	0.4 microsec	8 microsec	1 millisec
50	0.05 microsec	2.5 microsec	125 microsec	13 days
100	0.1 microsec	10 microsec	1 millisec	4×10^{13} years

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Detecting percolation in a grid of size $N \times N$

Wavefront and recursion functions gave somewhat different performance, but have the same asymptotic worst-case complexity.

What bounds the minimum and maximum number of steps the algorithms take (proportional to N)?

- | | Min | Max |
|----|------------|-------|
| A. | N | N |
| B. | N^2 | N^2 |
| C. | N | N^2 |
| D. | $\log_2 N$ | N |

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Dictionaries support operations on key-value pairs.

Which operations are not provided and would be inefficient?

1. Update the value associated with a given key
2. Delete the entry with the minimum key
3. Determine that a given key is in the dictionary
4. Determine the next largest key in the dictionary

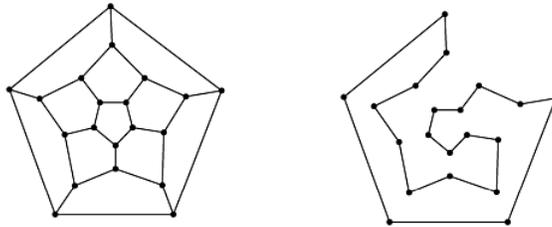
- A. None
 B. 4
 C. 1, 2, and 3
 D. 2 and 4

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Is there a Hamiltonian Cycle?

Given an n node graph, does there exist a cycle that visits all nodes and every node exactly once?



Why do we care to know?

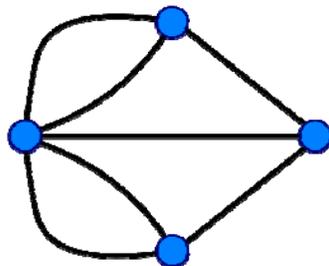
It is a basic graph property allowing one to visit all nodes in a certain way

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Isn't it similar to the Euler Tour?

- **Euler Tour/Cycle**
 - Travel on **every edge** exactly one; nodes can be visited more than once
 - Efficient solutions exist



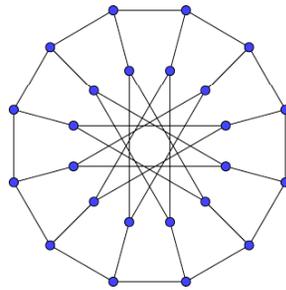
A connected, undirected graph contains an Euler tour exist if and only if every node has even degree.

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Hamiltonian Cycle

- Visit **every node** exactly once
- Easy to solve in exponential time (consider all permutations of the nodes, each corresponding to a cycle)
- No polynomial=efficient time solution is known



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Formula Satisfiability

Given a Boolean formula, does there exist a true/false assignment of the variables making the formula true?

$$(A \vee B \vee \neg C) \wedge (A \vee \neg B \vee D) \wedge (C \vee \neg D) \wedge (\neg A \vee B \vee D) \wedge (\neg A \vee \neg C)$$

Satisfied by A=true, C=false, D=false, B=true

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Formula Satisfiability

Given a Boolean formula, does there exist a true/false assignment of the variables making the formula true?

$$(A \vee B \vee \neg C) \wedge (A \vee \neg B \vee D) \wedge (C \vee \neg D) \wedge (\neg A \vee B \vee D) \wedge (\neg A \vee \neg C)$$

Satisfied by $A=\text{true}$, $C=\text{false}$, $D=\text{false}$, $B=\text{true}$

- Easy to solve by trying all possible true/false assignments
- This gives exponential time
- No polynomial time solution is known
- Many practical problems can be phrased in terms of Boolean formulas

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What do Formula Satisfiability and Hamiltonian Cycle have in common?

A fair amount with respect to their complexity.

One characteristic:

For both, we can *verify* a given solution easily.

- Given a cycle, we can easily verify if it is a Hamiltonian cycle
- Given a true-false assignment, we can easily verify if it satisfies the formula

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Classes P and NP

P = set of all problems that can be solved in polynomial time

NP = set of all problems whose solution can be verified in polynomial time

Open question: Is $P=NP$?

- one the seven Millennium Problems of the Clay Mathematics Institute
- \$1 Million prize for each
- <http://www.claymath.org/millennium/>

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Hamiltonian Cycle and Satisfiability

- Have no known polynomial time solution
 - Have straightforward exponential time solutions
 - A given solution can be verified efficiently
- and ...

If someone comes up with a polynomial time solution for Hamiltonian Cycle or Satisfiability, then

- $P=NP$
- They get \$1 Million

Problem having this consequence are called **NP-complete**

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How to deal with problems for which no fast solutions exist?

- Thousands of interesting and relevant problems fall into this category – in all disciplines
- They are solved
 - Using heuristic algorithms that generate good, but not optimal solutions
 - Some problems have heuristics that work quite well, others don't
 - Probabilistic methods (Monte Carlo, Simulated annealing)
 - Looking for special cases that can be solved efficiently