

# COMPLEXITY (NP)

$P = \{ p \mid p \text{ IS A DECISION PROBLEM SOLVABLE IN POLYNOMIAL TIME IN TERMS OF REPRESENTATIONS OF INSTANCES OF } p \text{ USING A DET. TM} \}$

$P$  CONTAINS DEPTH FIRST SEARCH SOLVABLE PROBLEMS - E.G., GARBAGE COLLECTION, GRAPH CONNECTIVITY, RELATIVE PRIMALITY, MEMBERSHIP IN CFL (CKY), LINEAR PROG. OVER REALS (NOT CONSTRAINED TO INTEGER), PRIMALITY

$NP = \{ p \mid p \text{ IS A DECISION PROBLEM SOLVABLE IN POLYNOMIAL TIME ... USING A NON-DET. TM} \}$

ALSO,  $NP$  IS

$NP = \{ p \mid \text{A SOLUTION TO AN INSTANCE OF } p \text{ CAN BE VERIFIED IN DET. POLY TIME} \}$

CAN ALSO USE NOTION OF UNBOUNDED PARALLELISM

A PROBLEM IN  $NP$  IS BOOLEAN SATISFIABILITY CAN SOLVE WITH TRUTH TABLE BY GUESSING A SOLUTION (OR CHECK A PROPOSED ASSIGNMENT OF VALUES IN LINEAR TIME)

# COMPLEXITY OTHER CLASSES

CO-NP: COMPLEMENT OF NP

NP-HARD: SUPERSET OF NP, WHEN  
 $P \subseteq NP, Q \subseteq NP-HARD \Rightarrow P \subseteq Q$

NP-COMPLETE: NP-HARD AND IN NP

QSAT IS NP-HARD BUT MAY NOT  
BE IN NP

PSPACE: SOLVABLE IN POLYNOMIAL SPACE

QSAT  $\in$  PSPACE

EXP: PROBLEMS SOLVABLE IN EXPONENTIAL TIME

BIG QUESTION

$$P = NP?$$

IF  $P = NP$  THEN ALL NP PROBLEMS ARE IN  $P$

IF  $P \neq NP$  THEN ALL NP-C PROBLEMS ARE IN EXP  
BUT NOT IN  $P$

# CONCRETE MODEL OF NP

CONSIDER NP DEFINED AS THE CLASS OF DECISION PROBLEMS SOLVABLE BY A NON-DETERMINISTIC TURING MACHINE IN POLYNOMIAL TIME RELATIVE TO THE LENGTH OF AN INPUT.

