

# Lecture 35

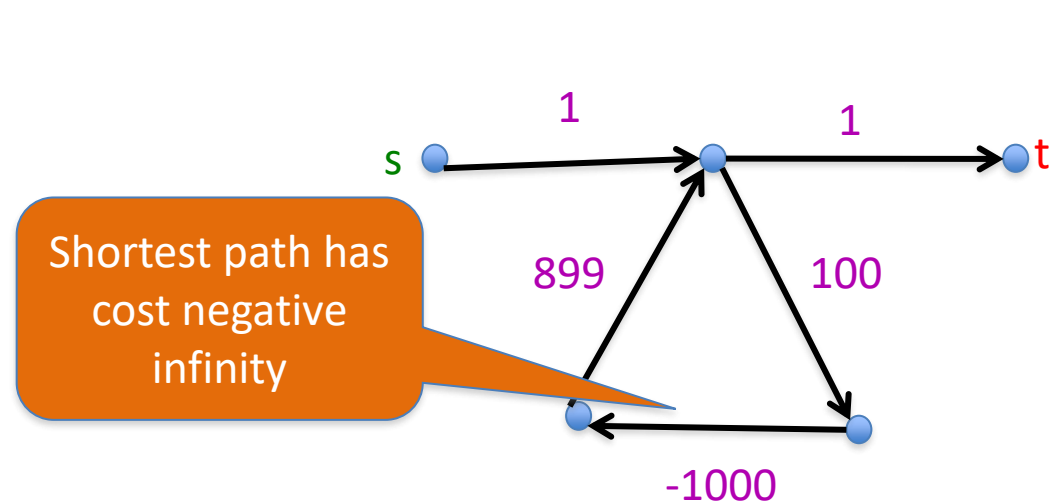
CSE 331

# Shortest Path Problem

Input: (Directed) Graph  $G=(V,E)$  and for every edge  $e$  has a cost  $c_e$  (can be  $<0$ )

$t$  in  $V$

Output: Shortest path from every  $s$  to  $t$



Assume that  $G$  has no negative cycle

# The recurrence

$\text{OPT}(u,i)$  = shortest path from  $u$  to  $t$  with at most  $i$  edges

$$\text{OPT}(u,i) = \min \left\{ \text{OPT}(u,i-1), \min_{(u,w) \in E} \{ c_{u,w} + \text{OPT}(w, i-1) \} \right\}$$

# Some consequences

$\text{OPT}(u,i)$  = cost of shortest path from  $u$  to  $t$  with at most  $i$  edges

$$\text{OPT}(u,i) = \min \left\{ \text{OPT}(u, i-1), \min_{(u,w) \in E} \{ c_{u,w} + \text{OPT}(w,i-1) \} \right\}$$

$\text{OPT}(u,n-1)$  is shortest path cost between  $u$  and  $t$

Can compute the shortest path  
between  $s$  and  $t$  given all  
 $\text{OPT}(u,i)$  values

# Bellman-Ford Algorithm

Runs in  $O(n(m+n))$  time

Only needs  $O(n)$  additional space

# Reading Assignment

Sec 6.8 of [KT]

# Longest path problem

Given  $G$ , does there exist a simple path of length  $n-1$  ?

# Longest vs Shortest Paths



# Two sides of the “same” coin

Shortest Path problem

Can be solved by a polynomial time algorithm

Is there a longest path of length  $n-1$ ?

Given a path can verify in polynomial time if the answer is yes

# Poly time algo for longest path?



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## First Clay Mathematics Institute Millennium Prize Announced

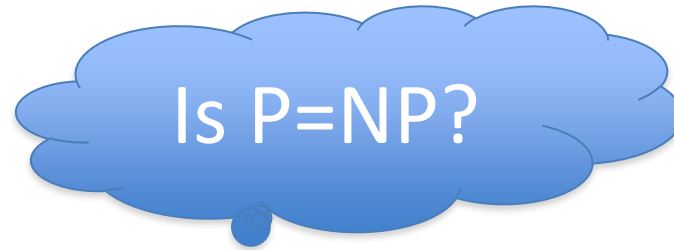
### Prize for Resolution of the Poincaré Conjecture Awarded to Dr. Grigoriy Perelman

