

## Learning Goals

- Define NP-complete and NP-Hard Problems and describe their importance
- Prove a problem is NP-Hard [NP2]

# Types of Problems

## Easy

(Polynomial time)

- Search
- Sort
- Multiplication
- Closest Points
- Greedy Scheduling
- MWIS on a line
- Matrix Mult.

Quantum  
Req.

## Puzzles / NP

Crossword

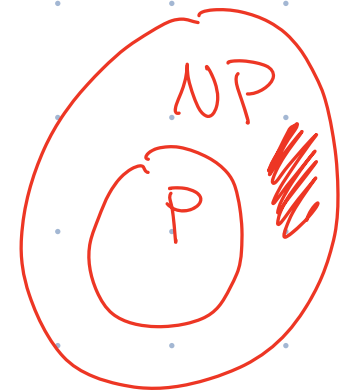
Sudoku

Delivery rt.  $\leq 100$  miles

Protein Folding

Factor larger numbers

Primality Testing



Question: How do we identify the hardest problems in NP?

→ Empirical: If keep trying to find an alg, but can't...

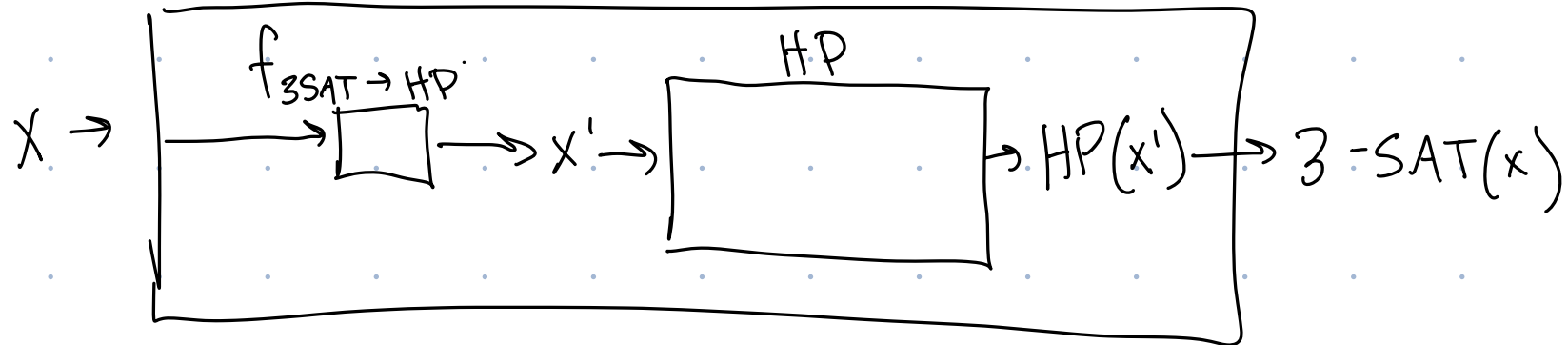
→ Analytical: Can we prove a problem is hard? ★

# NP-Hard

A problem  $Q \in \text{NP-Hard}$  if for every problem  $R \in \text{NP}$ ,  $R \leq_p Q$

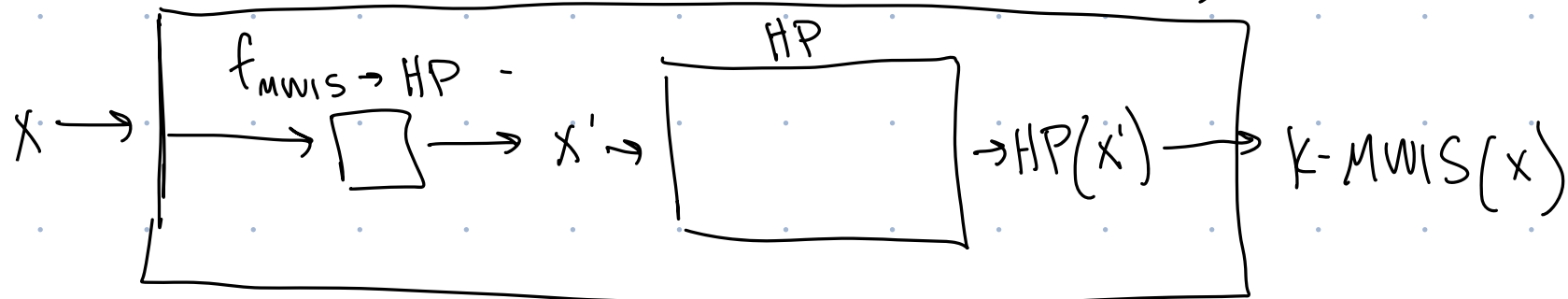
Ex: Halting Problem  $\in \text{NP-Hard}$  so  
(HP)

