

Complexity Theory: NP Hard



Travelling Salesperson Problem (TSP)



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by Christine Alvarado, Mia Minnes, and Leo Porter, 2015.

By the end of this video you will be able to...

- Explain the value (and limitations) of identifying a problem is NP Hard

In TSP, given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and has minimum distance.

**Brute force algorithm: Generate all paths
and choose the shortest**

How many permutations?

~~San Diego~~

~~Cairo~~

Johannesburg

Chennai

Lima

Paris

Beijing

Perth

How many choices for the first city? 1 (San Diego)

How many choices for the next city? 7

How many choices for the next city? 6

How many choices for the next city? 5

How many choices for the next city? 4

How many choices for the next city? 3

How many choices for the next city? 2

How many choices for the next city? 1

How many choices for the last city? 1 (San Diego)

In general we have $(N-1)!$ permutations to try!

TSP Brute Force

N	N!
10	~3.6 million
19	1.22×10^{17} (the age of the universe)
23	# stars in the universe
59	# of atoms in the universe

Yikes!



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Complexity Theory

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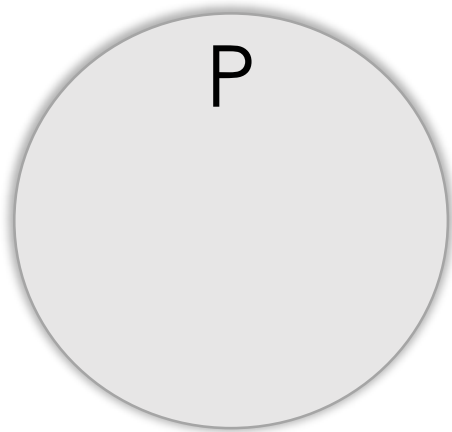
Searching a Linked List – $O(n)$

Sorting an Array – $O(n \log n)$

$n \times n$ Matrix-Matrix Multiply – $O(n^{2.37})$

Complexity Theory

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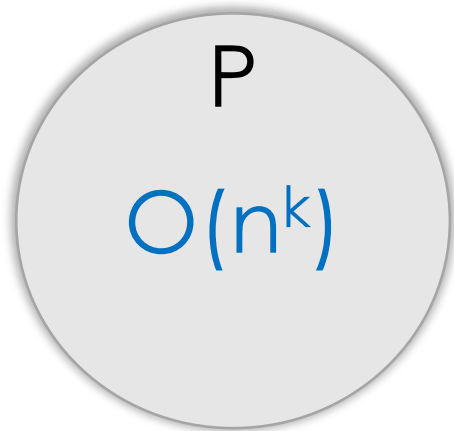
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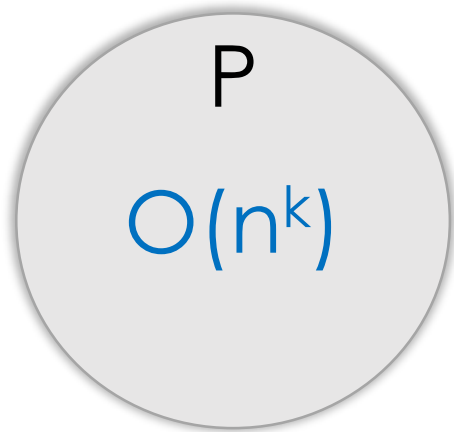
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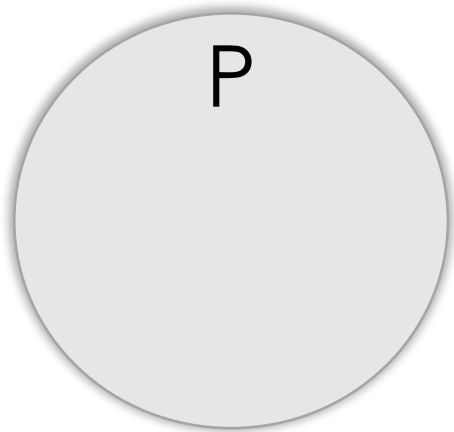
Classifies problems by their inherent difficulty



P stands for "polynomial-time"