**March 18, 2010.** The Clay Mathematics Institute (CMI) announces today that Dr. Grigoriy Perelman of St. Petersburg, Russia, is the recipient of the Millennium Prize for resolution of the Poincaré Conjecture. The institution further announced

- [Birch and Swinnerton-Dyer Conjecture](#)
- [Hodge Conjecture](#)
- [Navier-Stokes Equations](#)
- [P vs NP](#)
- [Poincaré Conjecture](#)
- [Riemann Hypothesis](#)
- [Yang-Mills Theory](#)

# P vs NP question

**P**: problems that can be solved by poly time algorithms

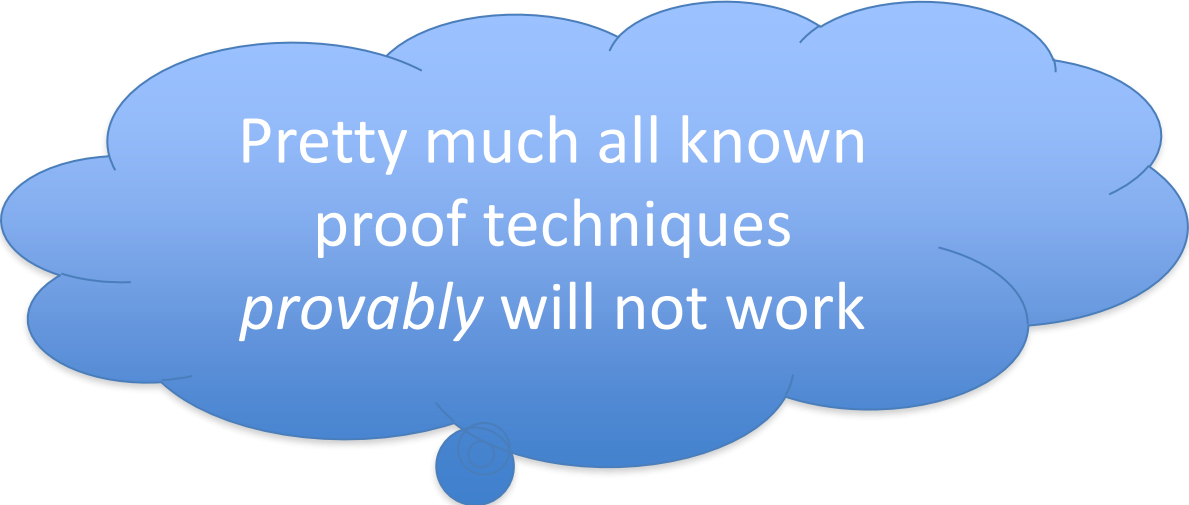


**NP**: problems that have polynomial time verifiable witness to optimal solution

Alternate NP definition: Guess witness and verify!