3-SAT

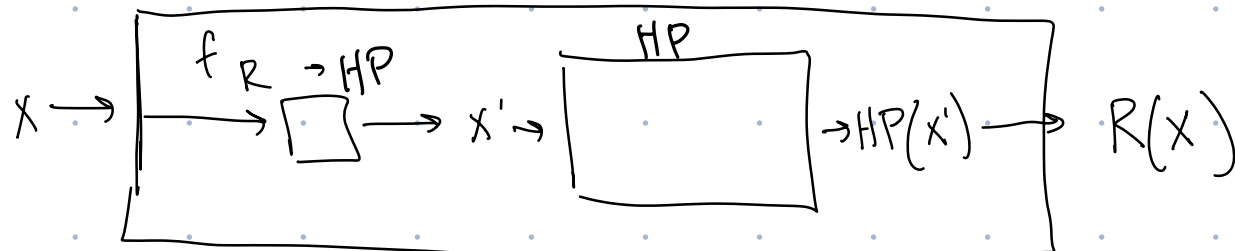


Also

K-MWIS (general graph)

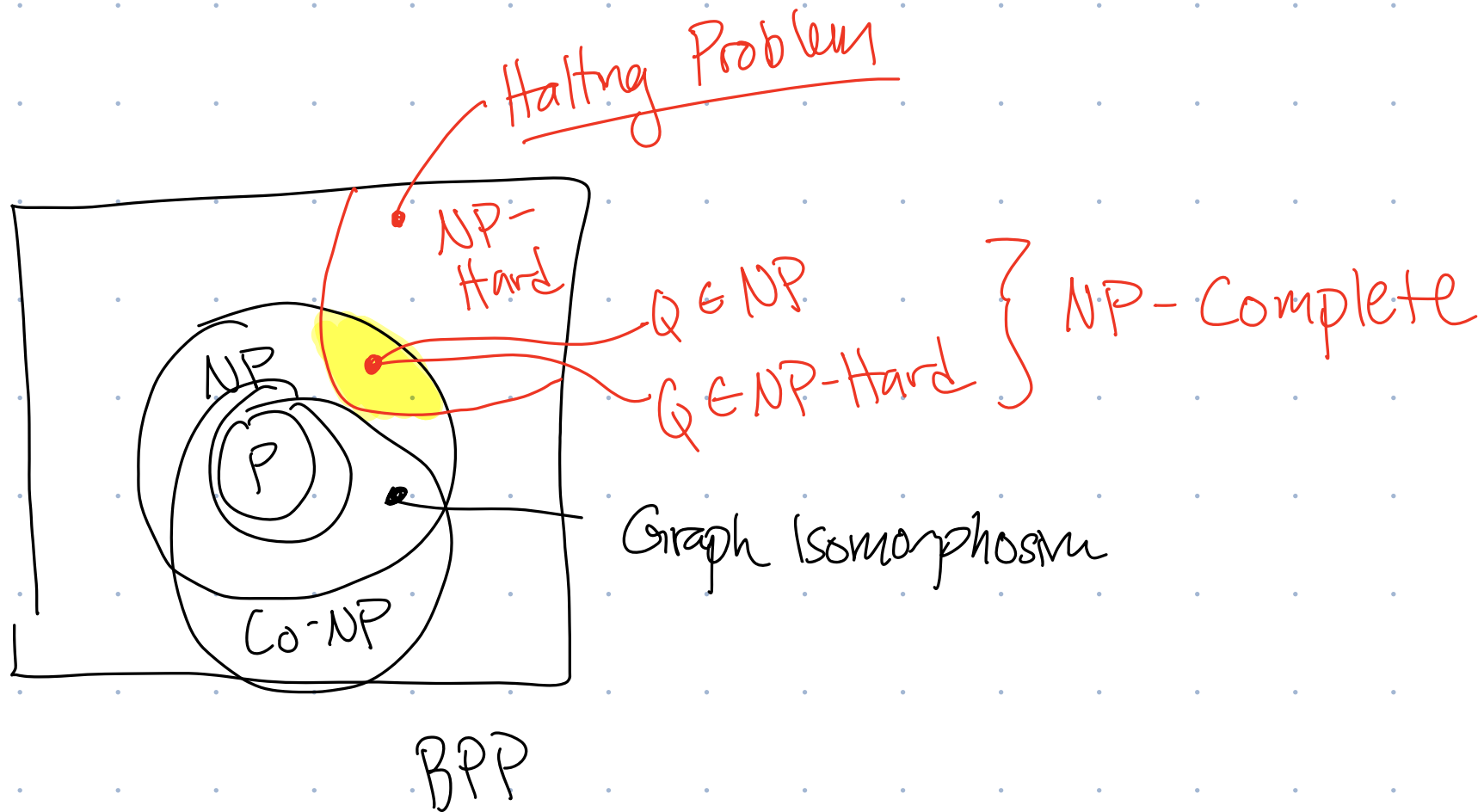


Also For any  $R \in \text{NP}$ ,  $\exists f_{R \rightarrow \text{HP}}$



→ NP-Hard problems are harder / require more resources than NP problems, b/c give power to solve all in NP

BUT



def:  $Q \in \text{NP-Complete}$  if  $Q \in \text{NP}$  and  $Q \in \text{NP-Hard}$

Fact 1:  $3SAT \in NP\text{-Hard}$

(see 301)

Lemma 1:  $R \in NP\text{-Hard}$  and  $R \leq_p Q$  then  $Q \in NP\text{-Hard}$

NP-Hard Bootstrapping Lemma

(See pset 9)

