# **Algorithms**

**Lecture 16: NP Completeness (Part 2)** 

Anxiao (Andrew) Jiang

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- 1) The process of finding a solution.
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The constraint for NP is weaker:

- 1) The process of finding a solution.
- 2) Verify the correctness of the solution (so it knows when to end).

Sub-case 1: answer is "YES"

Sub-case 2: answer is "NO"

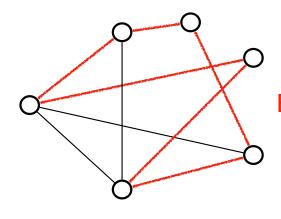




Hamiltonian cycle Problem:

Input: A graph G=(V,E).

Question: Does G have a Hamiltonian cycle?



Finding a Hamiltonian cycle might be hard .....

But given a Hamiltonian cycle, it is easy to verify it is indeed A Hamiltonian cycle.

Hamiltonian cycle Problem  $\in NP$ 

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Co-NP: the set of decision problems with this property: for every instance of the problem, If the answer is "NO", there exists some data with which an algorithm can verify that the answer is indeed "NO" in polynomial time.

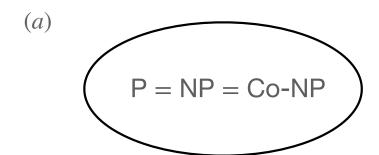
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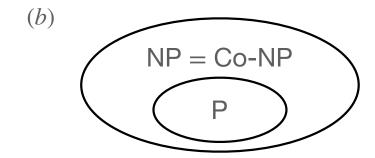
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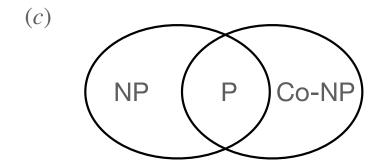
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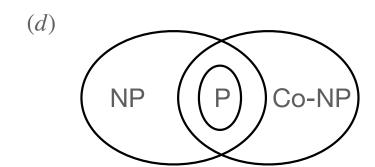
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### Four possible cases:





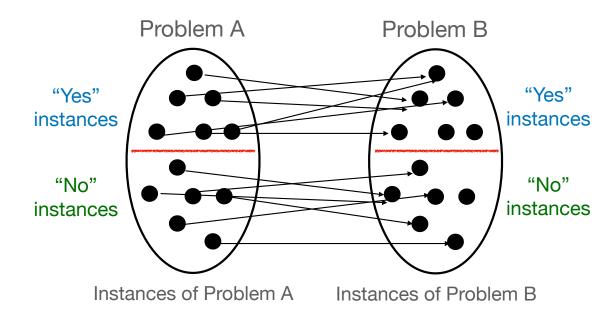




Polynomial-time reduction from Problem A to Problem B:

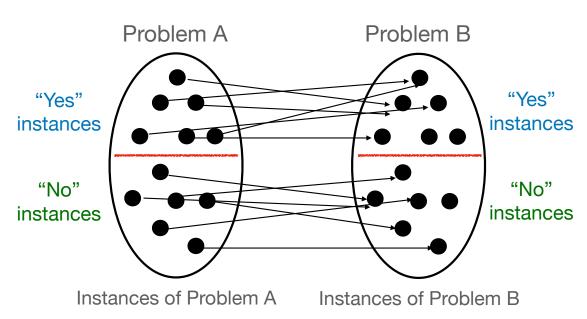


If Problem A is known to be "hard", then we can use the above relation to show that Problem B is also "hard".



Lemma: If  $A \leq_p B$ , then  $B \in P$  implies  $A \in P$ .

Proof: We can use the reduction, to solve A through solving B, all in polynomial time.

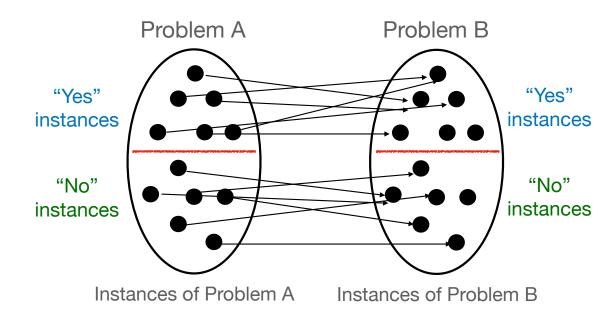


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### NP-complete definition:

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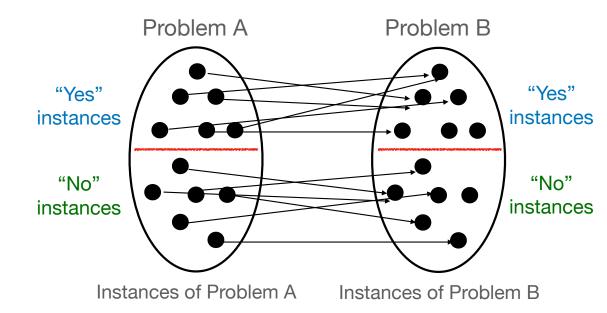
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If  $P \neq NP$ , then no NPC problem can be solved in polynomial time.