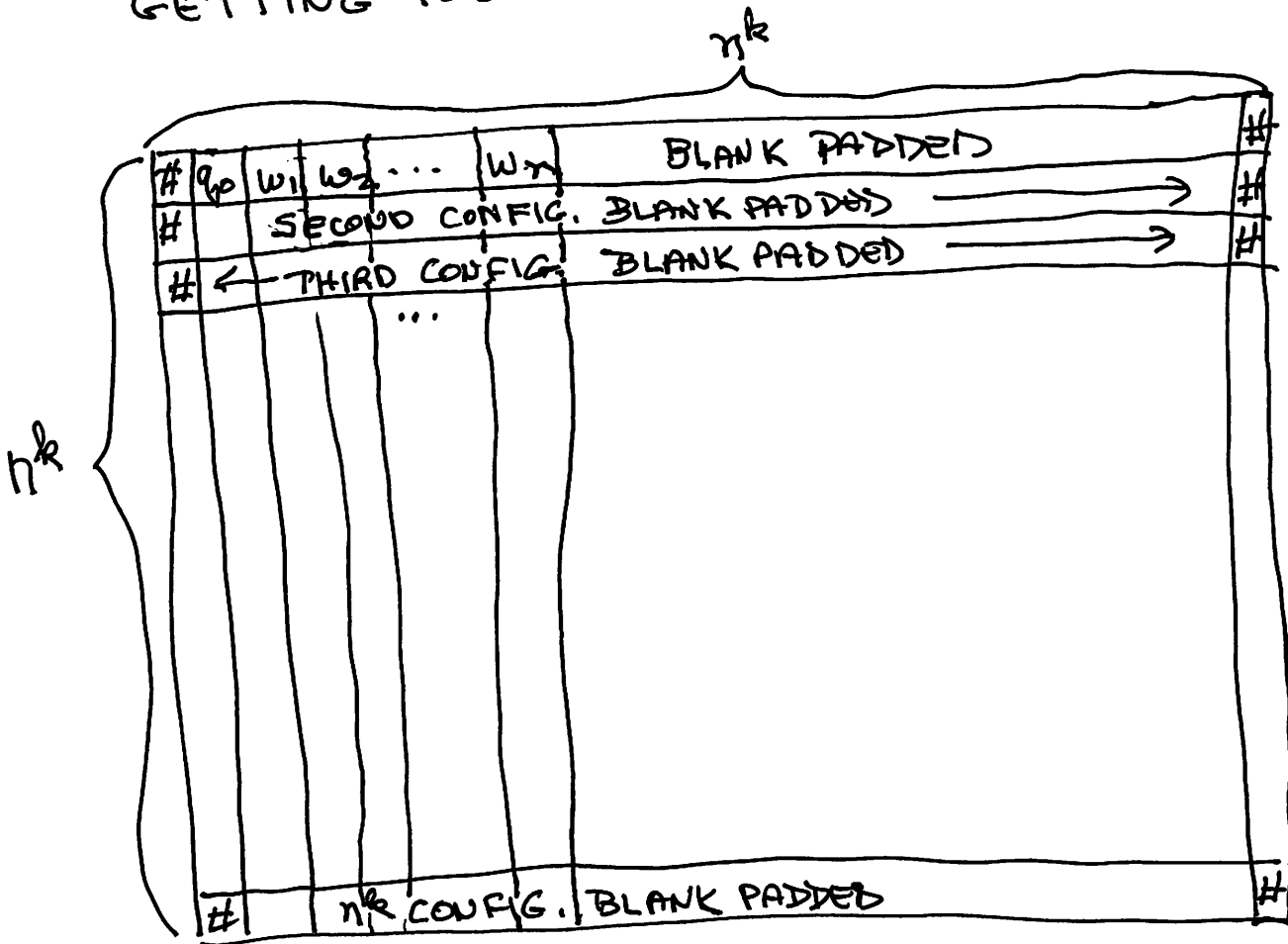
THAT IS,  $A \in NP$  IFF  $\exists$  NON-DET. M AND  $k > 0$ , SUCH THAT  $x \in A$  IFF  $x \in L(M)$  IS DECIDED IN  $|x|^k$  TIME

IN OUR EARLIER WORK WE DEFINED STANDARD TURING COMPUTING AS STARTING A MACHINE TO RIGHT OF INPUT AND HAVING MACHINE COMPLETE COMPUTATION WITHOUT EVER TRAVERSING TAPE SQUARES PAST BLANK TO LEFT OF INPUT. WE COULD HAVE DESCRIBED AN EQUIVALENT MODEL THAT STARTS AT LEFT OF INPUT AND NEVER TRAVERSES LEFT OF THAT SQUARE.

ALSO, WE WROTE IDS AS MIN. LENGTH STRINGS THAT INCLUDED NO LEADING OR LAGGING BLANKS. IF WE KNOW WE NEVER TRAVERSE MORE THAN  $n^k$  CELLS, WHERE  $|w| = n$ , THEN WE DO NOT NEED TO EXCLUDE BLANKS LEADING OR LAGGING AND CAN JUST ALWAYS WRITE ID AS FIXED LENGTH STRING.

