

# FINDING A SOLUTION

3-SAT

INDEPENDENT SET

VERTEX COVER

SET COVER

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3-SAT

INDEPENDENT SET

VERTEX COVER

SET COVER

CERTIFY

(1) DOES  $(x_1, x_2, x_3) = (1, 0, 1)$  SATISFY

$$(x_1 \vee x_2 \vee \bar{x}_3) \wedge (x_1 \vee \bar{x}_2 \vee \bar{x}_3)$$

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$$(x_1 \vee x_2 \vee \bar{x}_3) \wedge (x_1 \vee \bar{x}_2 \vee \bar{x}_3) \wedge (\bar{x}_1 \vee x_2 \vee \bar{x}_3)$$

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CERTIFY

CERTIFICATE ← EVIDENCE OF YES INSTANCE

(1) DOES  $(x_1, x_2, x_3) = (1, 0, 1)$  SATISFY

$$(x_1 \vee x_2 \vee \bar{x}_3) \wedge (x_1 \vee \bar{x}_2 \vee \bar{x}_3)$$

GIVEN AN ASSIGNMENT, WE CAN  
CHECK IF IT IS A SATISFYING ASSIGNMENT  
IN POLYNOMIAL TIME.



# FINDING A SOLUTION

3-SAT

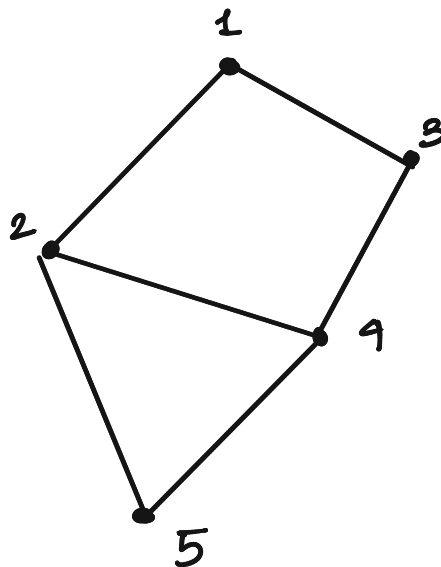
INDEPENDENT SET

VERTEX COVER

SET COVER

## CERTIFY

(1) IS THERE AN  
INDEPENDENT SET  
OF SIZE ATLEAST 2?



# FINDING A SOLUTION

3-SAT

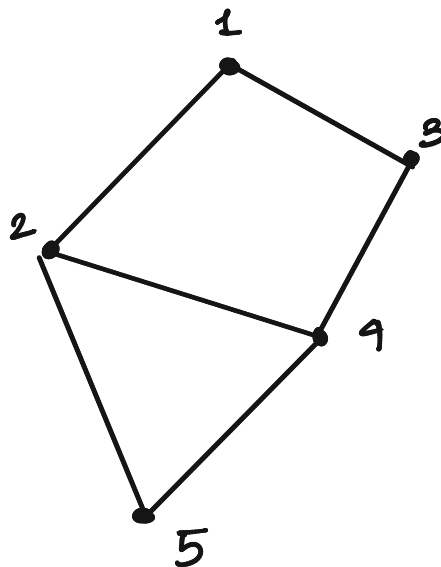
INDEPENDENT SET

VERTEX COVER

SET COVER

## CERTIFY

(1) IS THERE AN  
INDEPENDENT SET  
OF SIZE ATLEAST 2?



$$X = \{2, 3\}$$

GIVEN  $X$ , WE CAN CHECK IF  $X$  IS AN  
INDEPENDENT SET IN POLYNOMIAL TIME.

# FINDING A SOLUTION

3-SAT

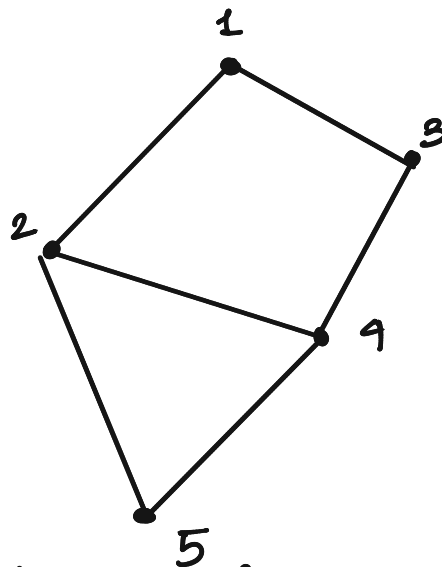
INDEPENDENT SET

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## CERTIFY

(1) IS THERE AN  
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$$X = \{2, 3\}$$

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GIVEN  $X$ , WE CAN CHECK IF  $X$  IS AN  
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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
POLYNOMIAL TIME.

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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
POLYNOMIAL TIME.

Q: CAN YOU THINK OF A PROBLEM FOR  
WHICH THE CERTIFYING ALGO TAKES  
EXPONENTIAL TIME?

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INDEPENDENT SET

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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
POLYNOMIAL TIME.

Q: CAN YOU THINK OF A PROBLEM FOR  
WHICH THE CERTIFYING ALGO TAKES  
EXPONENTIAL TIME?

IS THE # PATHS BETWEEN  $s$  TO  $T \geq k$ ?

# FINDING A SOLUTION

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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
POLYNOMIAL TIME.

NP: CLASS OF PROBLEMS FOR WHICH THERE  
IS AN EFFICIENT CERTIFIER.

# FINDING A SOLUTION

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INDEPENDENT SET

VERTEX COVER

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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
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NP: CLASS OF PROBLEMS FOR WHICH THERE  
IS AN EFFICIENT CERTIFIER.

P: CLASS OF PROBLEMS THAT BE SOLVED  
EFFICIENTLY.



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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
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NP: CLASS OF PROBLEMS FOR WHICH THERE  
IS AN EFFICIENT CERTIFIER.

P: CLASS OF PROBLEMS THAT BE SOLVED  
EFFICIENTLY.

SHORTEST PATH

MAXIMUM MATCHING

MAX FLOW

# FINDING A SOLUTION

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## CERTIFY

CERTIFYING ALGORITHM SEEMS TO TAKE  
POLYNOMIAL TIME.

NP: CLASS OF PROBLEMS FOR WHICH THERE  
IS AN EFFICIENT CERTIFIER.

P: CLASS OF PROBLEMS THAT BE SOLVED  
EFFICIENTLY.

IS  $P \subseteq NP$  ?

LEMMA :  $P \subseteq NP$ .

$P \leftarrow$  POLYNOMIALLY SOLVABLE

$\Rightarrow$  POLYNOMIAL CERTIFIER

LEMMA :  $P \subseteq NP$ .

$P \leftarrow$  POLYNOMIALLY SOLVABLE

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IS THERE A PROBLEM IN NP WHICH  
IS NOT IN P ?

LEMMA :  $P \subseteq NP$ .

$P \leftarrow$  POLYNOMIALLY SOLVABLE

$\Rightarrow$  POLYNOMIAL CERTIFIER

IS THERE A PROBLEM IN NP WHICH  
IS NOT IN P ?

OR IS  $P = NP$  ?

LEMMA :  $P \subseteq NP$ .

$P \leftarrow$  POLYNOMIALLY SOLVABLE

$\Rightarrow$  POLYNOMIAL CERTIFIER

IS THERE A PROBLEM IN NP WHICH  
IS NOT IN P ?

OR IS  $P = NP$  ?

↑

FAMOUS PROBLEM OF OUR TIMES.

LEMMA :  $P \subseteq NP$ .

$P \leftarrow$  POLYNOMIALLY SOLVABLE

$\Rightarrow$  POLYNOMIAL CERTIFIER

IS THERE A PROBLEM IN NP WHICH  
IS NOT IN P ?

OR IS  $P = NP$  ?

FAMOUS PROBLEM OF OUR TIMES.

MANY BELIEVE ANS IS NO,  
THOUGH ITS JUST A BELIEF.

3-SAT, INDEPENDENT SET,  
VERTEX COVER E NP



3-SAT, INDEPENDENT SET,

VERTEX COVER E P

???