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If only condition 2 is satisfied, L is called "NP-hard".

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Lemma: For any problem  $A \in NPC$ ,

if  $A \leq_p L$ , then L is NP-hard;

if  $A \leq_p L$  and  $L \in NP$ , then  $L \in NPC$ .

Lemma: For any problem  $A \in NPC$ , if  $A \leq_p L$ , then L is NP-hard; if  $A \leq_p L$  and  $L \in NP$ , then  $L \in NPC$ .

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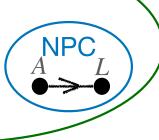
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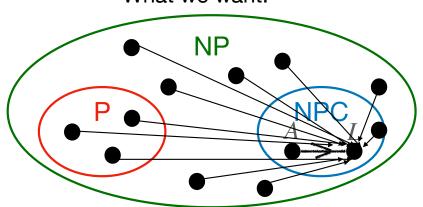
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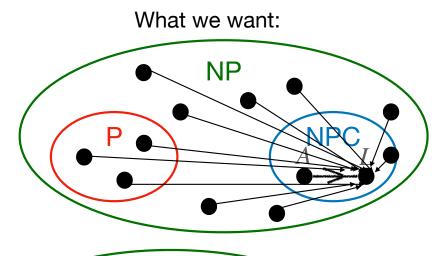
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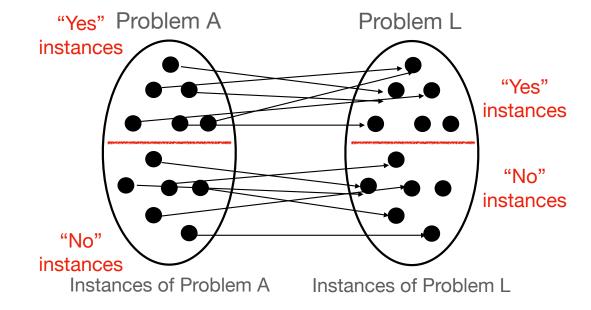
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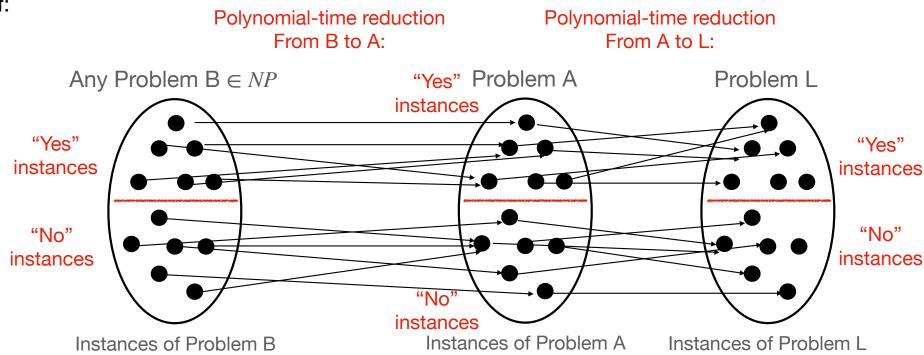
# Any Problem $B \in NP$ "Yes" instances "No" instances Instances of Problem B

## Polynomial-time reduction From A to L:



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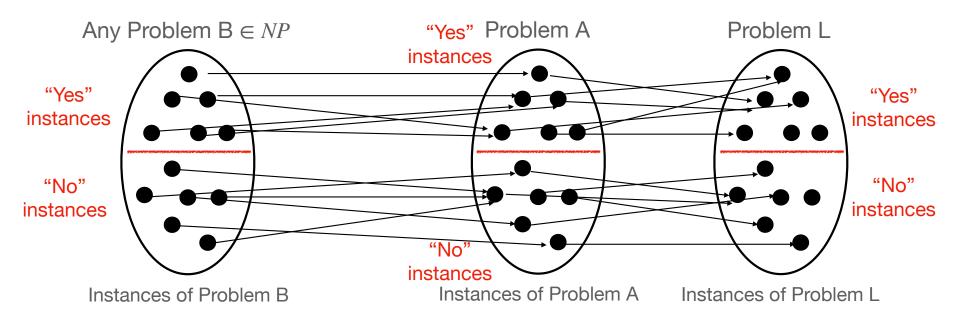
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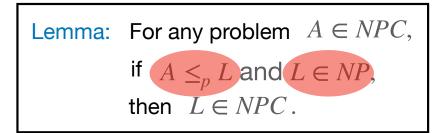
### How to prove a problem L is NP-complete (NPC):

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Standard technique for proving NP-completeness today

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