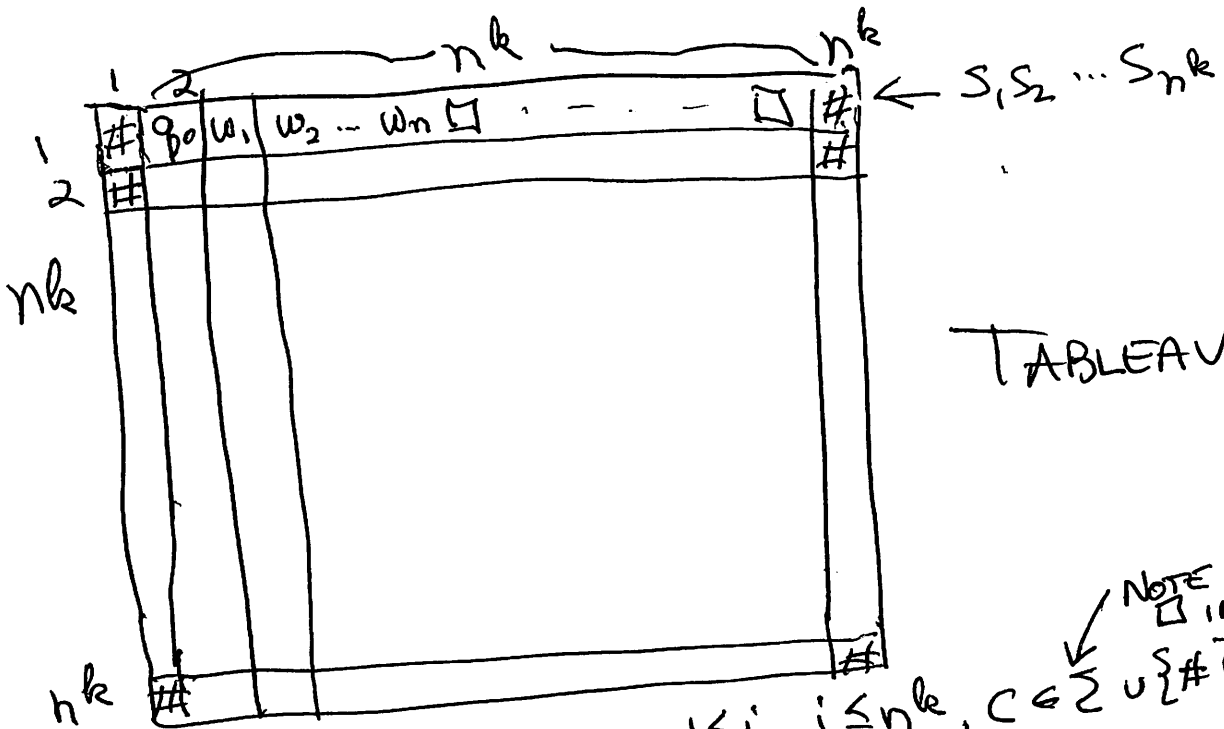
# TRACES FOR AN NP PREDICATE

WE CAN MAKE TABLE (MATRIX) OF SIZE  $n^k \times n^k$   
 TO REPRESENT TRACES OF LENGTH AT MOST  $n^k$   
 (WELL, WE MIGHT WANT  $(n^k + 3) \times n^k$  BUT THAT IS  
 GETTING TOO FUSSY)



WANT TO SEE ACCEPTING STATE  $q_{acc}$   
 SHOW UP IN SOME ROW FOR SOME  
 LEGIT TRACE

# SAT AS NP-COMPLETE



BOOLEAN VARIABLES  $x_{i,j,c}$   $1 \leq i, j \leq n^k, c \in \sum_{u \in \{ \#, \cup Q \}}$

$$\phi_{\text{ENCODE}(i,j)} = \bigvee_{c \in \sum_{u \in \{ \#, \cup Q \}}} x_{i,j,c} \wedge \bigwedge_{\substack{c,d \in \sum_{u \in \{ \#, \cup Q \}} \\ c \neq d}} \overline{x_{i,j,c} \wedge x_{i,j,d}}$$

$$\phi_{\text{CELLS}} = \bigwedge_{1 \leq i, j \leq n^k} \phi_{\text{ENCODE}(i,j)}$$