Theorem: Ham-Path is NP-complete

- PF • Ham-Path  $\in NP$  [insert proof here... see NP class]
- Ham-Path  $\in NP\text{-Hard}$

Will Prove:  $3SAT \leq_p \text{HamPath}$

+  
Fact 1  
+  
NP-Hard Bootstrapping Lemma

# Formal Definition of Polytime Reduction

$\{0,1\}^*$  = set of all bitstrings

def:  $R \leq_p Q$  ( $R$  is polytime reducible to  $Q$ ) if

$\exists f_{R \rightarrow Q} : \{0,1\}^* \rightarrow \{0,1\}^*$ , s.t. ①

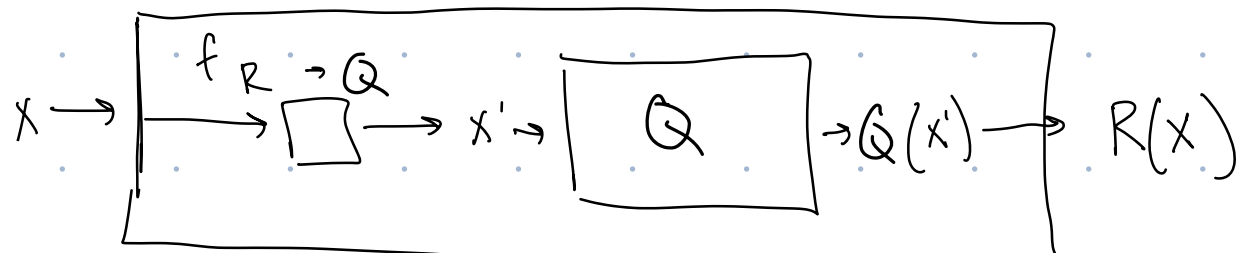
•  $\forall x \in \{0,1\}^*$ ,  $R(x) = \text{Yes}$  iff  $Q(f_{R \rightarrow Q}(x)) = \text{Yes}$  ②