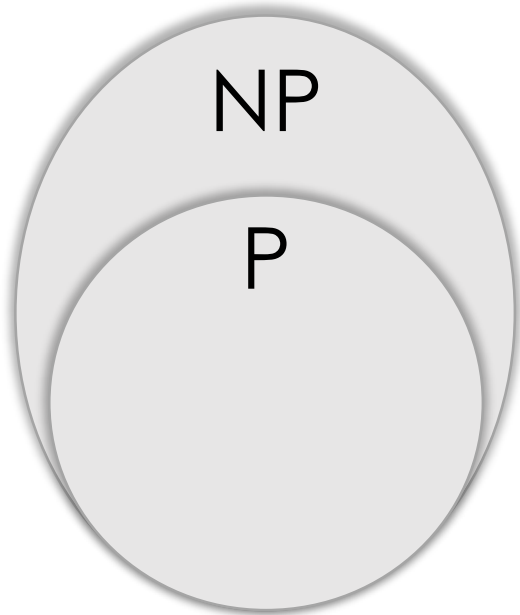
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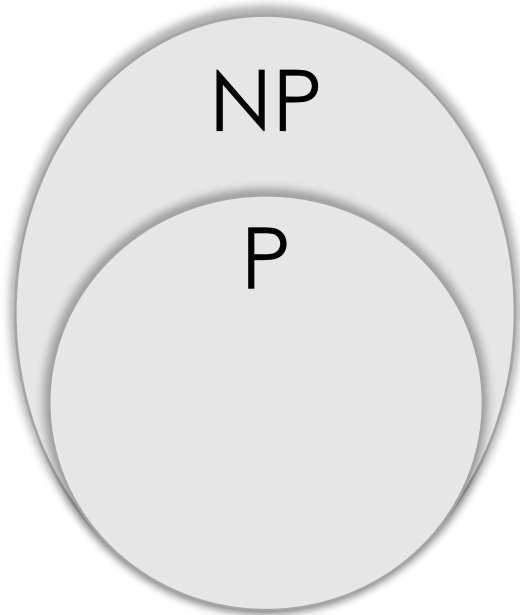
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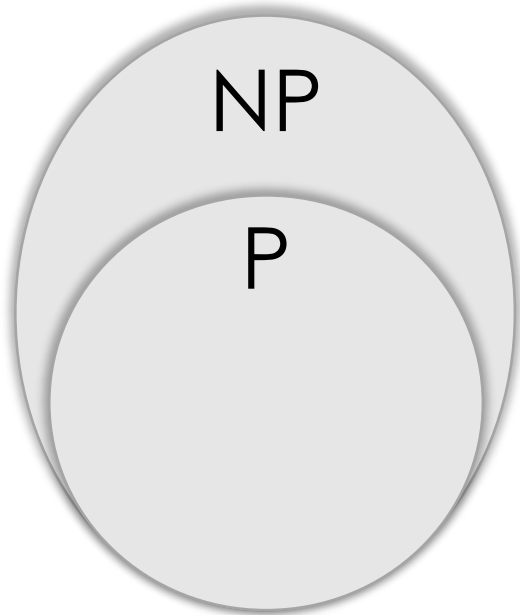
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NP: Some problems seem harder to find solutions, but its still easy to verify solution correctness

Complexity Theory

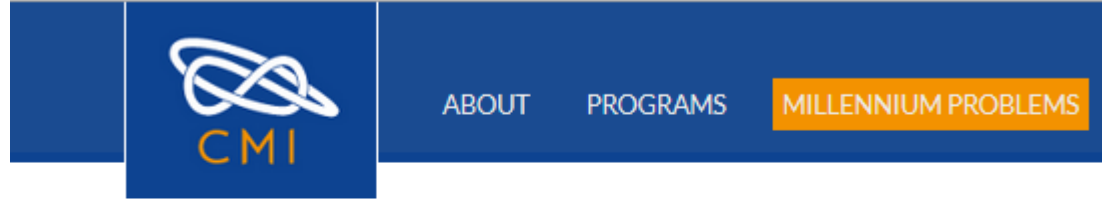
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NP: Some problems seem harder to find solutions, but its still easy to verify solution correctness

NP is *believed* to contain problems harder than P

P ?= NP How to get rich and famous

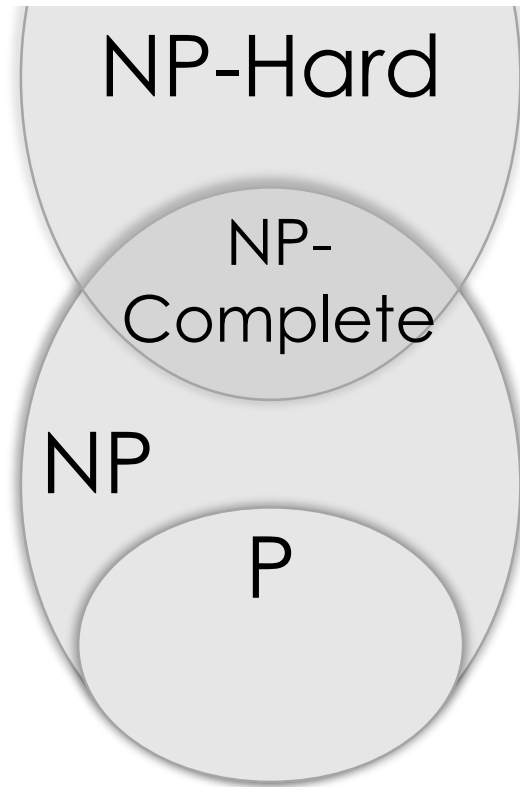


The Millennium Prize Problems

Following the decision of the Scientific Advisory Board, the Board of Directors of CMI designated a \$7 million prize fund for the solutions to these problems, with \$1 million allocated to the solution of each problem.