# Proving $P \neq NP$

Pick any one problem in NP and show it cannot be solved in poly time



Pretty much all known  
proof techniques  
*provably* will not work

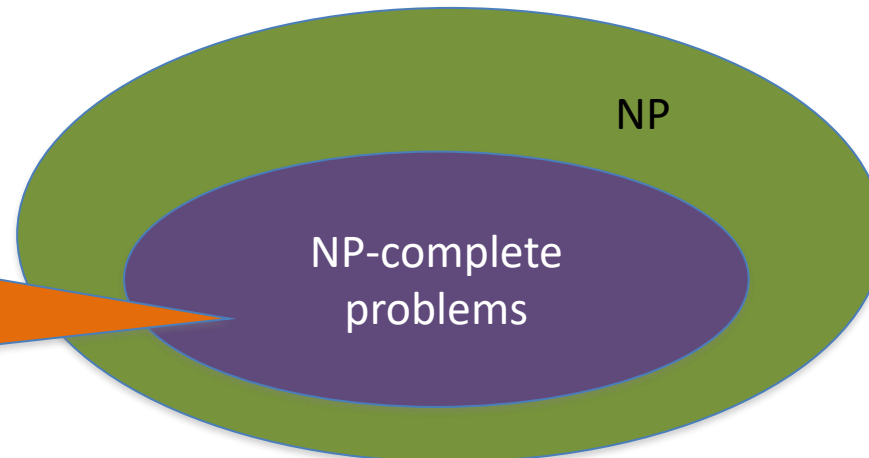
# Proving $P = NP$

Will make cryptography collapse

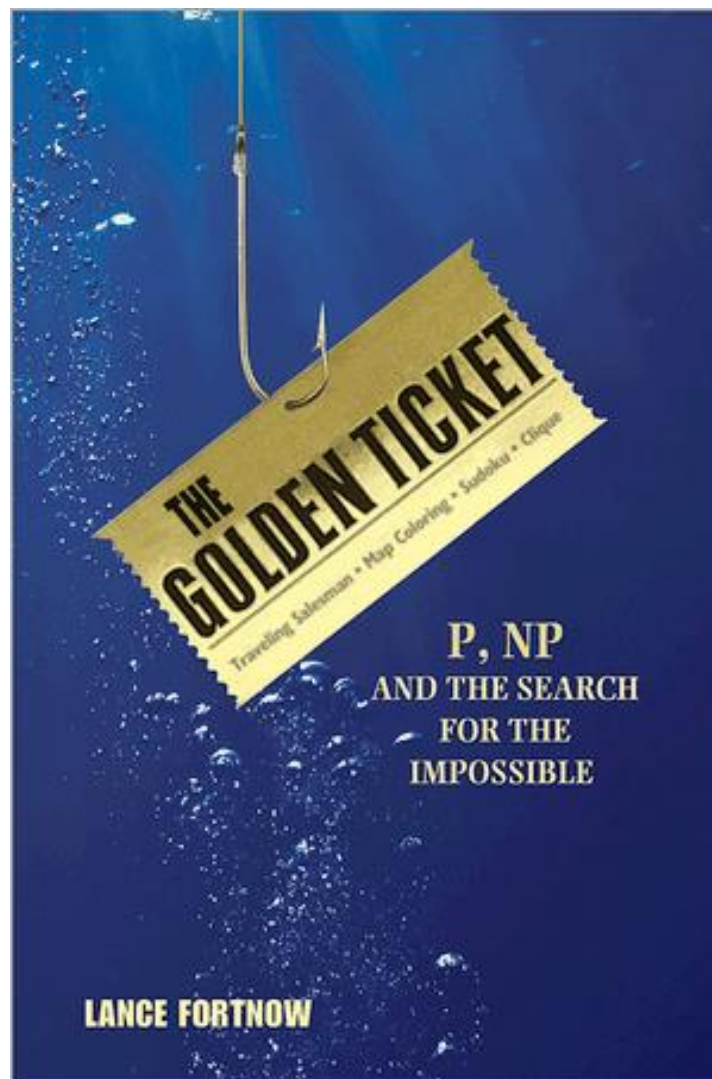
Compute the  
encryption key!

Prove that all problems in NP can be solved by polynomial time algorithms

Solving any ONE  
problem in here in  
poly time will prove  
 $P=NP$ !