NOT KNOWN

3-SAT, INDEPENDENT SET,

VERTEX COVER       $\in P$   
                             ???

NOT KNOWN

SUPPOSE YOU ARE ABLE TO SHOW THAT

3-SAT  $\in P$

WOULD YOU HAVE SOLVED  $P = NP$  QUESTION ?

3-SAT, INDEPENDENT SET,

VERTEX COVER  $\in P$   
???

NOT KNOWN

SUPPOSE YOU ARE ABLE TO SHOW THAT

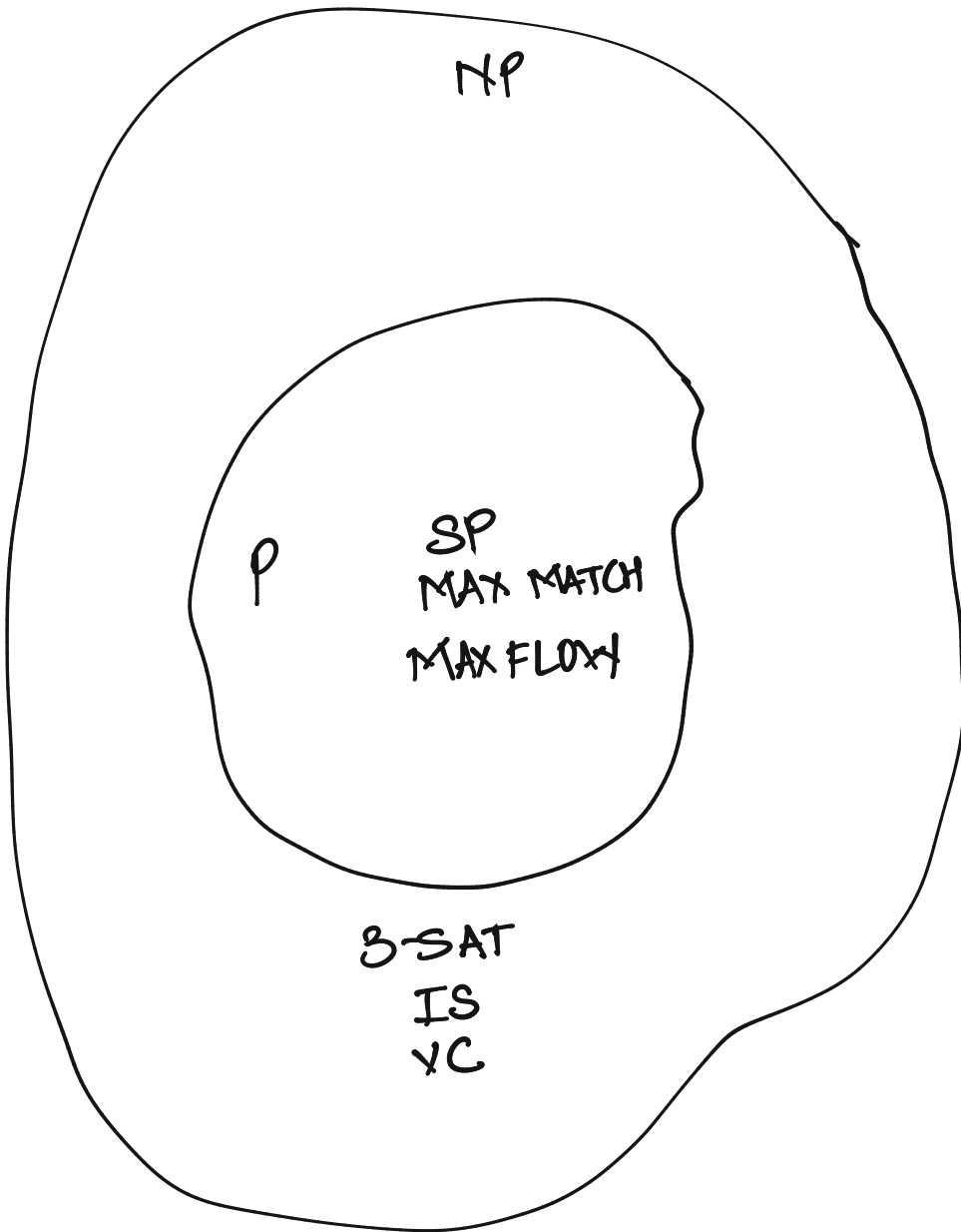
3-SAT  $\in P$

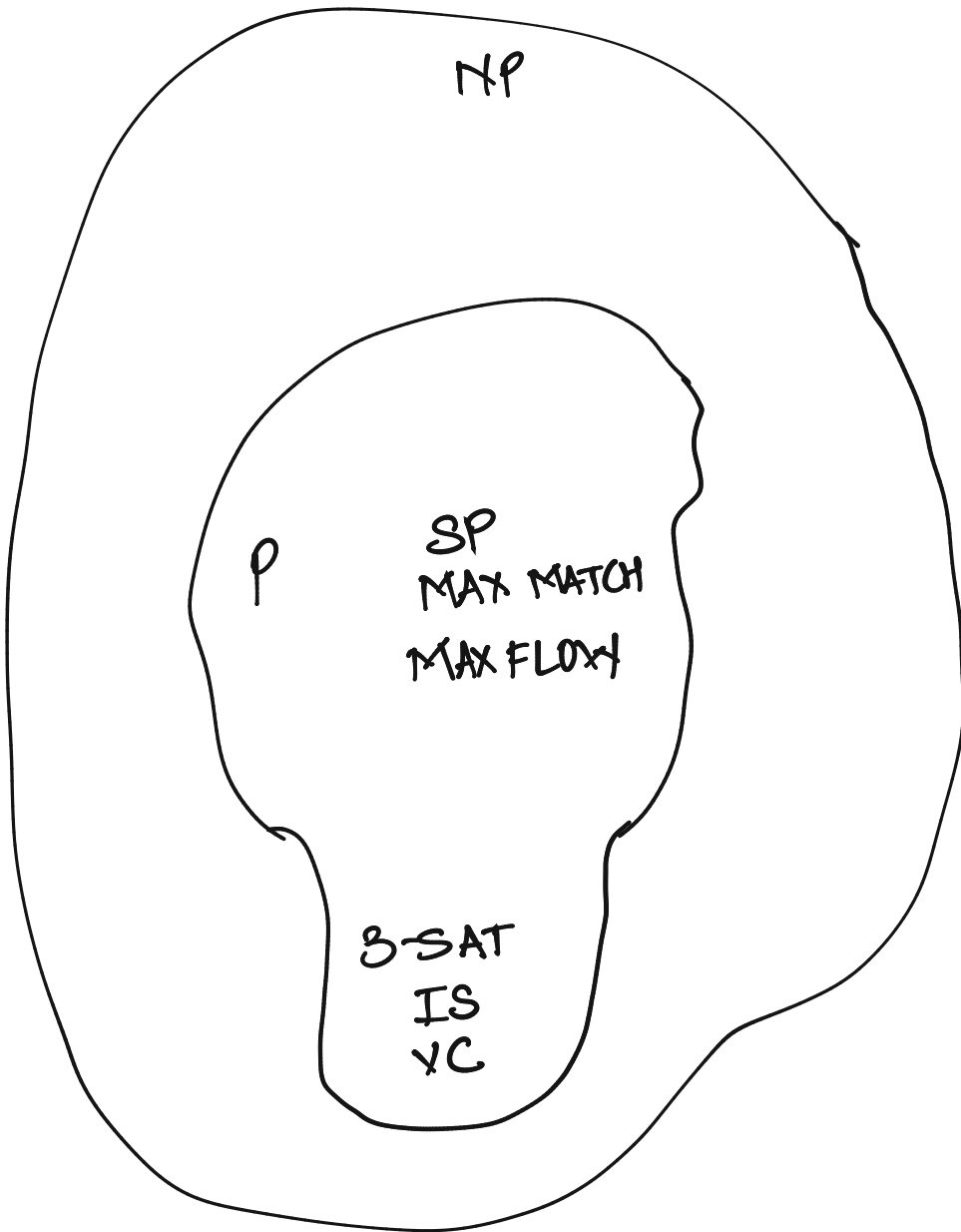
WOULD YOU HAVE SOLVED  $P=NP$  QUESTION?