ALL CELLS HAVE EXACTLY ONE SYMBOL

$$\phi_{\text{ACCEPT}} = \bigvee_{i,j} x_{i,j,\text{acc}}$$

WHERE ACCEPT STATE IS ACC

SOME CELL INDICATES ACCEPTANCE

$$\phi_{\text{START}} = \bigwedge_{1 \leq j \leq n^k} x_{1,j,s_j}$$

WHERE INITIAL MARKING IS

$$s_1, s_2, \dots, s_{n^k}; \text{ NOTE } s_1 = s_{n^k} = \#$$

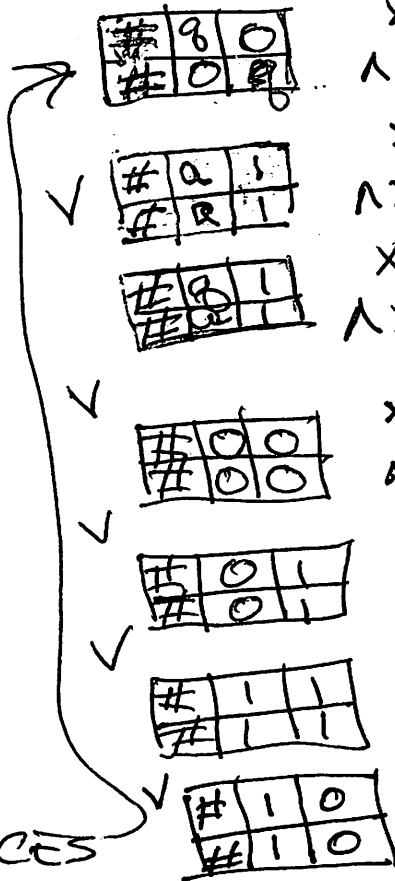
# LEGAL IS COMPLEX PART.

WE INCLUDE ALL LEGIT  $2 \times 3$  WINDOWS WHICH ARE PART OF SATISFYING EXPRESSION. DEPENDS ON CONSISTENCY WITH TOP LINE AND TRANSITIONS ALLOWED IN MACHINE.

## TRIVIAL EXAMPLE

$$\begin{matrix} 0 & 0 & 1 & 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 1 & 0 & 1 & 0 & 1 \\ 0 & 1 & 1 & 1 & 0 & 1 & 0 & 1 \end{matrix}$$
 ACCEPT IF A 1 (NOTE! DET.)  
 USE  $a$  AS ACCEPT STATE  
 START WITH 00100 AND SAY  $n^1$  (DO 8 CELLS)

	1	2	3	4	5	6	7	8
1	#	0	0	0	1	0	0	#
2	#	0	0	0	1	0	0	#
3	#	0	0	0	1	0	0	#
4	#	0	0	0	1	0	0	#
5	#	0	0	0	1	0	0	#
6	#	0	0	0	1	0	0	#
7	#	0	0	0	1	0	0	#
8	#	0	0	0	1	0	0	#



$X_{1,1} \# \wedge X_{1,2} 0 \wedge X_{1,3} 0$   
 $\wedge X_{2,1} \# \wedge X_{2,2} 0 \wedge X_{2,3} 0$   
 $X_{1,1} \# \wedge X_{1,2} a \wedge X_{1,3} 1$   
 $\wedge X_{2,1} \# \wedge X_{2,2} 1 \wedge X_{2,3} 1$   
 $X_{1,1} \# \wedge X_{1,2} 0 \wedge X_{1,3} 1$   
 $\wedge X_{2,1} \# \wedge X_{2,2} 0 \wedge X_{2,3} 1$   
 $X_{1,1} \# \wedge X_{1,2} 0 \wedge X_{1,3} 0$   
 $\wedge X_{2,1} \# \wedge X_{2,2} 0 \wedge X_{2,3} 0$   
 ...