# A book on P vs. NP

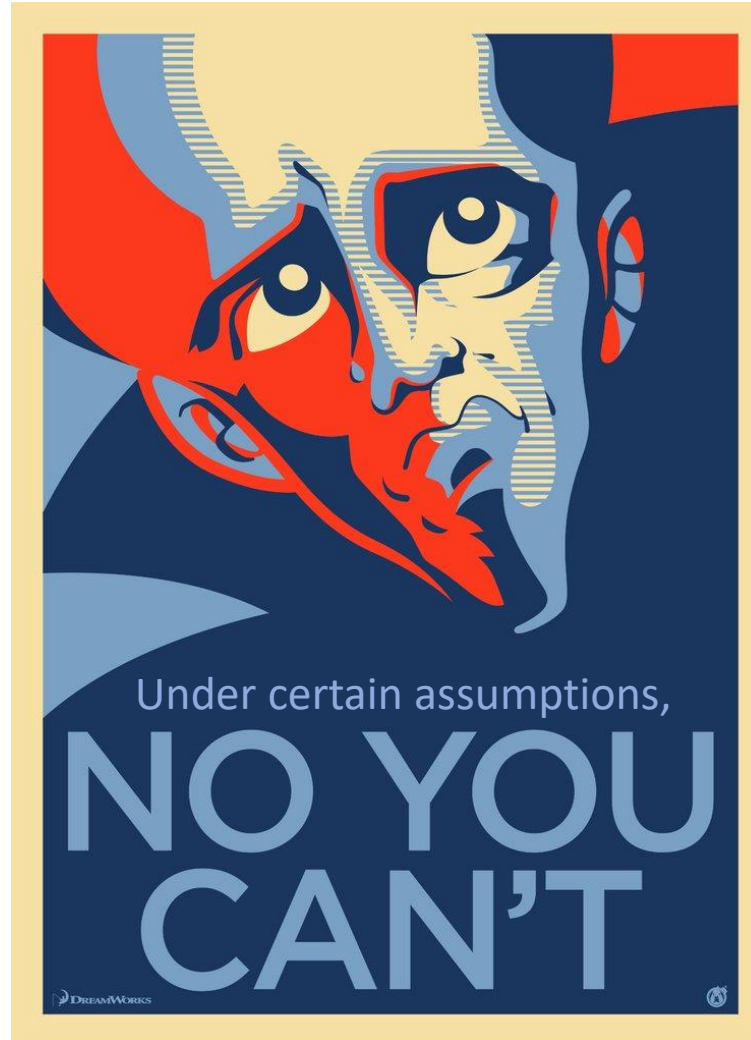


The course so far...



<https://www.teepublic.com/sticker/1100935-obama-yes-we-can>

The rest of the course...



<https://www.madduckposters.com/products/megamind-no-you-cant?variant=13565168320556>



# No, you can't— what does it mean?

**NO** algorithm will be able to solve a problem in polynomial time



Still for worst-case  
runtime

# No, you can't take- 1

## Adversarial Lower Bounds

Some notes on proving  $\Omega$  lower bound on runtime of *all* algorithms that solve a given problem.

### The setup

We have seen earlier how we can [argue an  \$\Omega\$  lower bound on the run time of a \*specific\* algorithm](#). In this page, we will aim higher

#### The main aim

Given a problem, prove an  $\Omega$  lower bound on the runtime on *any* (correct) algorithm that solves the problem.

What is the best lower bound you can prove?

$\Omega(N)$

# No, you can't take- 2

## Lower bounds based on output size

### Lower Bound based on Output Size

Any algorithm that for inputs of size  $N$  has a worst-case output size of  $f(N)$  needs to have a runtime of  $\Omega(f(N))$  (since it has to output all the  $f(N)$  elements of the output in the worst-case).

## Question 2 (Listing Triangles) [25 points]

### The Problem

A **triangle** in a graph  $G = (V, E)$  is a 3-cycle; i.e. a set of three vertices  $\{u, v, w\}$  such that  $(u, v), (v, w), (u, w) \in E$ . (Note that  $G$  is undirected.) In this problem you will design a series of algorithms that given a *connected* graph  $G$  as input, lists **all** the triangles in  $G$ . (It is fine to list one triangle more than once.) We call this the **triangle listing problem** (duh!). You can assume that as input you are given  $G$  in *both* the adjacency matrix and adjacency list format. *For this problem you can also assume that  $G$  is connected.*