NO BECAUSE YOU HAVE SHOWN THAT

3-SAT, INDEPENDENT SET,

VERTEX COVER  $\in P$





NP-COMPLETE PROBLEM:

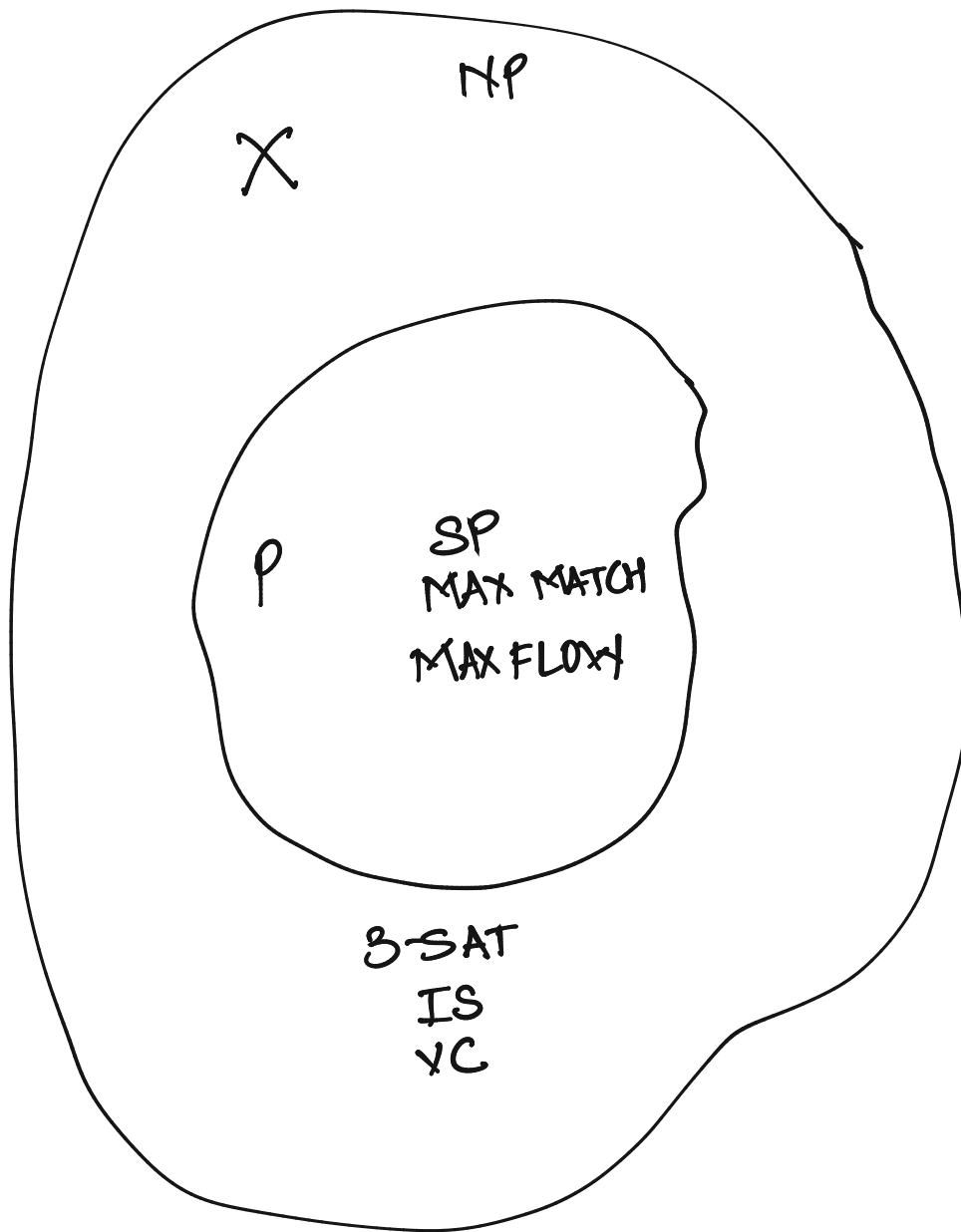
A PROBLEM  $X$  IS NP-COMPLETE IF

(a)  $X \in NP$  and

(b) FOR ANY  $Y \in NP$ ,

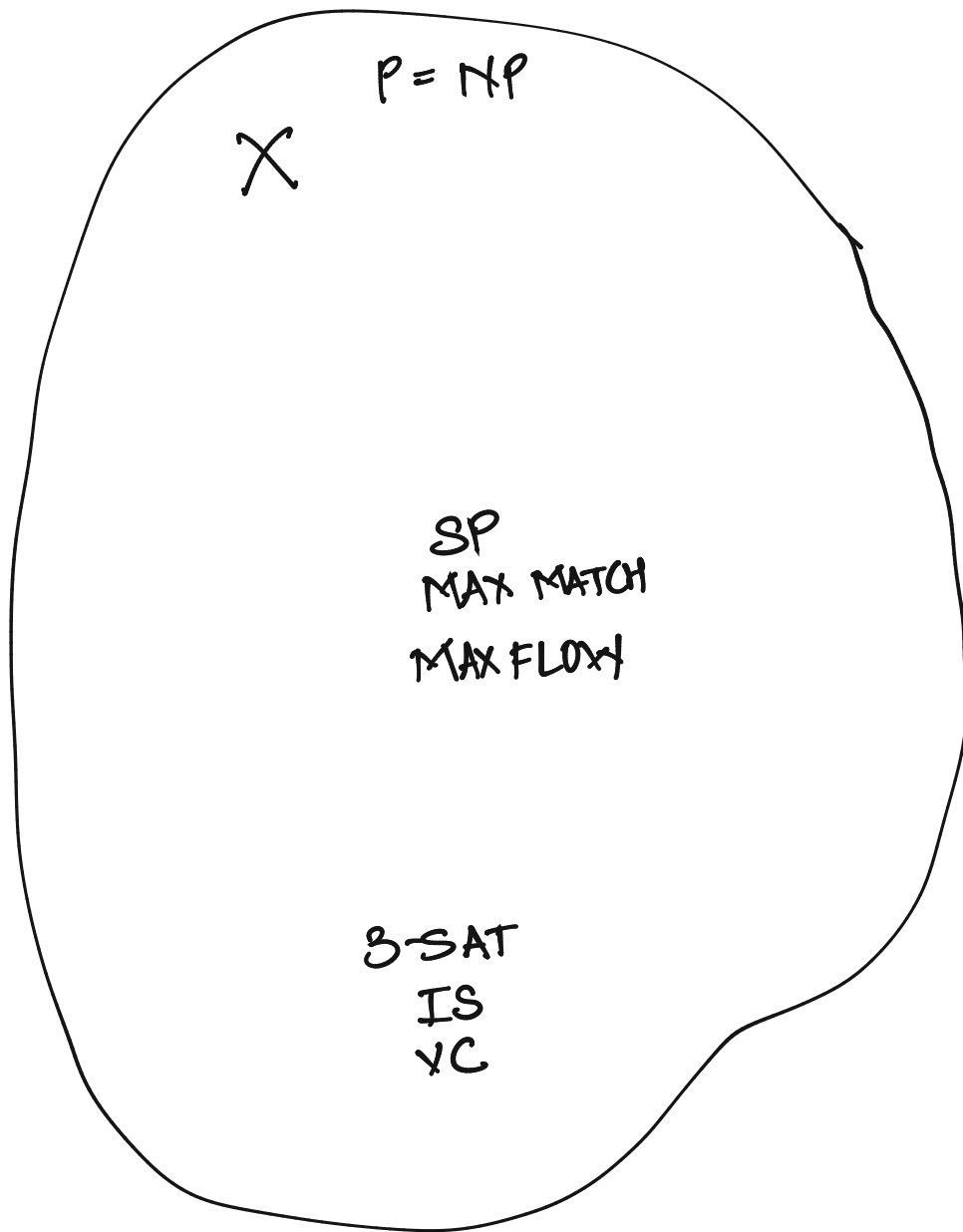
$Y \leq_p X$ .