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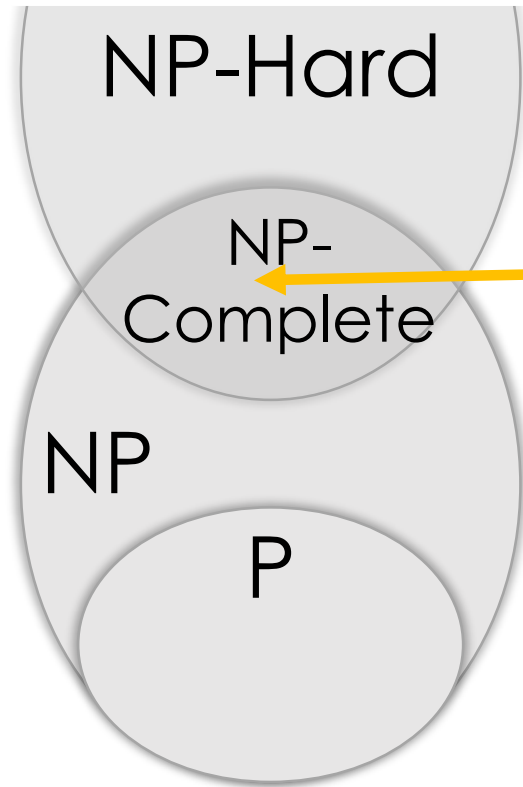
Complexity Theory



Let's expand the classifications a bit

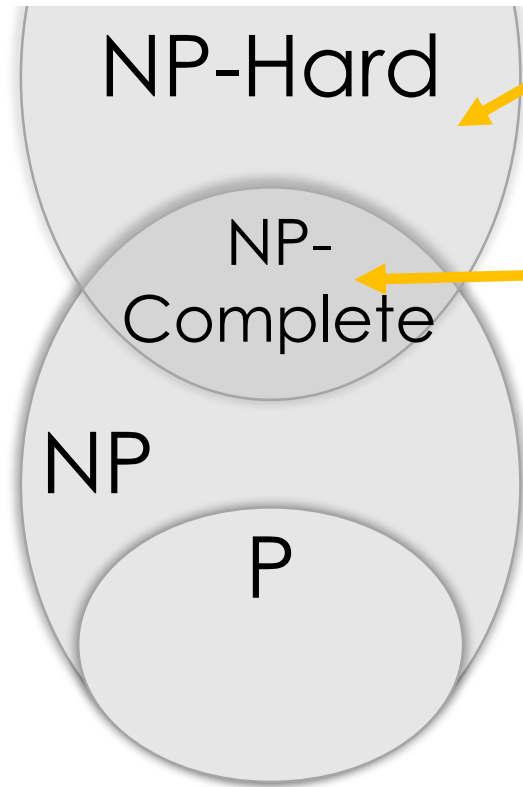
(Hierarchy if $P \neq NP$)

Complexity Theory



NP-Complete: No known polynomial time algorithm to find a solution, but can check a solution in polynomial time