•  $\exists$  constant  $c_{R \rightarrow Q}$  s.t. runtime of  $f_{R \rightarrow Q}$  on ③

input  $x$  is  $O(|x|^{c_{R \rightarrow Q}})$

$f_{R \rightarrow Q}$  runs in polynomial time

$$x' = f_{R \rightarrow Q}(x)$$

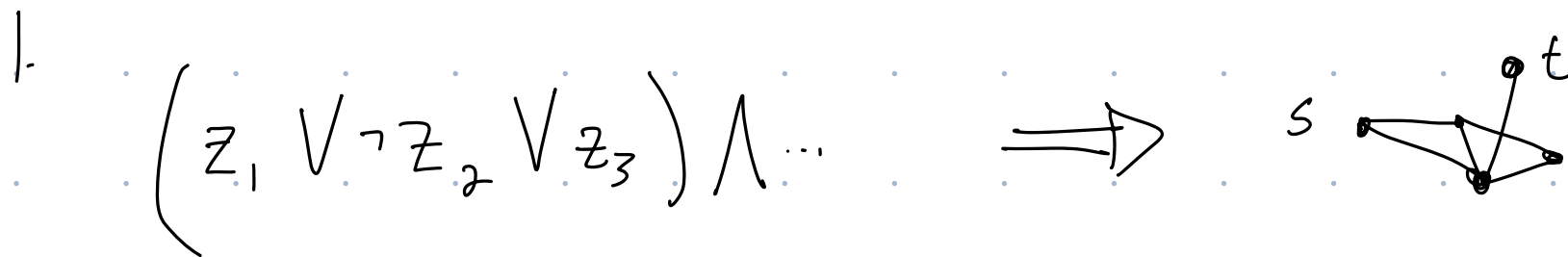


Lemma:  $3SAT \leq_p \text{Ham-Path}$

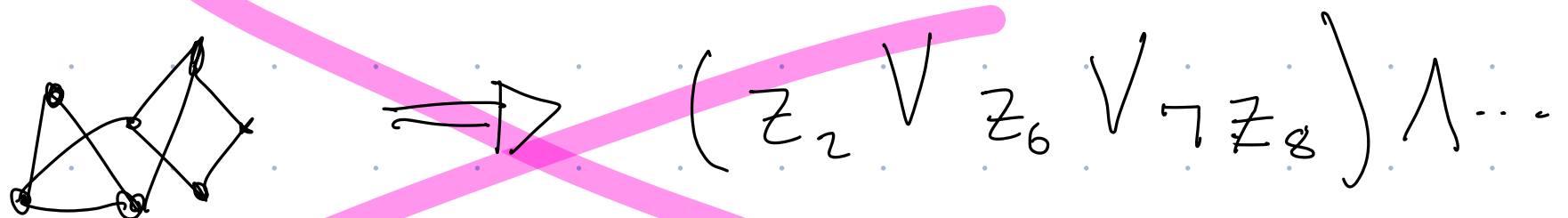
Strategy: 1. Describe  $f_{3SAT \rightarrow \text{Ham-Path}}$  (turn  $3SAT \rightarrow \text{Ham-Path}$ )