IF YOU SHOW  $X \in P$ , THEN





IF YOU SHOW  $X \in P$ , THEN  
ALL PROBLEMS OF NP ARE IN P  
OR  $NP = P$

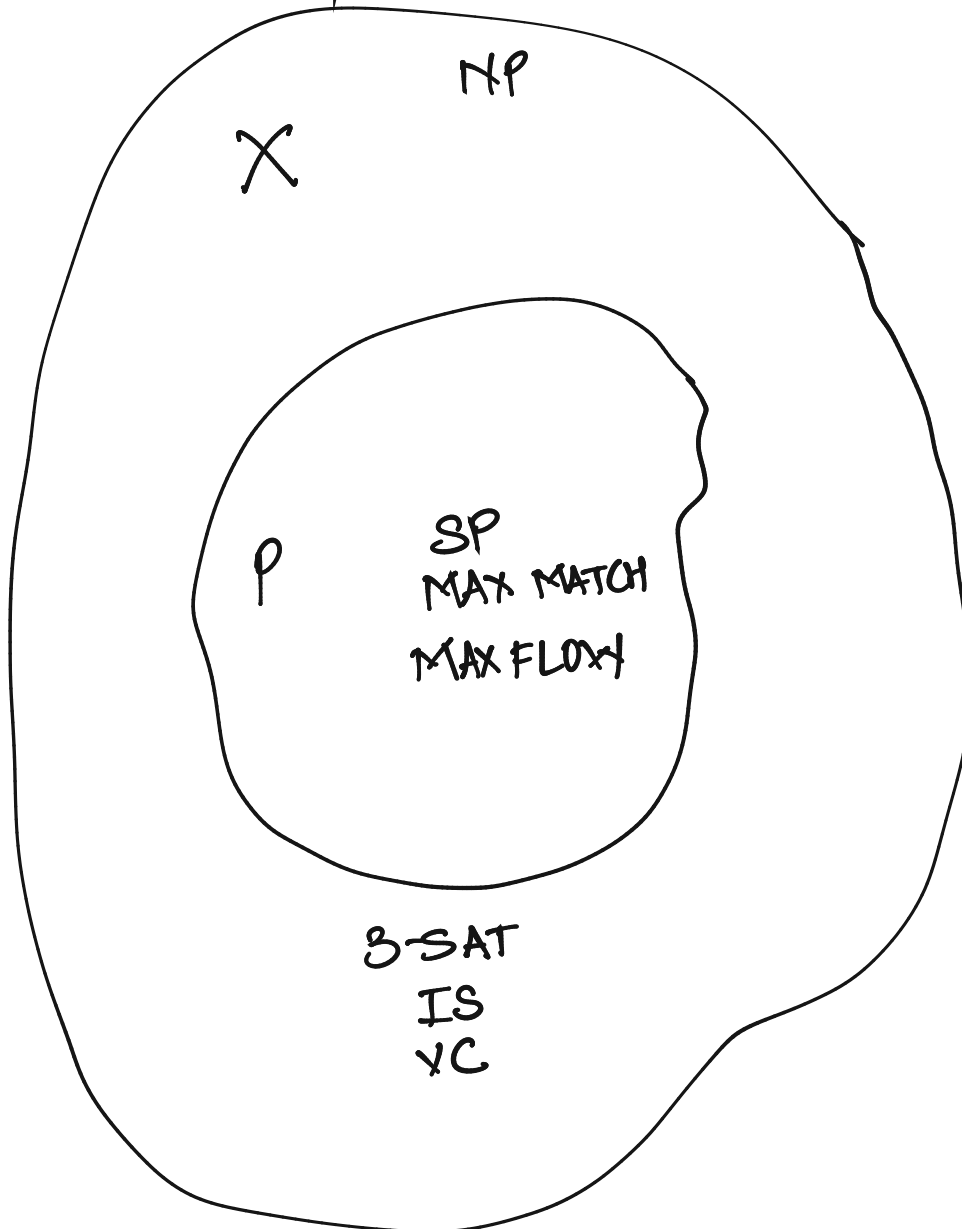
# NP-COMPLETE PROBLEM:

A PROBLEM X IS NP-COMPLETE IF

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$$Y \leq_p X.$$

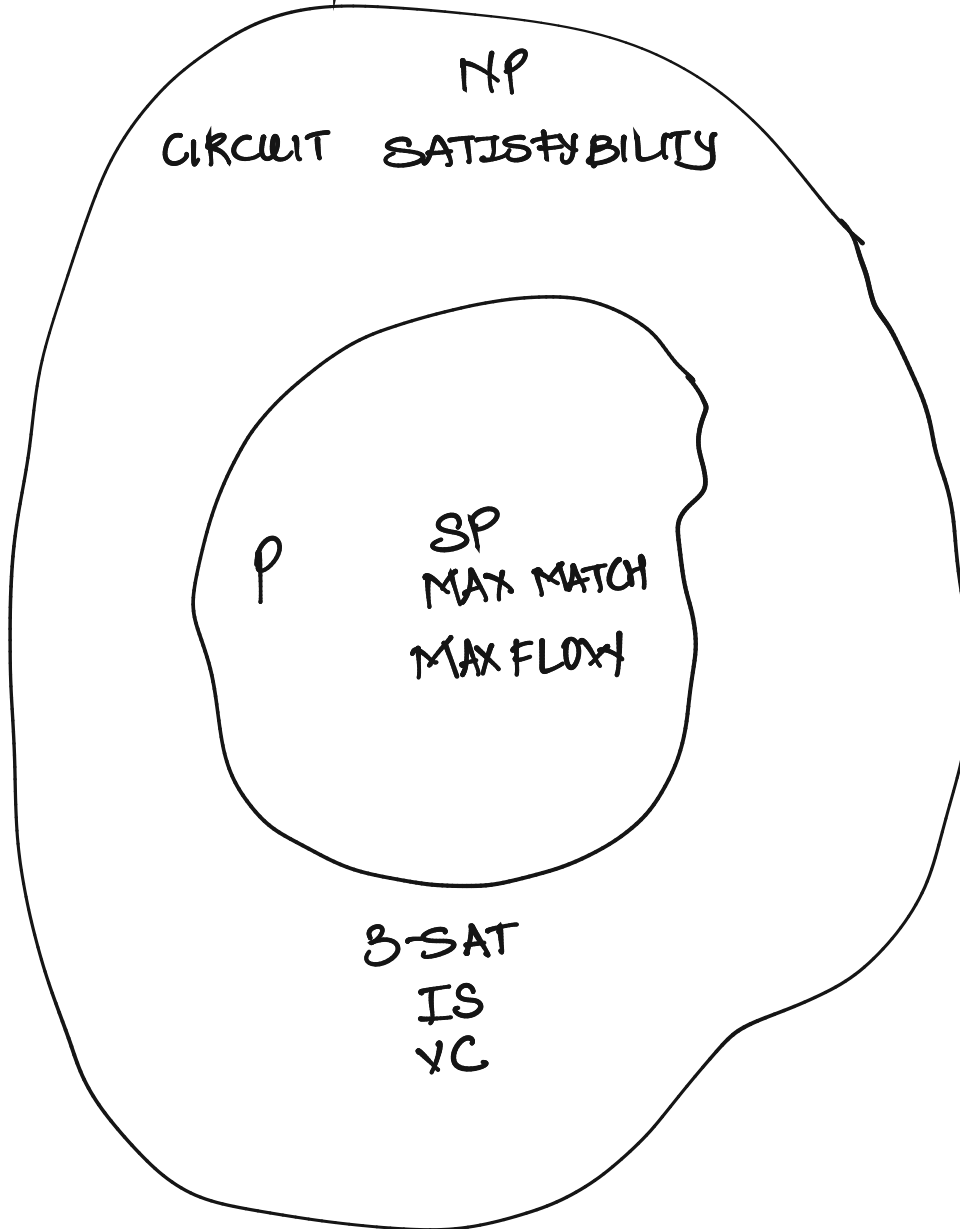


DO WE KNOW OF ANY PROBLEM THAT IS NP-COMPLETE?