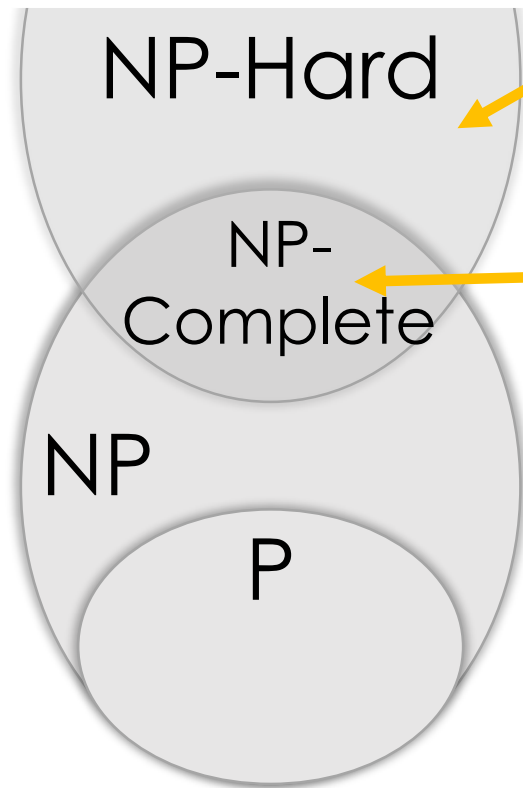
Complexity Theory



NP-Hard: Problems are *at least* as difficult to solve as hardest problems in NP

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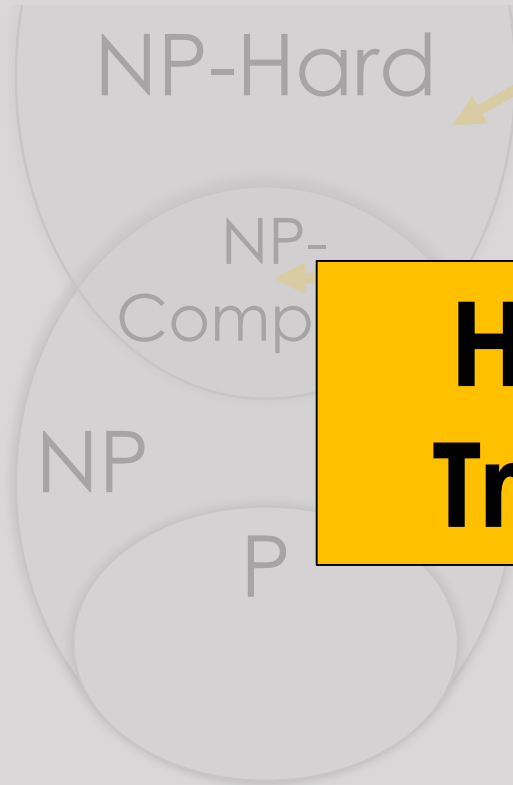


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A polynomial time solution for *any* NP-Hard problem would solve *all* NP-hard problems

Complexity Theory



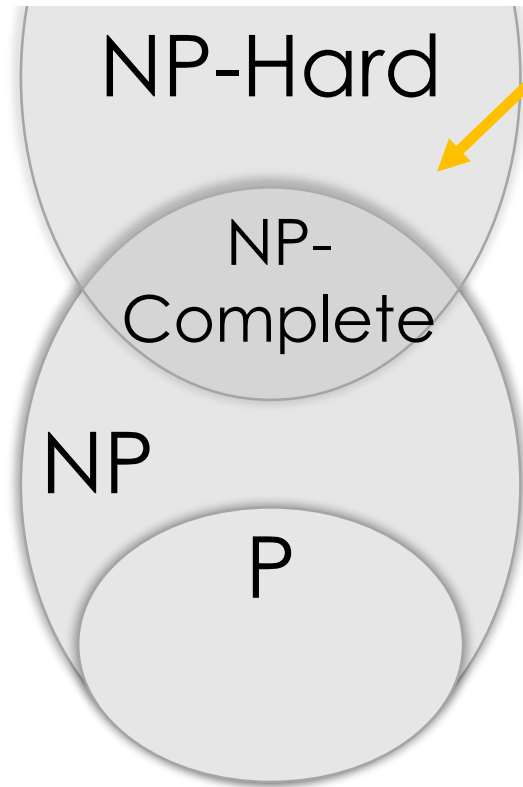
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NP-Complete: No known polynomial time algorithm to find solution, but can time

How does this relate to Travelling Salesperson?

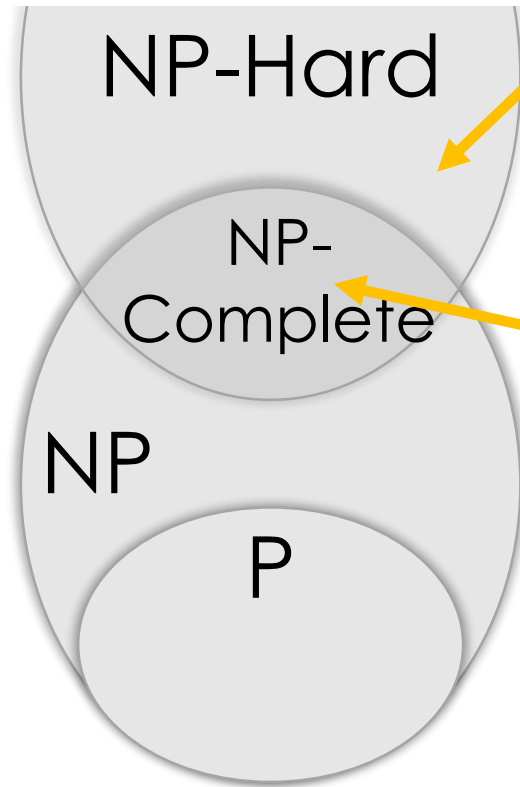
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TSP "optimization": given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has minimum distance**.