2. Show  $x$  is  $3SAT$ -Yes iff  $f_{3SAT \rightarrow \text{HP}}(x)$  is  $\text{Ham-Path-Yes}$

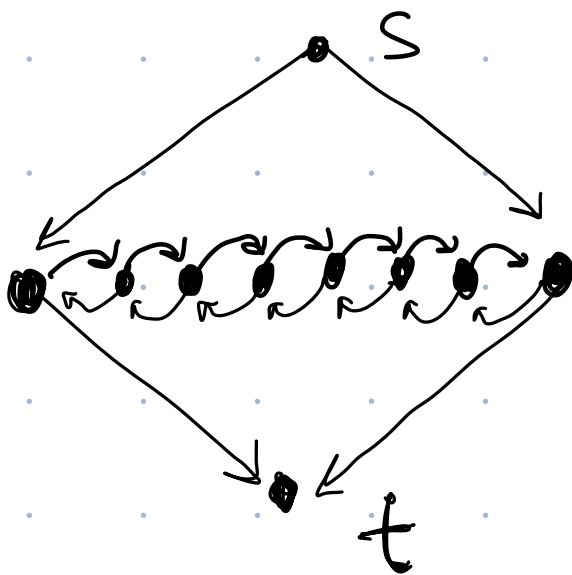
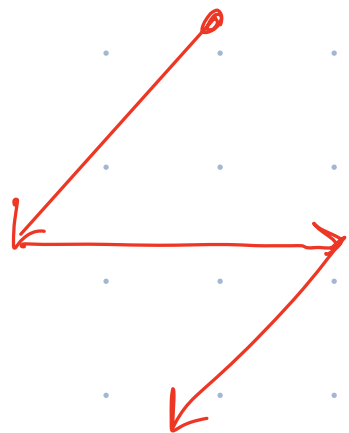
3. Show  $f_{3SAT \rightarrow \text{Ham-Path}}$  polytime



Common mistake!



How many Hamiltonian Paths are in this graph?



A. 2

B.

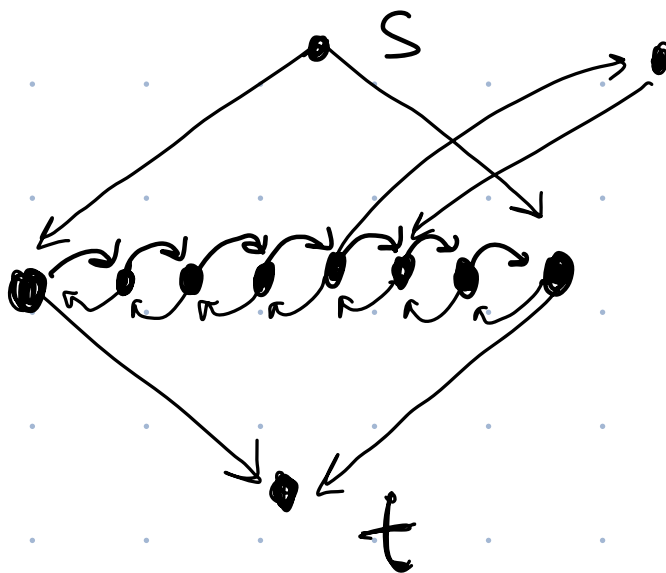
3

C. 49

D.  $\binom{7}{2}$

How many Hamiltonian Paths are in this graph?

True LRL

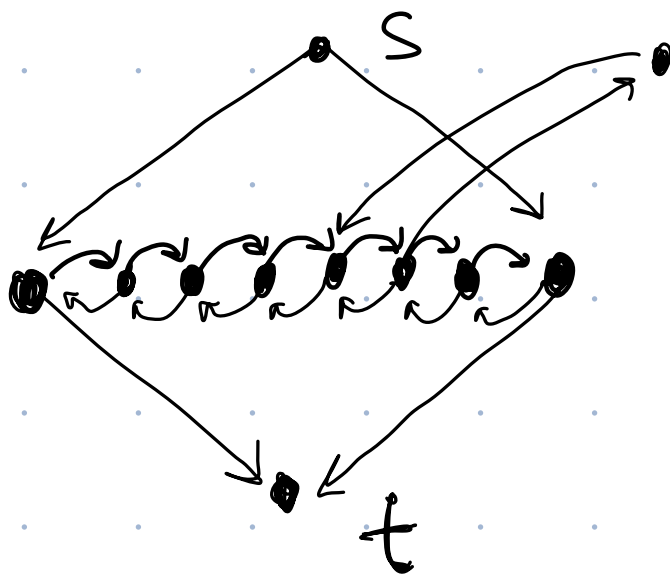


A. 0

B. 1

C. 2

D. 3



RLR  
False

$$X = (\neg z_1 \vee \neg z_2) \wedge (z_1 \vee z_3) \wedge (\neg z_1 \vee \neg z_3)$$