# NP-COMPLETE PROBLEM:

A PROBLEM X IS NP-COMPLETE IF

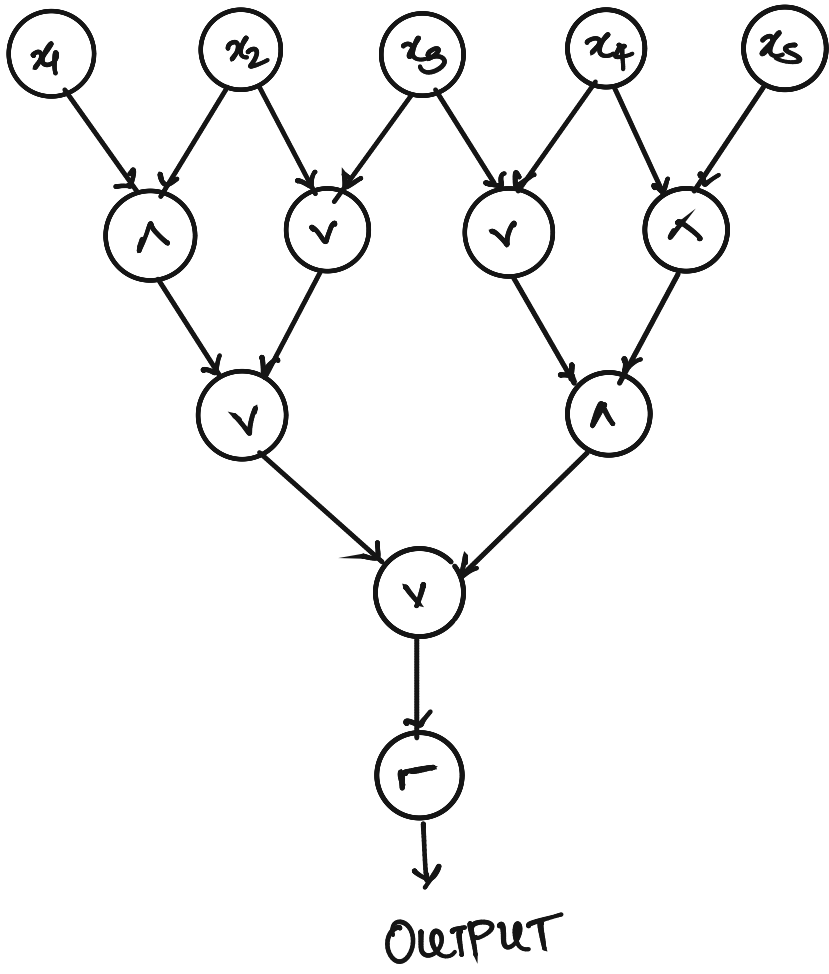
- (a)  $X \in NP$  and
- (b) FOR ANY  $Y \in NP$ ,  
 $Y \leq_p X$ .



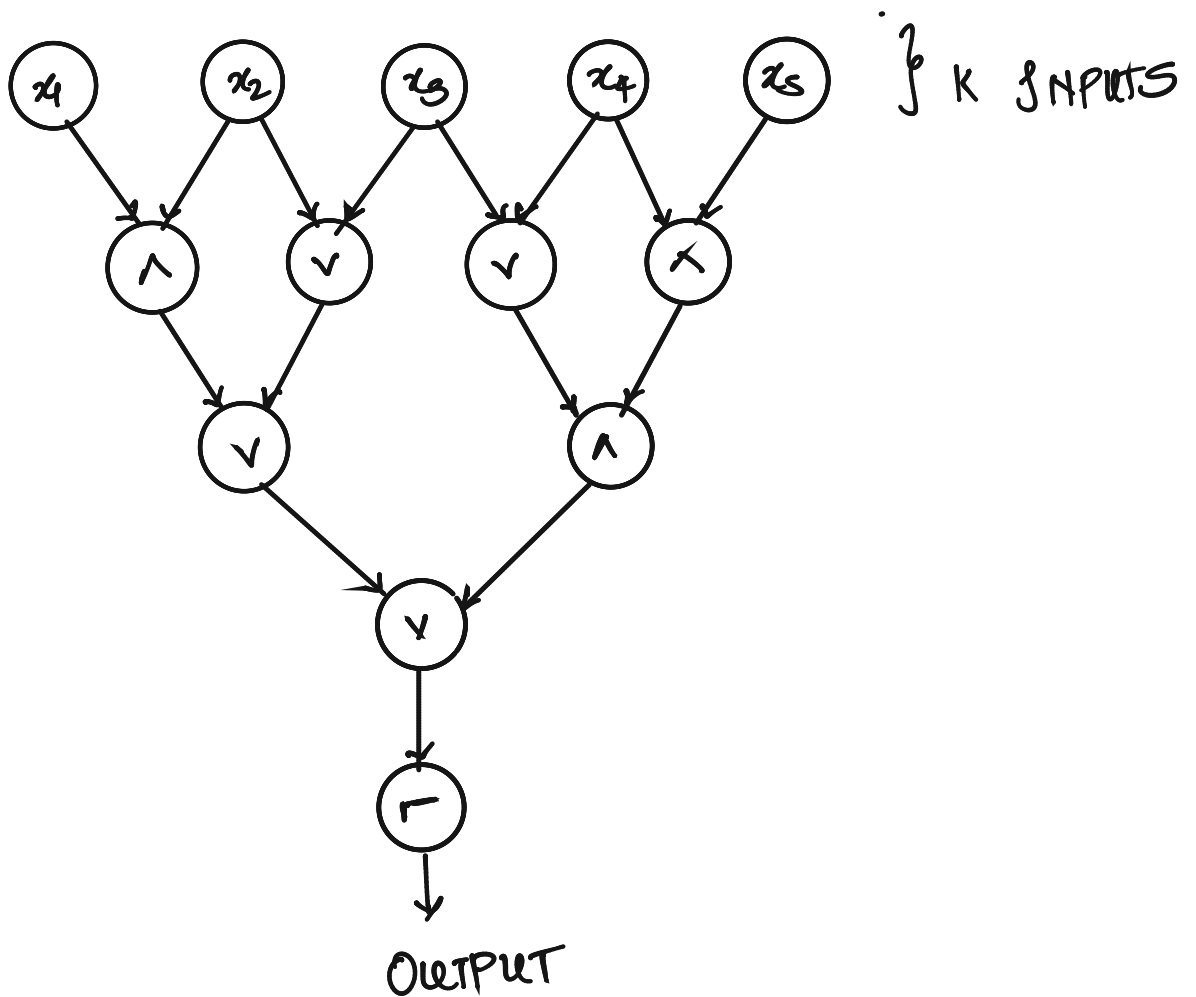
COOK J  
LEXIN 1971

DO WE KNOW OF ANY PROBLEM THAT IS  
NP-COMPLETE?

# CIRCUIT SATISFIABILITY



# CIRCUIT SATISFIABILITY



Q: DOES THERE EXIST AN INPUT FOR WHICH OUTPUT = 1. ?  
AN INPUT THAT SATISFIES THE CIRCUIT

CIRCUIT SATISFIABILITY IS NP-COMPLETE.

ASSUME THAT I AM ABLE TO SHOW  
CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

CIRCUIT SATISFIABILITY IS NP-COMPLETE.

ASSUME THAT I AM ABLE TO SHOW  
CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

3SAT IS NP-COMPLETE

REMEMBER

↓

NP-COMPLETE PROBLEM:

A PROBLEM  $X$  IS NP-COMPLETE IF

(a)  $X \in NP$  and

(b) FOR ANY  $Y \in NP$ ,  
 $Y \leq_p X$ .