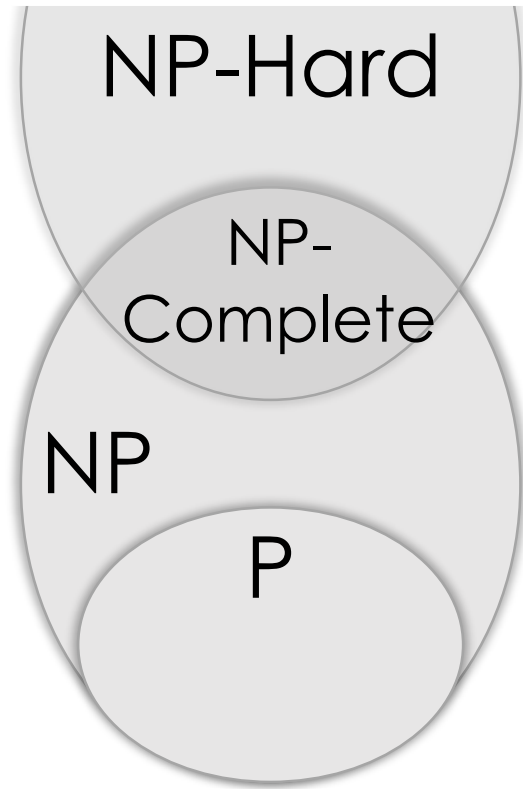
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TSP "**optimization**": given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has minimum distance**.

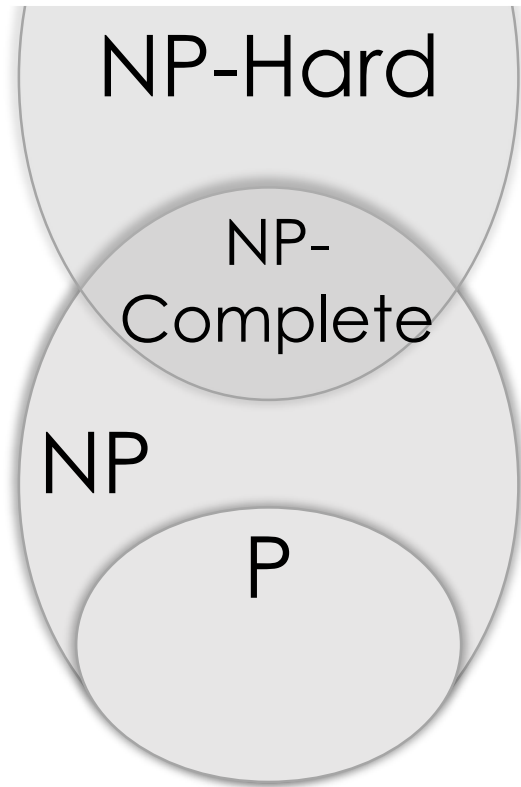
TSP "**decision**": given n cities with one Hometown and all pairwise distances, plan a tour starting and ending at Hometown that visits every city exactly once and **has a distance less than L** .

Complexity Theory



Since TSP "optimization" is NP-Hard, solving it in polynomial time may be difficult (if not impossible)

Complexity Theory



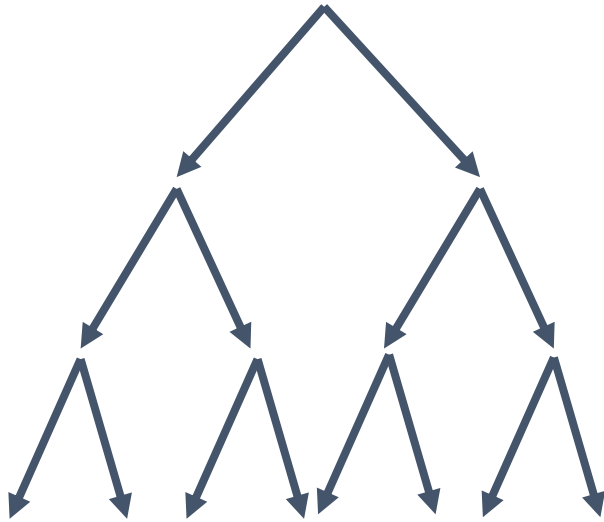
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Story doesn't end here though..

