


UNIVERSITY of WISCONSIN-MADISON  
Computer Sciences Department

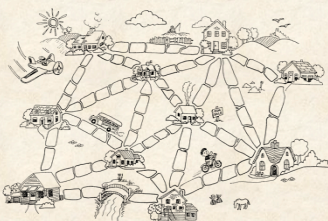
CS 202 Introduction to Computation Professor Andrea Arpaci-Dusseau  
Fall 2010

## Lecture 41: What problems stretch the limits of computation?



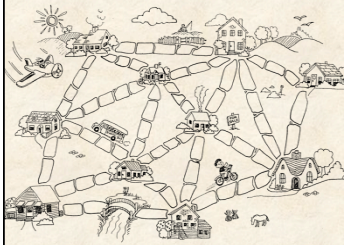
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"You're off the plane, Hal.  
Put the laptop on your desk."

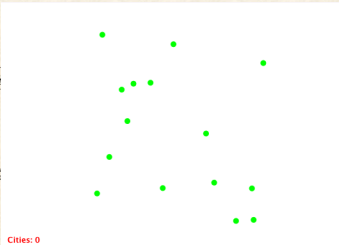


## Handout

Create the minimal spanning tree that connects all of the houses



Construct the shortest route for a Traveling Salesperson



Cities: 0  
Length: 0.00

## Discussion

Is there an inherent difference between  
being brilliant  
and  
being able to appreciate brilliance?









## What is Brilliance?

Ability to find "needle in a haystack"

- Mozart found "satisfying assignments" to our neural circuits for music appreciation
- Relatively easy to identify the fact needle has been found





What is a computational analogue of this phenomenon?

Many hard computation problems require solutions involving "finding a needle in a haystack"

## Compare 4 Algorithms

- Path between nodes of graph
- Minimal spanning tree
- Monkey puzzle
- Travelling salesperson

Which ones are easy and which are hard to solve?

## Problem 1: Path?

Social network or graph

- Each node represents student
- Two nodes connected by edge if those students are friends

Scenario:

- Kate starts a rumor
- Will it reach Ronak?
- Is there a path or connection between two?

What algorithm could you use?

## Problem 1: Path?

Social network or graph

- Each node represents student
- Two nodes connected by edge if those students are friends

Scenario:

- Julia starts a rumor
- Will it reach Ronak?
- Is there a path or connection between two?

How does running time depend on network size (number of edges, E)?

- Never need to visit an edge more than once
- At most  $O(E)$

## Problem 2: Spanning Trees

Goal: Connect all houses (nodes) with **shortest** path (edges)

- Uses: roads and utilities
- Uses: Wiring chips on circuit boards

Algorithm?

- Greedy: make step-by-step decisions that work best for current situation
- Begin: Connect closest pair of nodes
- Each step: Connect to next closest
- Don't need to look at different combinations

### Problem 3: Monkey Puzzle

M=3, N=9

**Given:**

- Set of N square cards with top and bottom halves of colored monkeys
- $N = M^2$
- Cannot rotate cards

**Problem:**

- Is there an arrangement of cards such that each pair of adjacent cards completes a monkey?

**Algorithm?**

### Monkey Puzzle Algorithm

Try every combination of cards and see if it works

- Try every card for 1<sup>st</sup> box
- Try each of remaining cards in 2<sup>nd</sup> box
- Try each of remaining cards in 3<sup>rd</sup> box...
- Etc...

1 <sup>st</sup>	4 <sup>th</sup>	7 <sup>th</sup>
2 <sup>nd</sup>	5 <sup>th</sup>	8 <sup>th</sup>
3 <sup>rd</sup>	6 <sup>th</sup>	9 <sup>th</sup>

Does a greedy algorithm work?  
How many combinations possible?

- $9 * 8 * 7 * 6 * 5 * 4 * 3 * 2 * 1$   
= 9 Factorial = 9!

### Analysis of Monkey Puzzle

For N cards, number of arrangements to examine is N!

Assume can analyze one arrangement in 1 microsecond


How long to solve for N=9, 16, 25?

N	Time to analyze	
9		
16		
25		

Requires brilliance to solve quickly!

### Problem 4: Travelling Salesperson (TSP)

THE 8TH CIRCUIT AS TRAVELED BY MR. LINCOLN IN 1850



**Santa Claus and the traveling salesman problem**

The Santa Claus has a really hard job. He has to visit every house in the world to deliver his gifts. But he also has to visit every city in the world to deliver his letters. It's a challenge that every mathematician would love to solve.