LEMMA : IF  $X$  IS NP-COMPLETE  $\wedge \exists Y \in \text{NP}$   
ST  $X \leq_p Y$ , THEN  $Y$  IS  
NP-COMPLETE



CIRCUIT SATISFYABILITY  $\leq_p$  3-SAT

3-SAT IS NP-COMPLETE

CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

3-SAT IS NP-COMPLETE

3-SAT  $\leq_p$  INDEPENDENT SET

INDEPENDENT SET IS NP-COMPLETE

CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

3-SAT IS NP-COMPLETE

3-SAT  $\leq_p$  INDEPENDENT SET

INDEPENDENT SET IS NP-COMPLETE

INDEPENDENT SET  $\leq_p$  VERTEX COVER

VERTEX COVER IS NP-COMPLETE

SET COVER IS NP-COMPLETE

CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

3-SAT IS NP-COMPLETE

3-SAT  $\leq_p$  INDEPENDENT SET

INDEPENDENT SET IS NP-COMPLETE

INDEPENDENT SET  $\leq_p$  VERTEX COVER

VERTEX COVER IS NP-COMPLETE

SET COVER IS NP-COMPLETE

WE KNOW THOUSANDS OF PROBLEMS THAT  
ARE NP-COMPLETE.

LEMMA : CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

$$(x_1 \vee x_2) \wedge (x_1 \vee \bar{x}_2 \vee x_3) \wedge (x_2 \vee \bar{x}_4)$$



CAN YOU CONVERT THE ABOVE PROBLEM INTO A 3SAT PROBLEM.

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

$$(x_1 \vee x_2) \wedge (x_1 \vee \bar{x}_2 \vee x_3) \wedge (x_2 \vee \bar{x}_4)$$

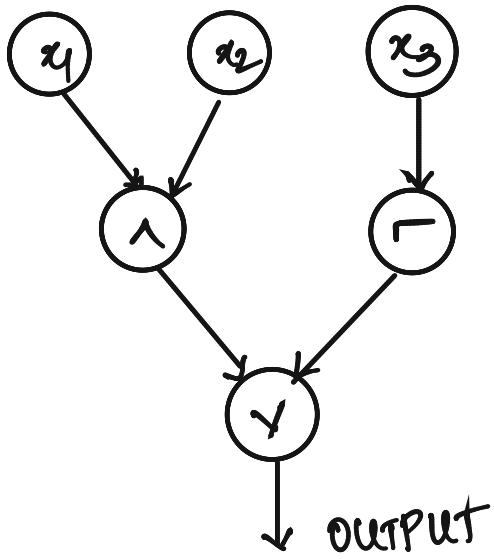


CAN YOU CONVERT THE ABOVE PROBLEM INTO A 3SAT PROBLEM.

ADD A NEW VARIABLE  $x_5$

$$(x_1 \vee x_2 \vee x_5) \wedge (x_1 \vee x_2 \vee \bar{x}_5) \wedge (x_1 \vee \bar{x}_2 \vee x_3) \\ \wedge (x_2 \vee \bar{x}_4 \vee x_5) \wedge (x_2 \vee \bar{x}_4 \vee \bar{x}_5)$$

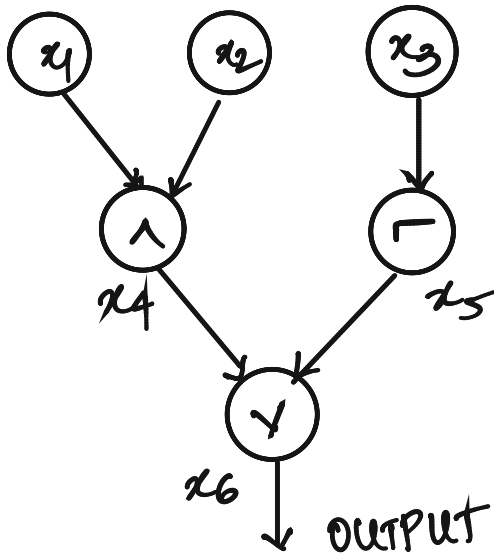
LEMMA : CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT



CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

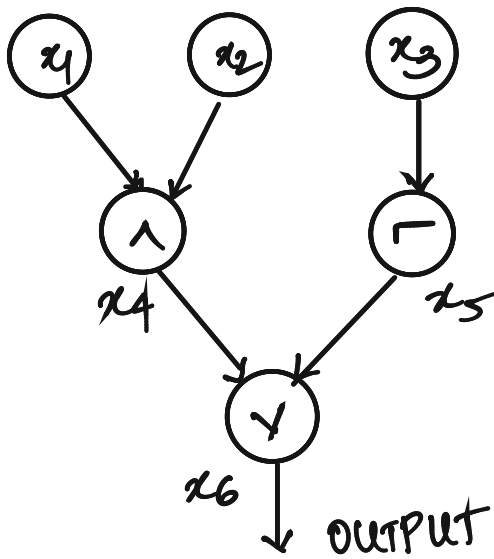


LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT



CONVERT THIS  
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3-SAT PROBLEM

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

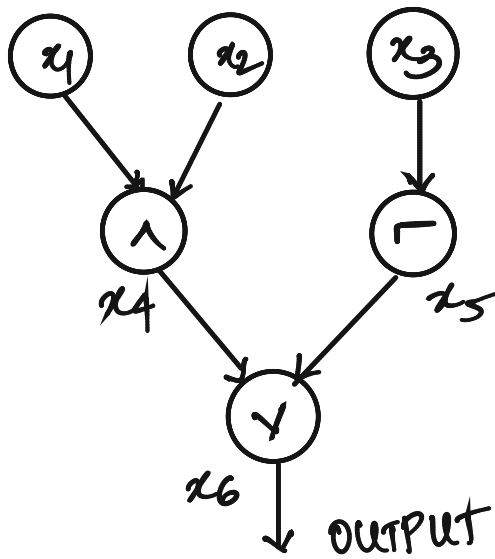


CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$$x_5 = \overline{x_3}$$

ADD CLAUSES WHICH WILL ENFORCE  
THIS

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT



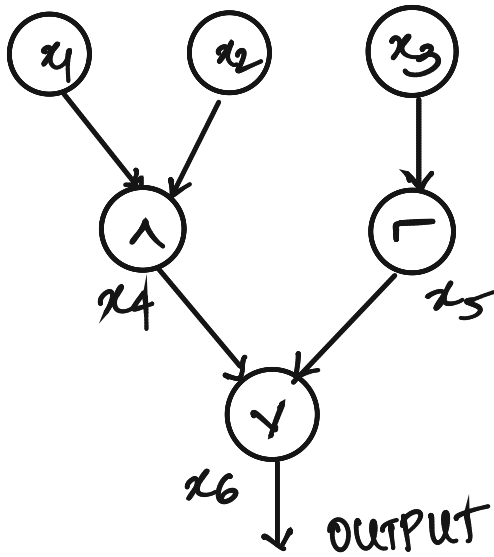
CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$$x_5 = \overline{x_3}$$

ADD CLAUSES WHICH WILL ENFORCE  
THIS

$$(x_3 \vee x_5), (\overline{x_3} \vee \overline{x_5})$$

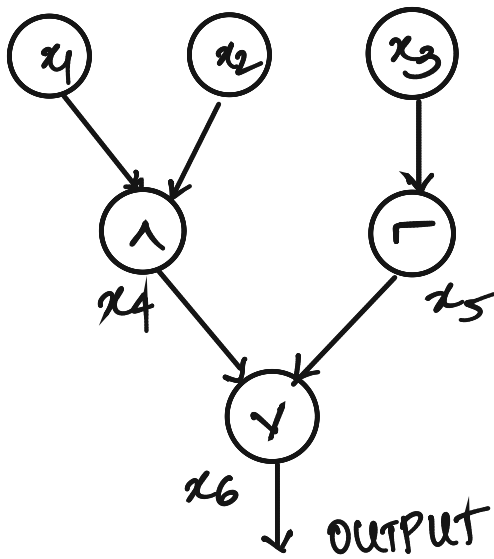
LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5), (\bar{x}_3 \vee \bar{x}_5)$



CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$$x_4 = x_1 \wedge x_2$$

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5), (\bar{x}_3 \vee \bar{x}_5)$