2. Present an  $O(m^{3/2})$  algorithm to solve the triangle listing problem.

Exists graphs with  
 $m^{3/2}$  triangles

# No, you can't take- 2

Lower bounds based on output size

On input  $n$ , output  $2^n$  many ones

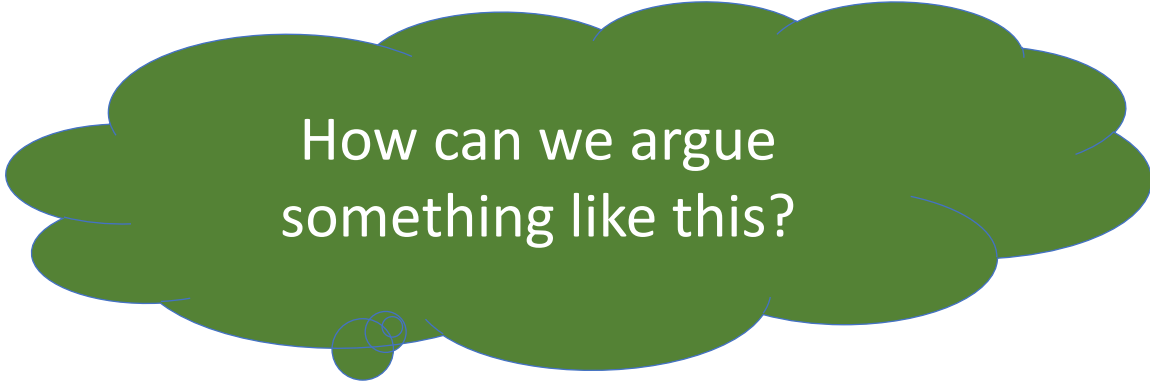
Every algo takes (doubly) exponential time

But at heart  
problem is "trivial"

From now on, output size is always  $O(N)$  and could even be binary.

# No, you can't take -3

Argue that a given problem is **AS HARD AS**  
a “known” hard problem



How can we argue  
something like this?



Reductions

So far: “Yes, we can” reductions



<https://www.teepublic.com/sticker/1100935-obama-yes-we-can>

# Reduce Y to X where X is “easy”

## Reduction

Reduction are to algorithms what using libraries are to programming. You might not have seen reduction formally before but it is an important tool that you will need in CSE 331.

## Background

This is a trick that you might not have seen explicitly before. However, this is one trick that you have used many times: it is one of the pillars of computer science. In a nutshell, reduction is a process where you change the problem you want to solve to a problem that you already know how to solve and then use the known solution. Let us begin with a concrete non-proof examples.

## Example of a Reduction

We begin with an [elephant joke](#). There are many variants of this joke. The following one is adapted from [this one](#).

- **Question 1** How do you stop a rampaging **blue** elephant?
- **Answer 1** You shoot it with a blue-elephant tranquilizer gun.
- **Question 2** How do you stop a rampaging **red** elephant?
- **Answer 2** You hold the red elephant's trunk till it turns blue. Then apply Answer 1.
- **Question 3** How do you stop a rampaging **yellow** elephant?
- **Answer 3** Make sure you run faster than the elephant long enough so that it turns red. Then Apply Answer 2.

In the above both **Answers 2** and **3** are reductions. For example, in **Answer 2**, you do some work (in this case holding the elephant's trunk: in this course this work will be a mathematical argument) to change **Question 2** in a way so that you can map it to **Question 1**. Once you have the mapping, then you use the known **Answer 1** to **Question 1**.

# “Yes, we can” reductions (Example)

## Question 2 (Big G is in town) [25 points]

### The Problem

The **Big G** company in the bay area decides it has not been doing enough to hire CSE grads from UB so it decides to do an exclusive recruitment drive for UB students. The **Big G** decides to fly over  $n$  CSE majors from UB to the bay area during December for on-site interview on a single day. The company sets up  $m$  slots in the day and arranges for  $n$  **Big G** engineers to interview the  $n$  UB CSE majors. (You can and should assume that  $m > n$ .) The fabulous scheduling algorithms at **Big G**'s offices draw up a schedule for each of the  $n$  majors so that the following conditions are satisfied:

- Each CSE major talks with every **Big G** engineer exactly once;
- No two CSE majors meet the same **Big G** engineer in the same time slot; and
- No two **Big G** engineers meet the same CSE major in the same time slot.

In between the schedule being fixed and the CSE majors being flown over, the **Big G** engineers were very impressed with the CVs of the CSE majors (including, ahem, their performance in CSE 331) and decide that **Big G** should hire all of the  $n$  UB CSE majors. They decide as a group that it would make sense to assign each CSE major  $S$  to a **Big G** engineer  $E$  in such a way that after  $S$  meets  $E$  during her/his scheduled slot, all of  $S$ 's and  $E$ 's subsequent meetings are canceled. Given that this is December, the **Big G** engineers figure that taking the CSE majors out to the nice farmer market at the ferry building in San Francisco during a sunny December day would be a good way to entice the CSE majors to the bay area.