BACKUP

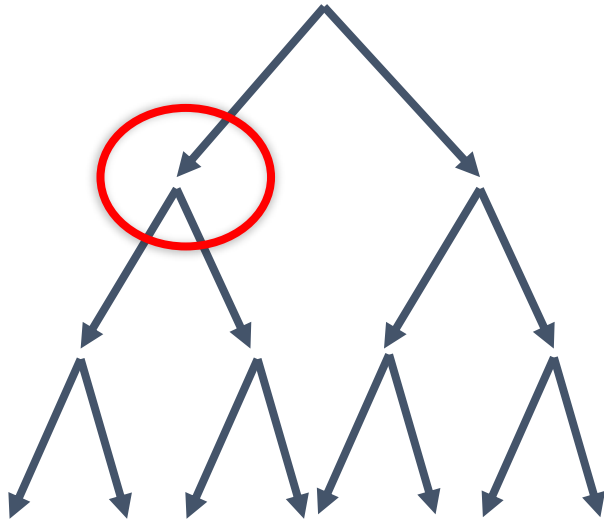
P versus NP

determinism (P)



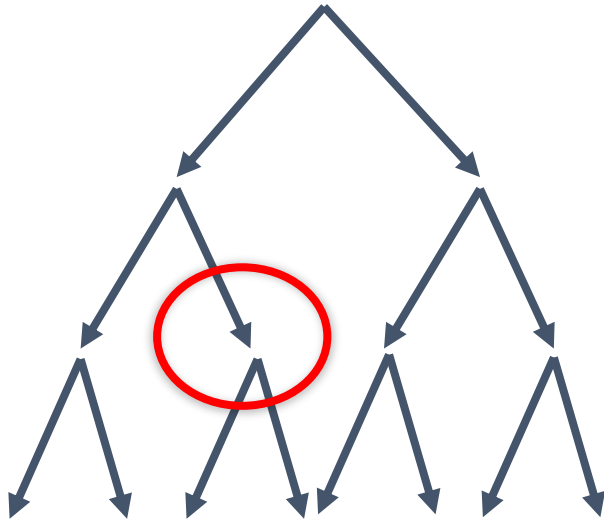
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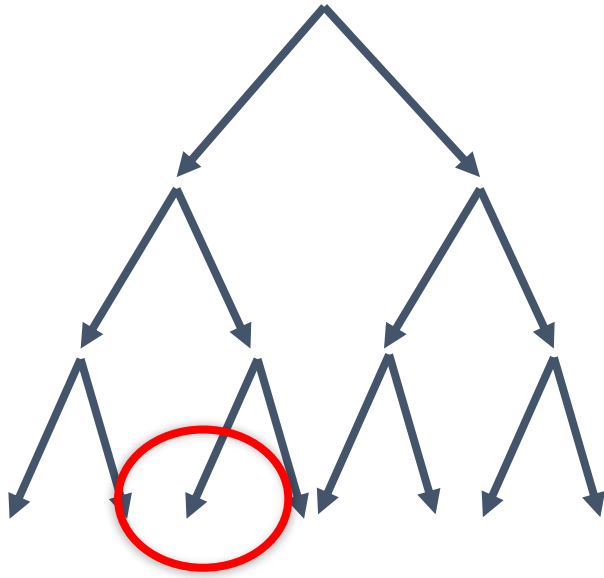
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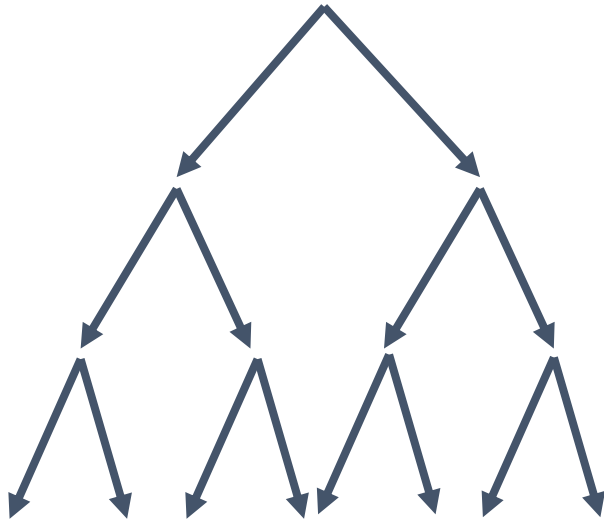
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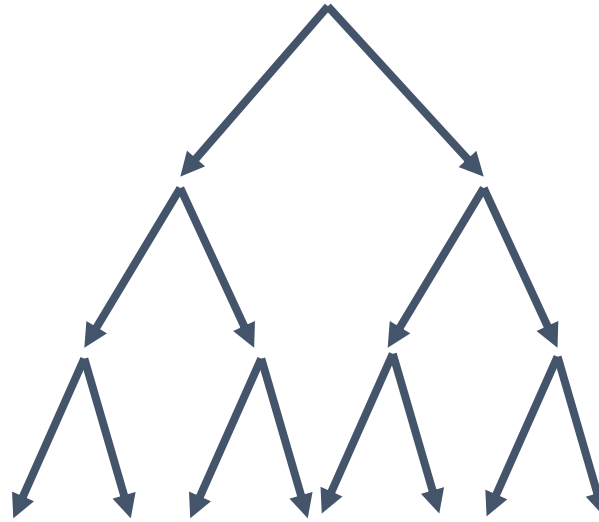