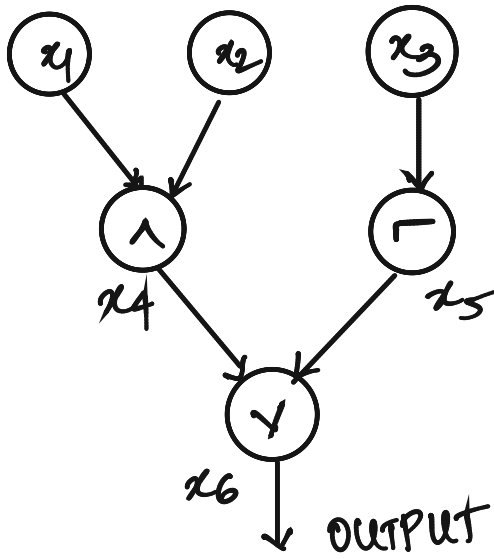


→ CONVERT THIS INSTANCE TO A 3-SAT PROBLEM

$$x_4 = x_1 \wedge x_2$$

$x_1$	$x_2$	$x_4$	
0	0	0	✓
0	0	1	✗
0	1	0	✓
0	1	1	✗
1	0	0	✓
1	0	1	✗
1	1	0	✗
1	1	1	✓

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5), (\bar{x}_3 \vee \bar{x}_5)$

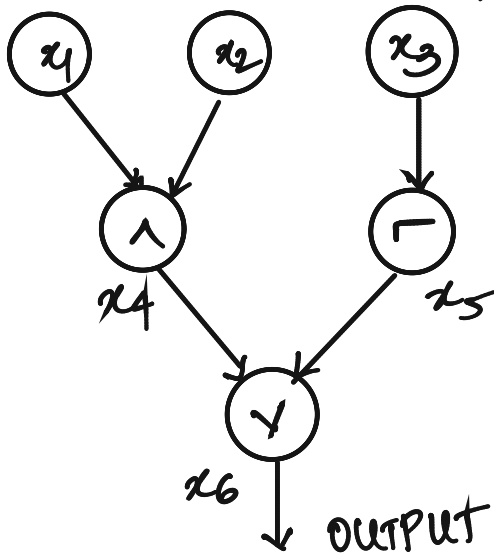


→ CONVERT THIS INSTANCE TO A 3-SAT PROBLEM

$$x_4 = x_1 \wedge x_2$$

$x_1$	$x_2$	$x_4$		
0	0	0	✓	
0	0	1	✗	$x_1 \vee x_2 \vee \bar{x}_4$
0	1	0	✓	
0	1	1	✗	$x_1 \vee \bar{x}_2 \vee \bar{x}_4$
1	0	0	✓	
1	0	1	✗	$\bar{x}_1 \vee x_2 \vee \bar{x}_4$
1	1	0	✗	$\bar{x}_1 \vee \bar{x}_2 \vee x_4$
1	1	1	✓	

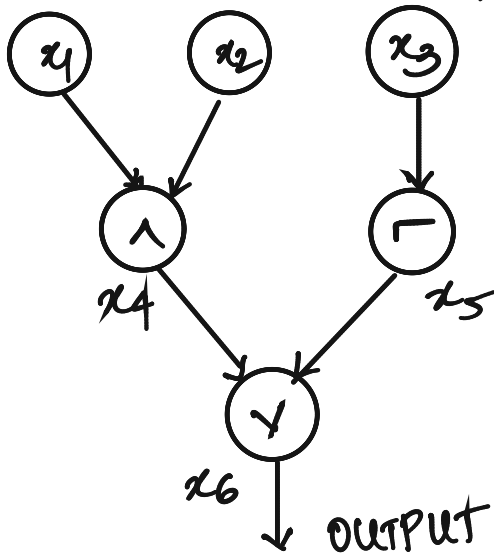
LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$



CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$$x_4 = x_1 \wedge x_2$$

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$

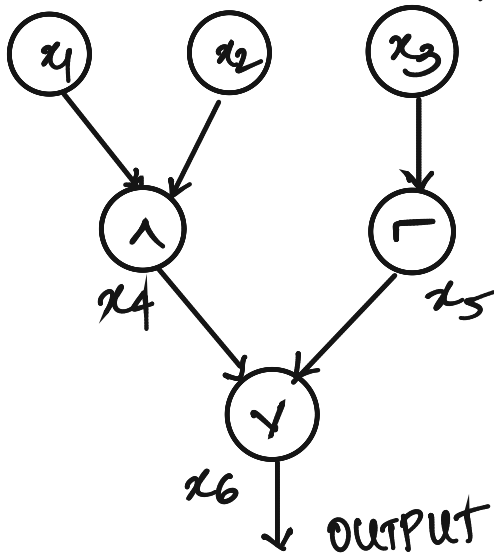


CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$$x_6 = x_4 \vee x_5$$



LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$

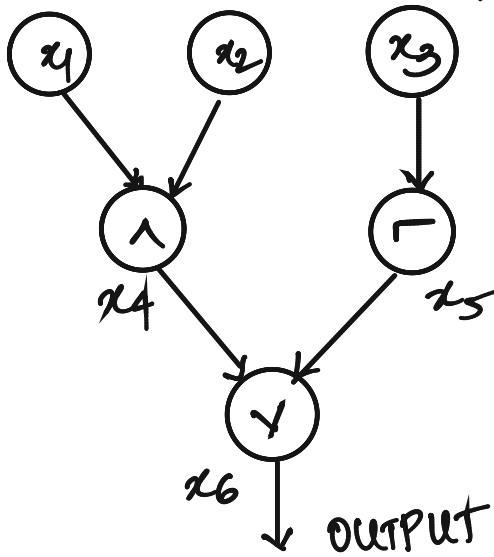


CONVERT THIS  
 INSTANCE TO A  
 3-SAT PROBLEM

$$x_6 = x_4 \vee x_5$$

$x_4$	$x_5$	$x_6$	
0	0	0	✓
0	0	1	✗
0	1	0	✗
0	1	1	✓
1	0	0	✗
1	0	1	✓
1	1	0	✗
1	1	1	✓

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT  
 $(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$

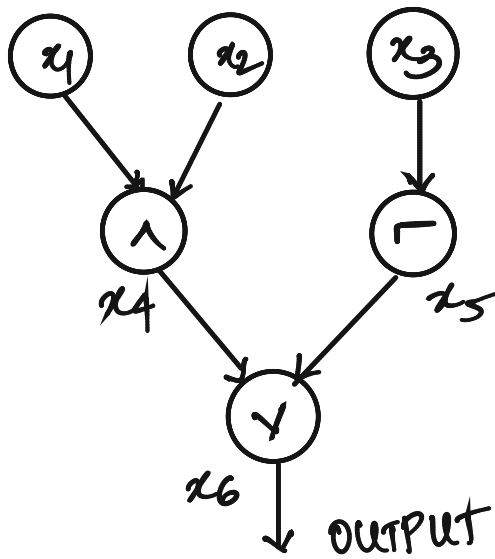


CONVERT THIS  
 INSTANCE TO A  
 3-SAT PROBLEM

$$x_6 = x_4 \vee x_5$$

$x_4$	$x_5$	$x_6$		
0	0	0	✓	
0	0	1	x	$(x_4 \vee x_5 \vee \bar{x}_6)$
0	1	0	x	$(x_4 \vee \bar{x}_5 \vee x_6)$
0	1	1	✓	
1	0	0	x	$(\bar{x}_4 \vee x_5 \vee x_6)$
1	0	1	✓	
1	1	0	x	$(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$
1	1	1	✓	

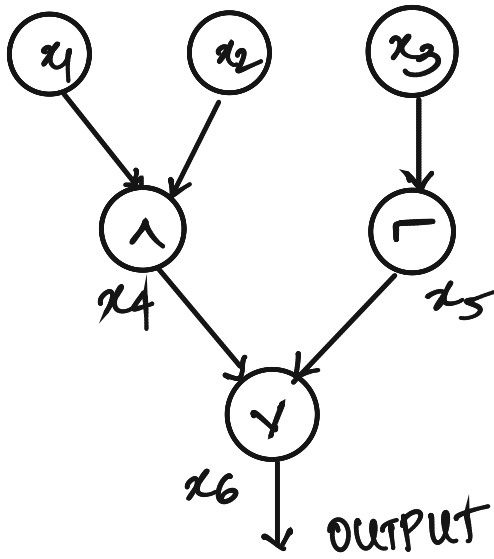
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CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

$(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee x_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