START FORCES

$$\Phi_{\text{CELLS}} = \bigwedge_{1 \leq i, j \leq n^k} \Phi_{\text{ENCODE}}(i, j)$$

$$\Phi_{\text{START}} = \bigwedge_{1 \leq j \leq n^k} X_{1, j, s_j}$$

$$\Phi_{\text{ACCEPT}} = \bigvee_{1 \leq i, j \leq n^k} X_{L, j, q_A}$$

$$\Phi_{\text{MOVE}} = \bigwedge_{\substack{1 \leq l < n^k \\ 1 < j < n^k}} \Phi_{\text{LEGAL}}(l, j)$$

↑ MID POINT

$$\Phi_{\text{INDTM}} = \Phi_{\text{CELLS}} \wedge \Phi_{\text{START}} \wedge \Phi_{\text{ACCEPT}} \wedge \Phi_{\text{MOVE}}$$

# SAT ISFIABILITY (SAT)

SAT IS THE PROBLEM TO DECIDE IF AN ARBITRARY BOOLEAN EXPRESSION IS SATISFIABLE, MOST OFTEN THE BOOLEAN EXPRESSION IS IN CONJUNCTIVE NORMAL FORM (CNF)

CNF IS SPECIFIED BY A SET OF TERMS "AND"ED TOGETHER

EACH TERM IS MADE UP OF LITERALS (VARIABLES OR COMPLEMENTS OF VARIABLES) "OR"ED TOGETHER.

SAT IS IN NP AS WE CAN CHECK A SOLUTION (ASSIGNMENT OF T/F TO EACH VARIABLE) IN LINEAR TIME.

BEST KNOWN SOLUTION IS TRUTH TABLE, WHICH IS  $2^N$  FOR  $N$  VARIABLES



# SAT $\leq_p$ 3-SAT

ALL INSTANCES OF SAT CAN BE PUT  
IN CONJUNCTIVE NORMAL FORM (CNF)

3-SAT JUST RESTRICTS EACH  
DISJUNCT (CLAUSE) TO 3 LITERALS  
(VARIABLE OR VARIABLE COMPLEMENTED)

ASSUME WE HAVE CLAUSE  
 $(t_1 + t_2 + \dots + t_n)$   $n \geq 1$

CASE  $n=1$ : CHANGE  
 $(t_1)$  TO  $(t_1 + t_1 + t_1)$

CASE  $n=2$ : CHANGE  
 $(t_1 + t_2)$  TO  $(t_1 + t_2 + t_1)$   
OR  $(t_1 + t_2 + t_2)$

CASE  $(n=3)$ : NO CHANGE

CASE  $(n > 3)$ : CHANGE  
 $(t_1 + t_2 + t_3 + \dots + t_n)$   
TO  $(t_1 + t_2 + X)$   $(t_3 + \dots + t_n + \bar{X})$   
 $\underbrace{\hspace{10em}}_{3}$   $\underbrace{\hspace{10em}}_{n-1}$

WHERE  $X$  IS AN NEW VARIABLE

GROWTH IS LINEAR

# SUBSET SUM

REALLY SUBMULTISET SUM

INSTANCE

$$[ \langle l_1, \dots, l_n \rangle, G ] \quad 1 \leq l_i \leq G$$

FIND SUBSET (SUBMULTISET) OF  $l_1, \dots, l_n$   
THAT SUMS TO  $G$

EXAMPLE

$$[ \langle 15, 17, 27, 11, 4, 12, 33, 5, 6, 21, 2 \rangle, 57 ]$$

A SOLUTION IS  $15, 17, 11, 12, 2$

ANOTHER IS  $17, 27, 11, 2$

ETC.