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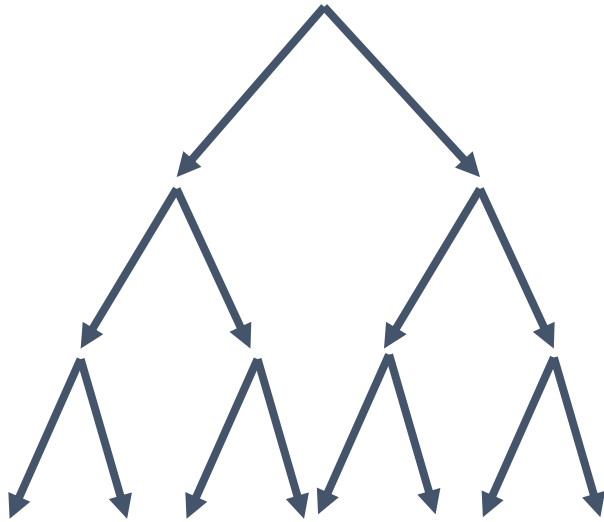


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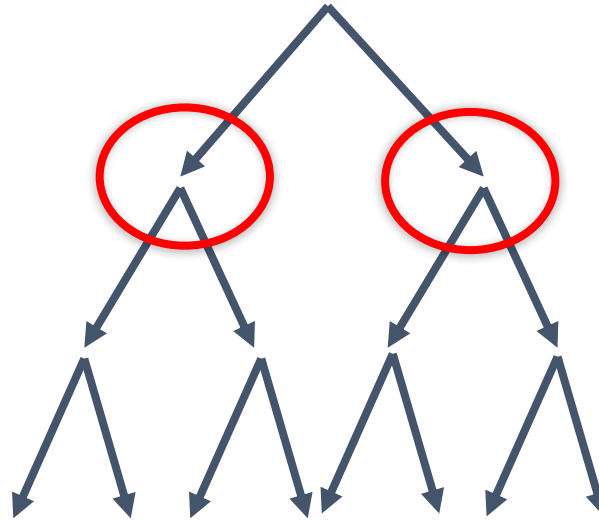


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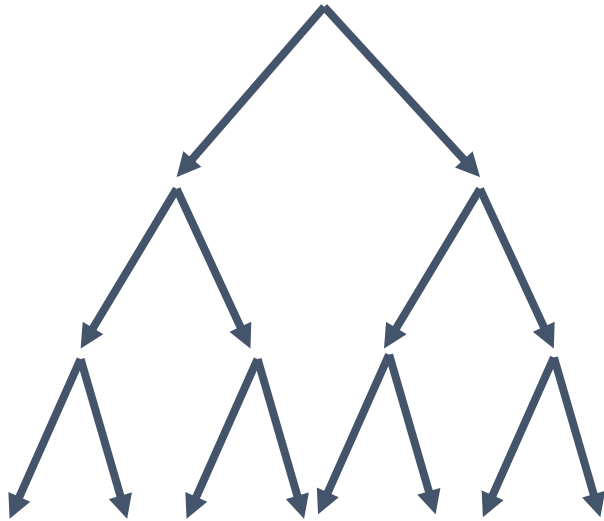


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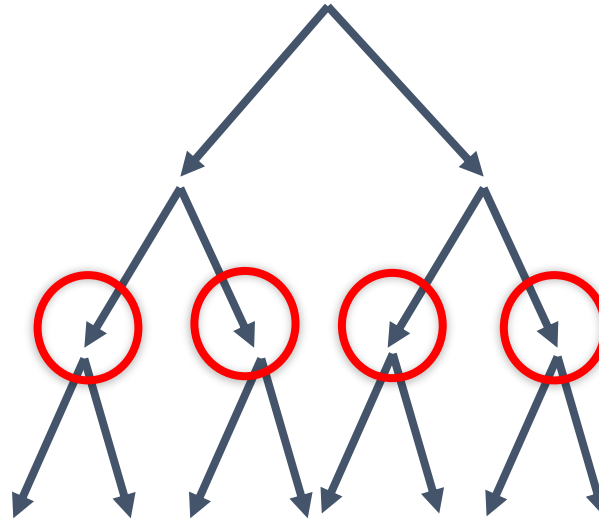