2 x # of clauses

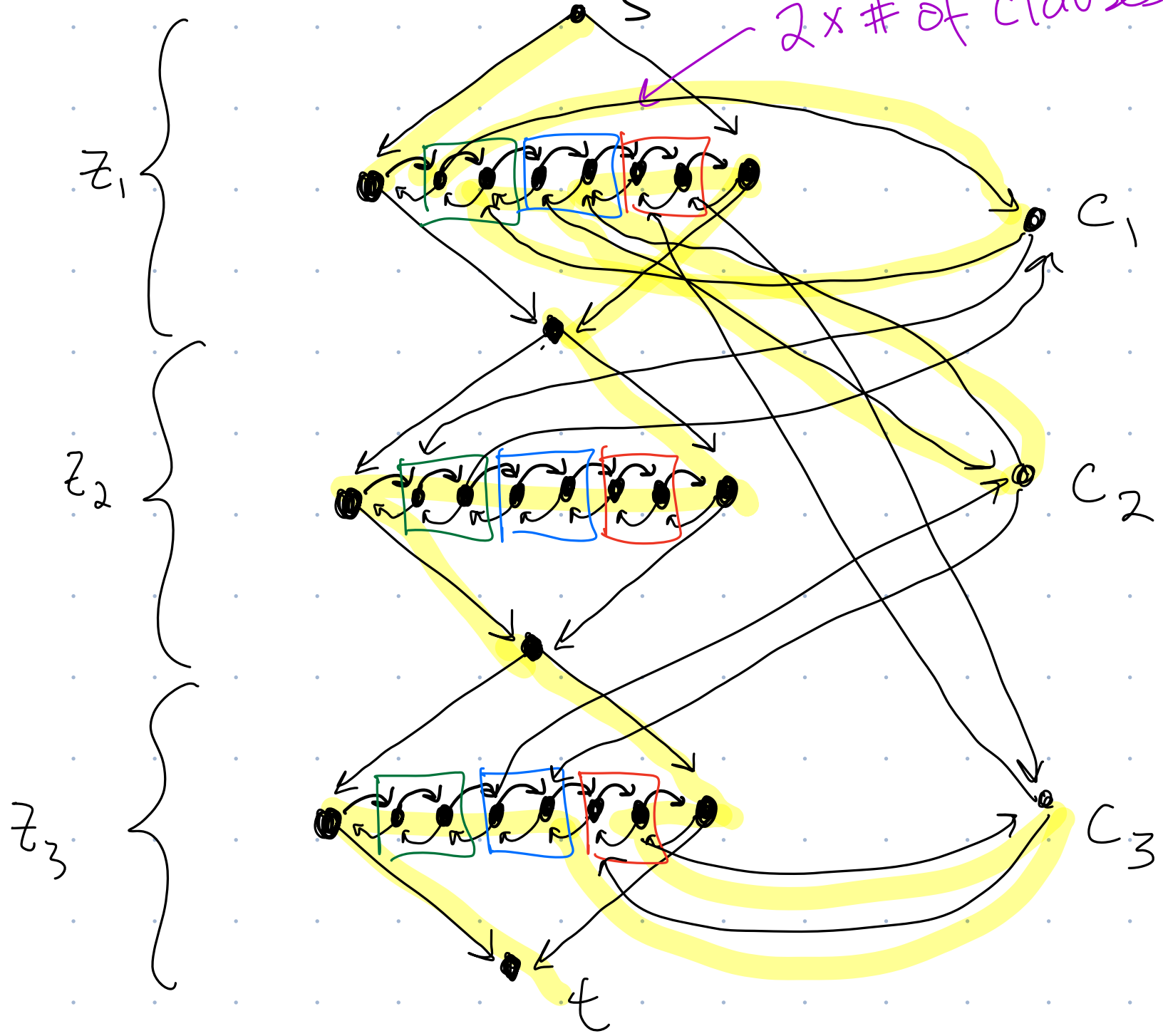
TRUE

FALSE

$z_1 = T$

$z_2 = F$

$z_3 = T$



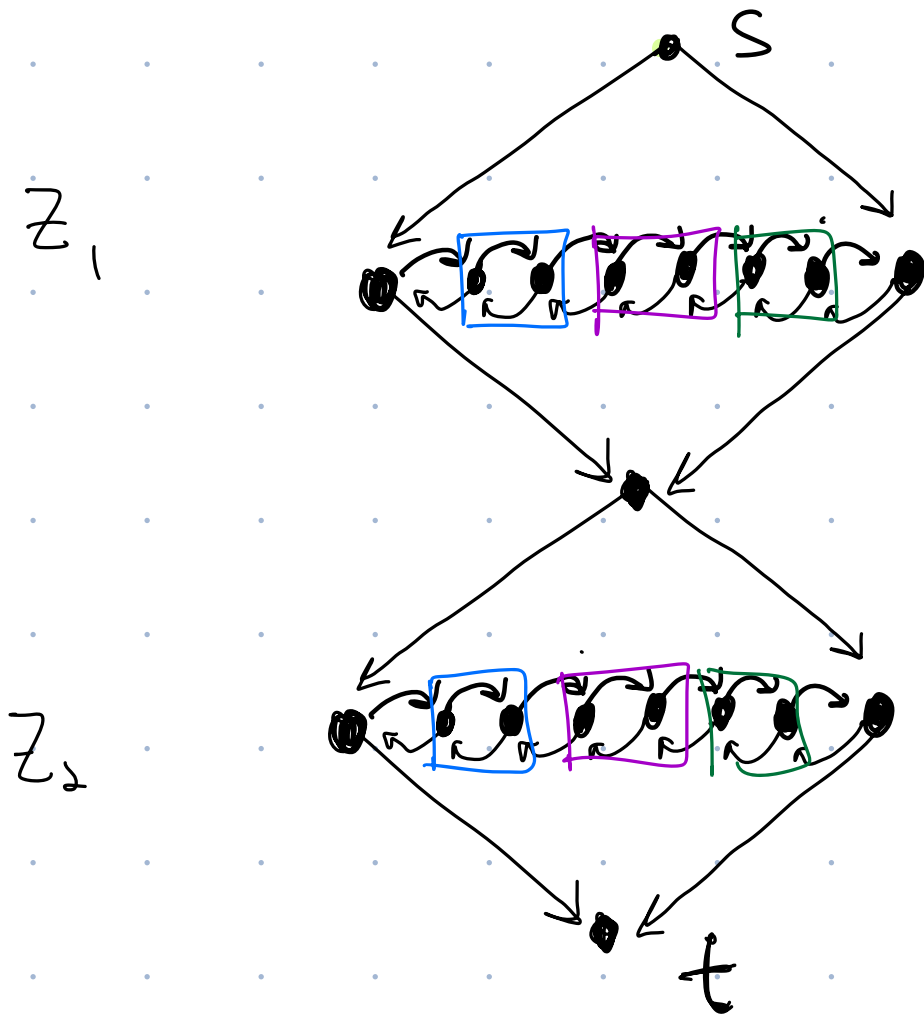
## Group Work

1. Encode  $(z_1) \wedge (\neg z_1 \vee z_2) \wedge (\neg z_1 \vee \neg z_2)$  into Ham-Path instance. Show get a No Instance.

2. Runtime of  $f_{3SAT \rightarrow HAM-PATH}$ ? (Create adj matrix for graph)

3.  $3SAT(x) = \text{Yes}$  iff  $HAMPATH(f_{3SAT \rightarrow HAMPATH}(x)) = \text{Yes}$

1.  $(z_1) \wedge (\neg z_1 \vee z_2) \wedge (\neg z_1 \vee \neg z_2)$



2.

$$3SAT(x) = \text{Yes} \quad \text{iff} \quad \text{HAMPATH}(f_{3SAT - \text{HAMPATH}}(x)) = \text{Yes}$$





3. Let  $m = \# \text{ clauses}$

$n = \# \text{ variables}$

Each gadget:

Total gadgets:

Clause vertices:

Adjacency matrix

Total edges: Gadget:

Clauses:

Note: Once we prove Ham-Path  $\in$  NP-Hard, we can combine with Lemma 1 to prove new problems are NP-Hard

Lemma 1: If  $Q \in$  NP-Hard and  $Q \leq_p R$  then  $R \in$  NP-Hard.