BUT THERE MAY BE NO SOLUTION

BEST KNOWN TECHNIQUE IS

TRY THEM ALL, BUT THAT IS

$2^n - 1$  TRIES

THIS IS IN NP BECAUSE A PROPOSED

SOLUTION CAN BE CHECKED IN

LINEAR TIME.

# 3SAT $\leq_P$ SUBSET SUM

DO BY EXAMPLE CONSTRUCTION

$$(a + \bar{b} + c) (\bar{a} + b + \bar{c})$$

	1 PER VAR.			1 PER CLAUSE	
	a	b	c	$a + \bar{b} + c$	$\bar{a} + b + \bar{c}$
a	1	0	0	1	0
b	1	0	0	0	1
$\bar{b}$	0	1	0	0	1
c	0	1	0	1	0
$\bar{c}$	0	0	1	1	0
a'	0	0	1	0	1
b'	0	0	0	1	0
c'	0	0	0	1	0
a''	0	0	0	0	1
b''	0	0	0	0	1
c''	0	0	0	0	1
G =	1	1	1	3	3

ALL BLANKS ARE 0'S

# PARTITION

## INSTANCE

$$\langle l_1, \dots, l_n \rangle \quad l_j \geq 1$$

CAN I PARTITION INTO 2 EQUAL  
SUBSETS THAT COVER ENTIRE SET

- IF  $\sum l_j$  IS ODD, FAIL

## EXAMPLE

$$\langle 7, 11, 2, 5, 3, 4 \rangle$$

$$7 + 5 + 4 = 16$$

$$11 + 2 + 3 = 16$$

PROBLEM IS IN NP AS CAN  
CHECK A SOLUTION IN LINEAR TIME  
OBVIOUS SOLUTION IS ALL POSSIBLE  
DIVIDES

# SUBSET SUM $\leq_P$ PARTITION

SUBSET SUM INSTANCE

$$i_1, \dots, i_n, G \quad \text{LET } \Sigma = \sum_{j=1}^n i_j$$

PARTITION INSTANCE

$$i_1, \dots, i_n, 2\Sigma - G, \Sigma + G$$

$$\begin{aligned} \text{TOTAL} &= \Sigma + 2\Sigma - G + \Sigma + G \\ &= 4\Sigma \end{aligned}$$

FOR PARTITION CONTAINING  
 $2\Sigma - G$  TO HAVE  $2\Sigma$

THERE MUST BE A SUBSET OF  
 $i_1, \dots, i_n$  THAT EQUALS  $G$

AND THAT LEAVES  $\Sigma - G$  TO  
INCLUDE IN OTHER PARTITION

$$2\Sigma - G + G = 2\Sigma$$

$$\Sigma + G + \Sigma - G = 2\Sigma$$

NOTE!  $2\Sigma - G$  &  $\Sigma + G$  CANNOT BE  
IN SAME PARTITION AS THAT  
WOULD HAVE AT LEAST  $3\Sigma$

$$2\Sigma - G + \Sigma + G = 3\Sigma$$

# OPTIMIZATION OF SUBSET SUM PARTITION

SUBSET SUM IS TO GET AS CLOSE TO  
G AS POSSIBLE WITHOUT EXCEEDING

PARTITION IS TO GET AS CLOSE  
AS POSSIBLE TO EQUAL

# GRAPH THEORY PROBLEMS

## UNDIRECTED ACYCLIC GRAPHS

1. COLORING PROBLEM

2. INDEPENDENT SET PROBLEM

3. VERTEX COVERING PROBLEM  
(REALLY ABOUT EDGES)

# VERTEX COVERING

CHOOSE SET OF VERTICES SUCH THAT  
EVERY EDGE HAS AN ASSOCIATED  
SELECTED VERTEX

OPTIMIZATION VERSION

WHAT IS MINIMUM SIZE SET?