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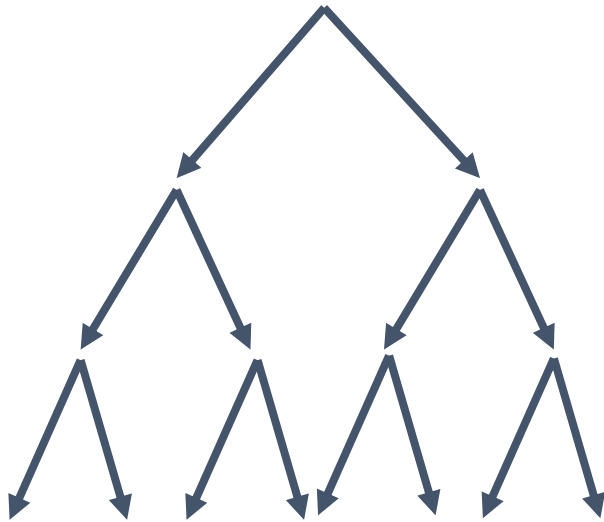


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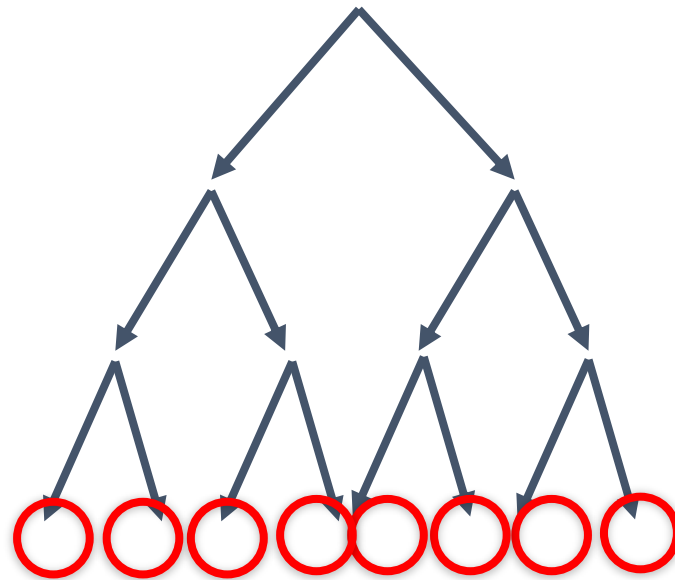


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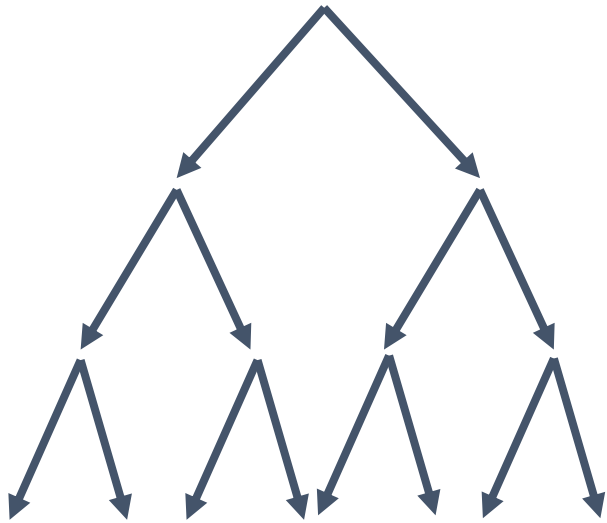


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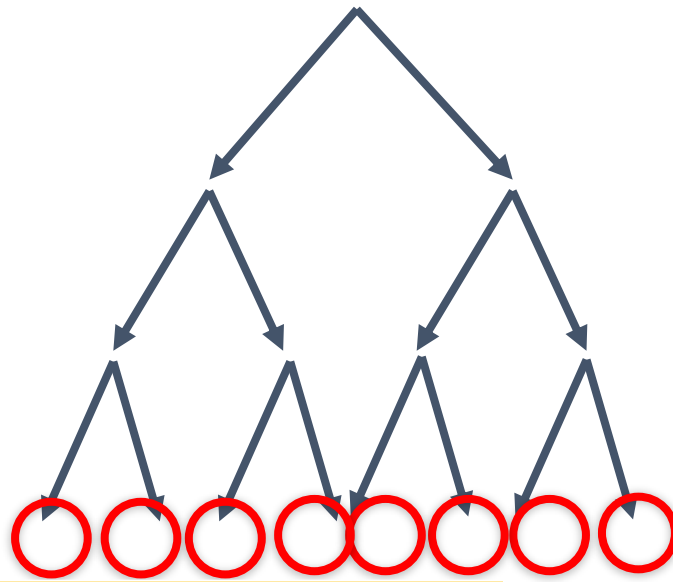


P versus NP

determinism (P)



non-determinism (NP)



Non-determinism *may*
seem more powerful