**Travelling salesman problem escalated**

The traveling salesman problem (TSP) is a classic problem in computer science. It's about finding the shortest possible route that visits every city exactly once and returns to the origin city.

**30 Solution for Santa**

Researchers have found a solution for Santa's problem. They used a computer to find the shortest possible route that visits every city exactly once and returns to the origin city.

**13,500 A record**

The researchers used a computer to find the shortest possible route that visits every city exactly once and returns to the origin city. They used a computer to find the shortest possible route that visits every city exactly once and returns to the origin city.

**Applications for TSP**

The traveling salesman problem has many applications. It's used in computer science, logistics, and even in the real world.

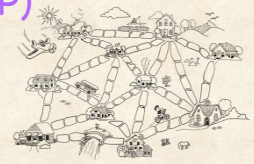
**Applications**

- Politicians
- Visiting all ball parks in US
- Collecting coins from meters
- Delivering mail
- Star imagery
- DNA sequencing
- Computer networks
- Power cables

## Problem 4: Traveling Salesperson (TSP)

**Given:**

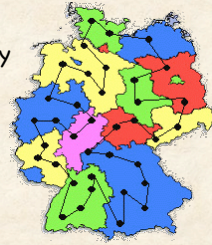
- Weighted graph of nodes for cities and edges for paths (weight is length)



**Problem:**

- Is there a route thru every city (and back to start) with cost < K?
  - Can't revisit same cities

**Algorithm?**



## Traveling Salesperson Solution

**Approach**

- Compute cost of every route

**Worst-case**

- Path connecting every city

**Build every route**

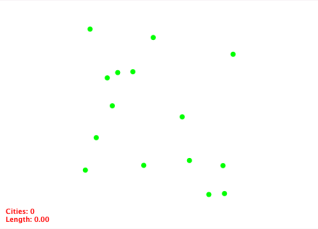
- Pick starting city
- Pick next city (N-1 choices)
- Pick 3<sup>rd</sup> city (N-2) choices

**Number of routes?**

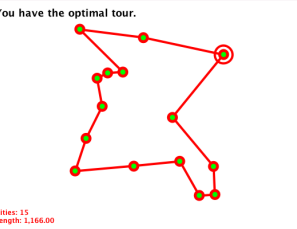
- N! (factorial)
- Greedy algorithm will not work here!




## Try It Yourself



Cities: 0  
Length: 0.00



You have the optimal tour.

Cities: 15  
Length: 1,166.00

30 cities is fun!

## Common Solution for Problems Requiring "Brilliance"

### Exhaustive Search

Naïve algorithms for many "needle in a haystack" tasks involve checking **all possible answers**

- Combinatorial Explosion
- Exponential running time

Common in many interesting problems

Can we design smarter algorithms?

## P vs NP Question

### P: Problems for which solutions exist in polynomial time

- $cN^k$  :  $c$  and  $k$  are fixed integers;  $N$  is input size
- $O(1)$ ,  $O(\log N)$ ,  $O(N)$ ,  $O(N \log N)$ ,  $O(N^2)$ ,  $O(N^3)$
- Example: Searching, sorting, Path, Spanning Tree
- Reasonable, tractable

### NP: Problems where solution can be **checked** in polynomial time

- Examples: Monkey Puzzle, Traveling Salesman
- **Current solutions** require super-polynomial-time
  - $O(2^N)$ ,  $O(N^N)$ ,  $O(N!)$
- Unreasonable, intractable

### Question: Is $P = NP$ ?

- "Can we automate brilliance?"
- Computer scientists have not yet proved equal or not equal

## NP-complete Problems

Problems in NP that are "the hardest"

- If they are in P then so is every NP problem
- All NP-complete problems essentially equivalent

### How do we handle NP-Complete Problems?

#### 1. Heuristics

- Algorithms that produce reasonable solutions in practice

#### 2. Approximation algorithms

- Compute provably near-optimal solutions

## Today's Summary

### P vs NP

- P problems can be **solved** in polynomial time
  - Example: Minimal spanning tree uses a greedy algorithm to find shortest path connecting all nodes
- NP problems can only be **checked** in polynomial time
  - Unknown if polynomial-time solutions exist
  - Naïve solutions exhaustively examine all possibilities

### Announcements

- Sign up for Project 2 demo if you haven't
  - Must be this week! (Mostly tomorrow: Thursday)
- **Final: Dec 22 (Wed) at 10:05 - 12:05 in Psych 113**
  - All Multiple Choice, Not cumulative
    - Sorting (Selection, Insertion, Merge, Quicksort) - Basic algorithm and complexity
    - Web services (Networking, Google, cryptography, lying components)
    - Complexity of problems