DECISION PROBLEM

GIVEN  $k > 0$ , CAN THE GRAPH BE  
COVERED BY  $k$  VERTICES

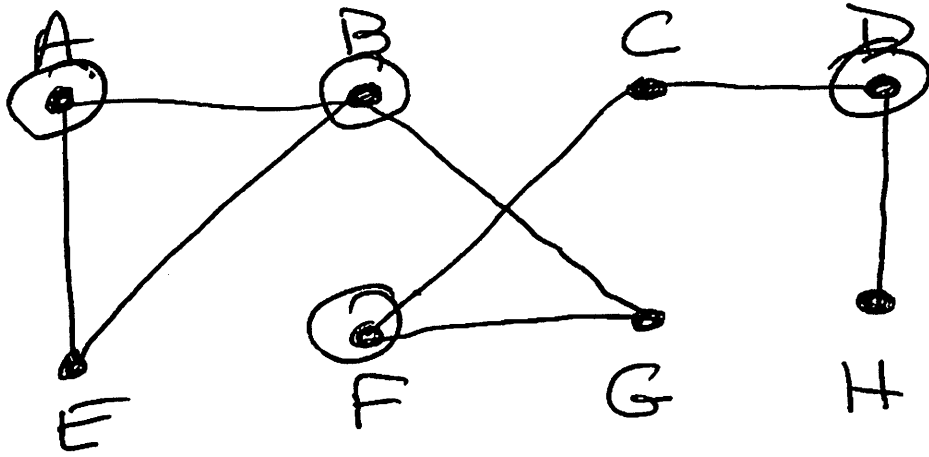
CAN SOLVE OPTIMIZATION IN POLY  
TIME IF CAN SOLVE DECISION IN POLY

TRY  $1, 2, \dots, n = \# \text{VERTICES}$

NOTE:  $n$  ALWAYS WORKS



VC  $K=4$



A, B, F, D COVERS

OR

E, B, F, D COVERS

# INDEPENDENT SET

CHOOSE SET OF VERTICES  
SUCH THAT NO TWO VERTICES  
HAVE COMMON EDGE (ARE CONNECTED)

## OPTIMIZATION VERSION

WHAT IS MAXIMUM SIZE SET?