In other words, the goal for each engineer  $E$  and the major  $S$  who gets assigned to her/him, is to **truncate** both of their schedules after their meeting and cancel all subsequent meeting, so that no major gets **stood-up**. A major  $S$  is stood-up if when  $S$  arrives to meet with  $E$  on her/his truncated schedule and  $E$  has already left for the day with some other major  $S'$ .

Your goal in this problem is to design an algorithm that always finds a valid truncation of the original schedules so that no CSE major gets stood-up.

To help you get a grasp of the problem, consider the following example for  $n = 2$  and  $m = 4$ . Let the majors be  $S_1$  and  $S_2$  and the **Big G** engineers be  $E_1$  and  $E_2$ . Suppose  $S_1$  and  $S_2$ 's original schedules are as follows:

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free



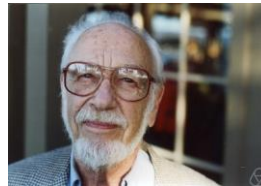
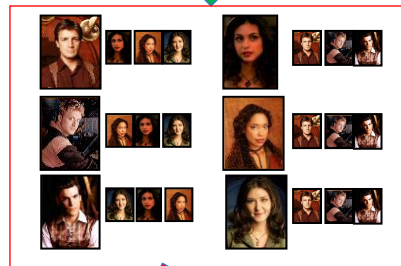
# Overview of the reduction

## Question 2 (Big G is in town)



CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free
$S_2$	free	$E_1$	free	$E_2$

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$ (truncate here)	
$S_2$	free	$E_1$ (truncate here)		



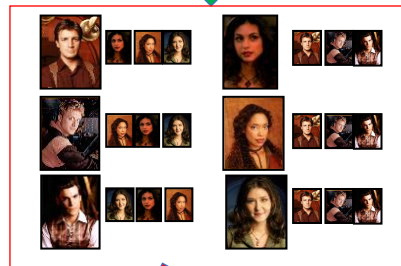
# Nothing special about GS algo

## Question 2 (Big G is in town)



CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free
$S_2$	free	$E_1$	free	$E_2$

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$ (truncate here)	
$S_2$	free	$E_1$ (truncate here)		



ANY algo for stable  
matching problem  
works!

# Another observation

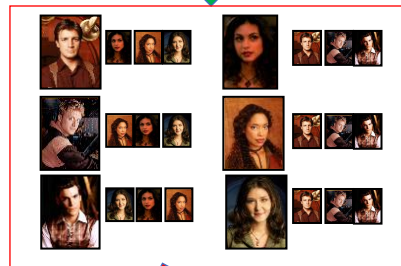
## Question 2 (Big G is in town)



CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free
$S_2$	free	$E_1$	free	$E_2$

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$ (truncate here)	
$S_2$	free	$E_1$ (truncate here)		

Poly time steps



ANY algo for stable matching problem works!

# Poly time reductions

Question 2 (Big G is in town)

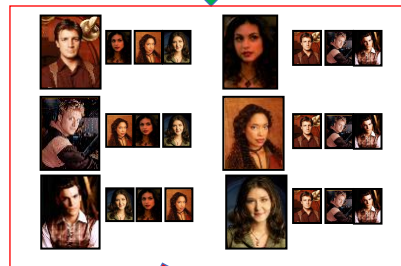
$\leq_P$



CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free
$S_2$	free	$E_1$	free	$E_2$

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$ (truncate here)	
$S_2$	free	$E_1$ (truncate here)		

Poly time steps



ANY algo for stable matching problem works!

$$Y \leq_P X$$

Question 2 (Big G is in town)

 $\leq_P$ 


CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$	free
$S_2$	free	$E_1$	free	$E_2$

CSE Major	Slot 1	Slot 2	Slot 3	Slot 4
$S_1$	$E_1$	free	$E_2$ (truncate here)	
$S_2$	free	$E_1$ (truncate here)		

Poly time steps



ANY algo for  
stable matching  
problem works!