### 2.4. The Web of Reductions

51

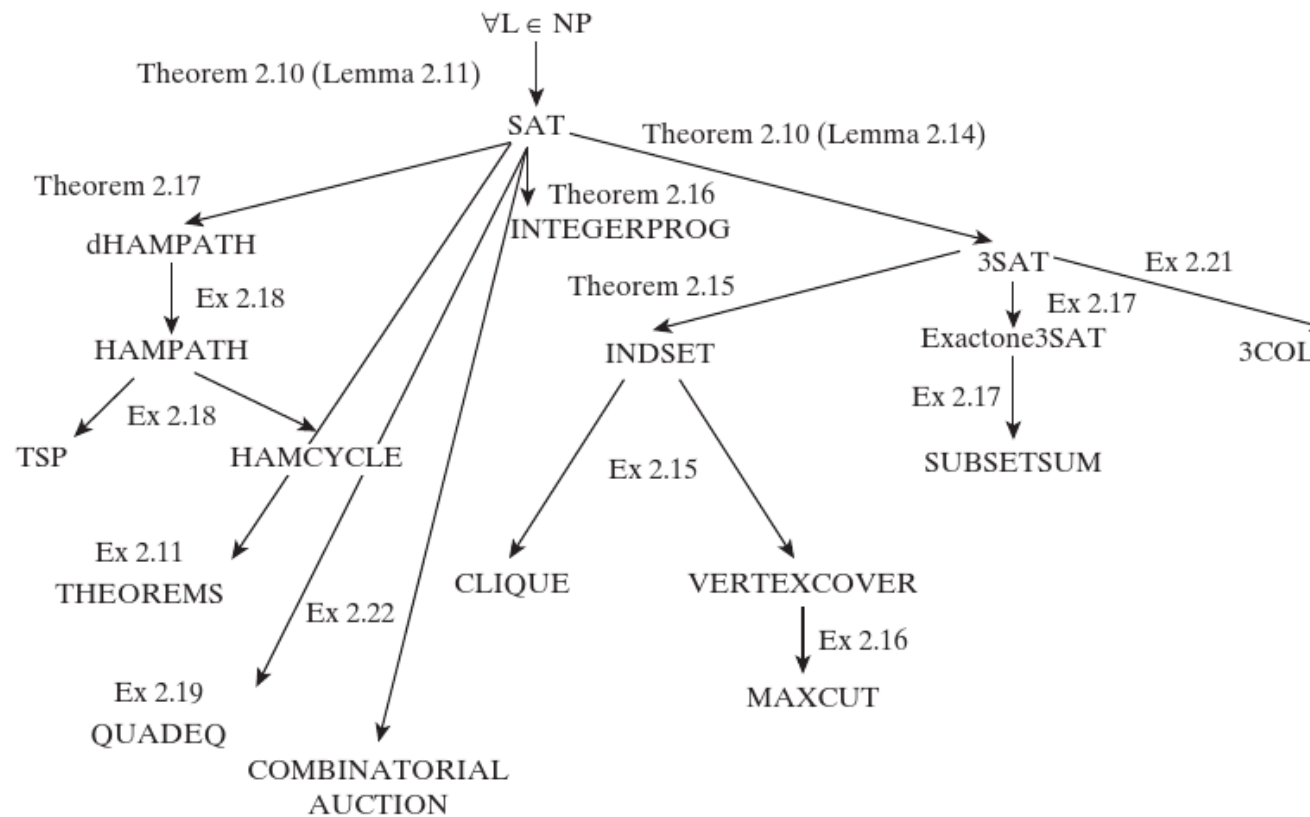


Figure 2.4. Web of reductions between the NP-completeness problems described in this chapter and the exercises. Thousands more are known.

(Arora + Boaz, Computational Complexity)