## DECISION PROBLEM

GIVEN  $k > 0$ , CAN THE GRAPH ~~BE~~  
HAVE AN INDEPENDENT SET OF  
SIZE  $k$

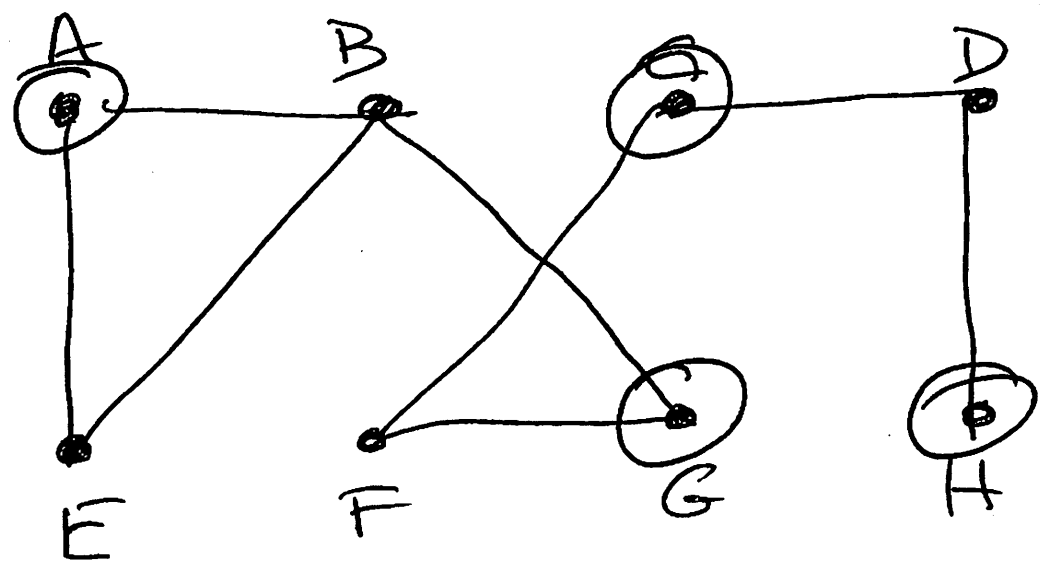
CAN SOLVE OPTIMIZATION IN POLYTIME

IF CAN SOLVE DECISION IN POLY

TRY  $n, n-1, \dots, 1$   $n = \#$  VERTICES

NOTE! 1 ALWAYS WORKS

IS  $R=4$



A G C H IS IS

OR  
E G C H IS IS

# GRAPH COLORING

COLOR EACH VERTEX SO NO  
NEIGHBOR VERTEX HAS SAME  
COLOR

## OPTIMIZATION

WHAT IS MINIMUM # OF COLORS

## DECISION

GIVEN  $k > 0$ , CAN WE COLOR  
WITH  $k$  COLORS

CAN SOLVE OPTIMIZATION IN POLY

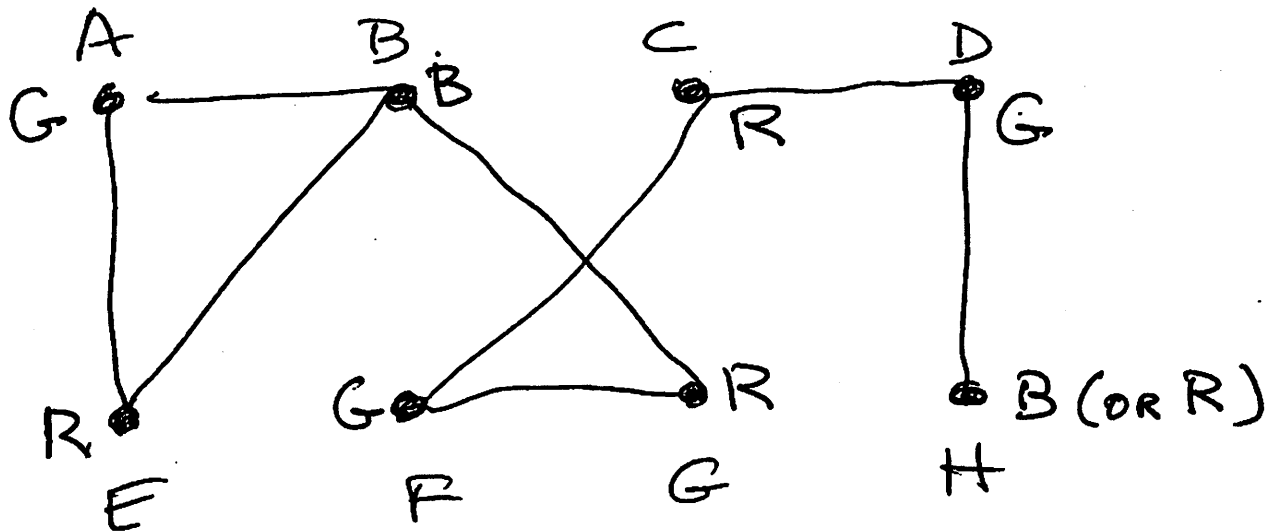
IF DECISION SOLVABLE IN POLY

TRY  $1, 2, \dots, n = \#$  VERTICES

$n$  ALWAYS WORKS

4 ALWAYS WORKS IF PLANAR  
(NO CROSSING EDGES)

GC  $k=3$



ABOVE IS ONE OF MANY 3-COLOR SOLUTIONS