Arbitrary Y instance

Pre-process the input

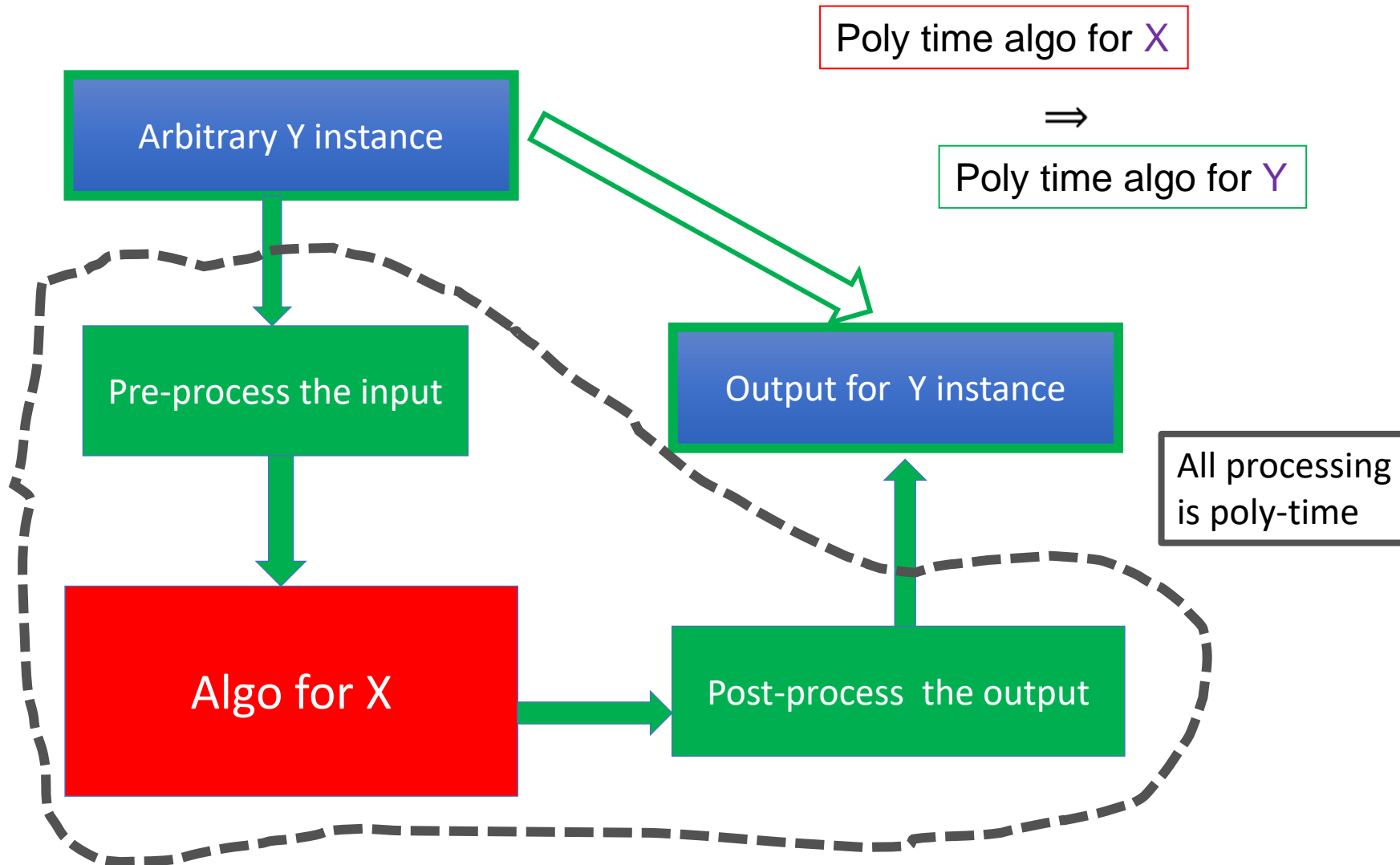
Algo for X

Output for Y instance

Post-process the output

All processing  
is poly-time

# Implications of $Y \leq_p X$



$$A \Rightarrow B$$

$$\neg B \Rightarrow \neg A$$

# Implications of $Y \leq_P X$