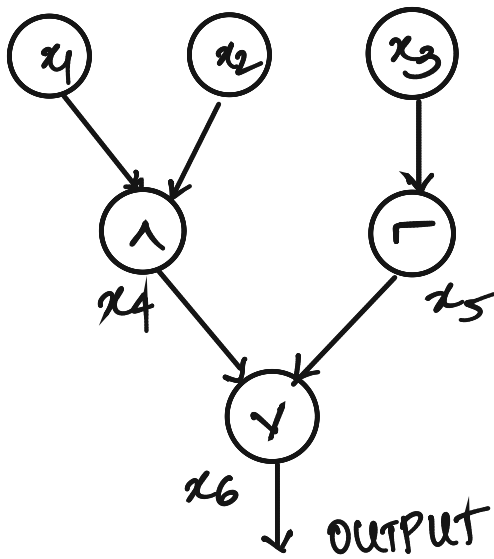


→ CONVERT THIS INSTANCE TO A 3-SAT PROBLEM

$(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

↓  
FORCES  $x_6 = 1$   
REQUIRES AS WE  
WANT  $x_6 = 1$

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT

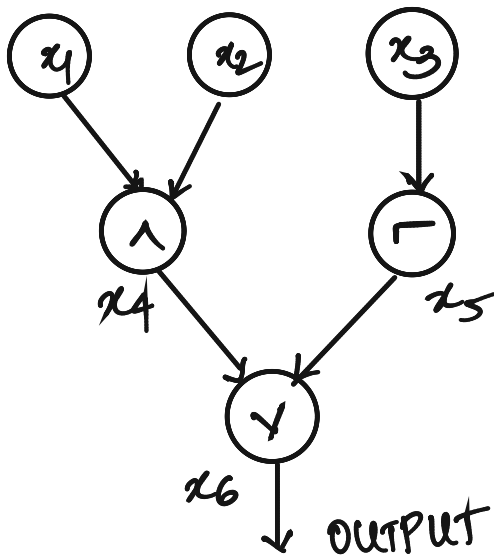


→ CONVERT THIS INSTANCE TO A 3-SAT PROBLEM

$(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

IS THERE A SATISFIABLE ASSIGNMENT TO THE ABOVE CLAUSES?

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT



CONVERT THIS  
INSTANCE TO A  
3-SAT PROBLEM

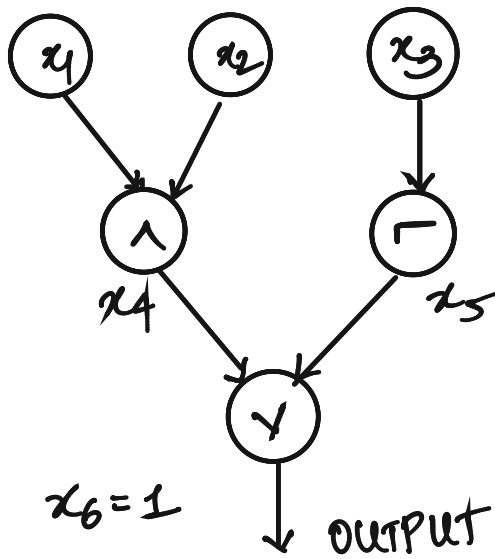
$(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

IS THERE A SATISFIABLE ASSIGNMENT  
TO THE ABOVE CLAUSES?

⇓ YES

CAN WE SAY ITS A  
YES INSTANCE OF  
CIRCUIT SATISFIABILITY

LEMMA: CIRCUIT SATISFIABILITY  $\leq_p$  3-SAT



→ CONVERT THIS INSTANCE TO A 3-SAT PROBLEM

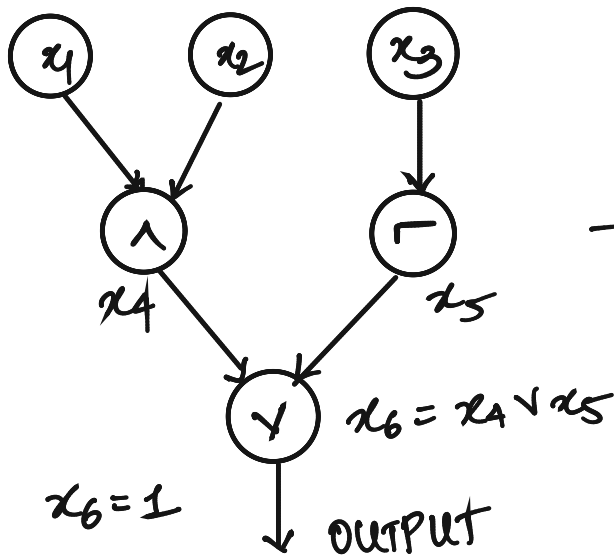
$(x_3 \vee x_5)$ ,  $(\bar{x}_3 \vee \bar{x}_5)$ ,  $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(x_1 \vee \bar{x}_2 \vee x_4)$ ,  
 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

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 $(x_1 \vee x_2 \vee \bar{x}_4)$ ,  $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$ ,  $(x_4 \vee x_5 \vee \bar{x}_6)$ ,  $(x_4 \vee \bar{x}_5 \vee x_6)$ ,  
 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

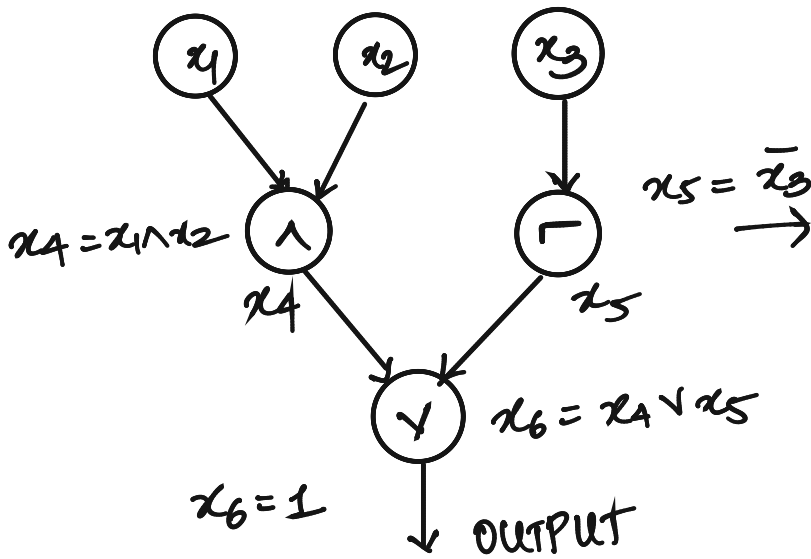
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CONVERT THIS  
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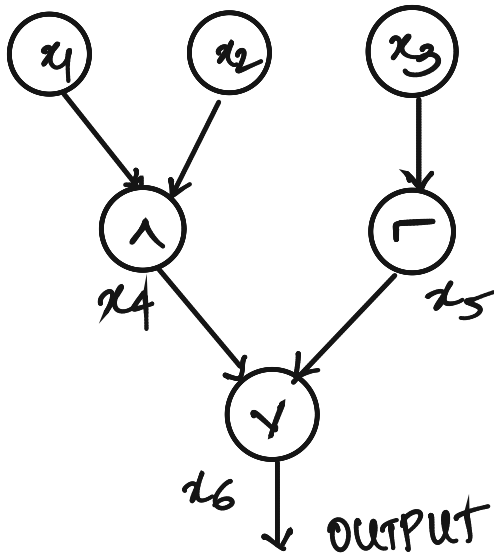
- $(x_3 \vee x_5)$
- $(\bar{x}_3 \vee \bar{x}_5)$
- $(x_1 \vee x_2 \vee \bar{x}_4)$
- $(x_1 \vee x_2 \vee x_4)$
- $(\bar{x}_1 \vee \bar{x}_2 \vee x_4)$
- $(x_4 \vee x_5 \vee \bar{x}_6)$
- $(x_4 \vee \bar{x}_5 \vee x_6)$
- $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$
- $x_6$

IS THERE A SATISFIABLE ASSIGNMENT  
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 $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $(\bar{x}_4 \vee \bar{x}_5 \vee x_6)$ ,  $x_6$

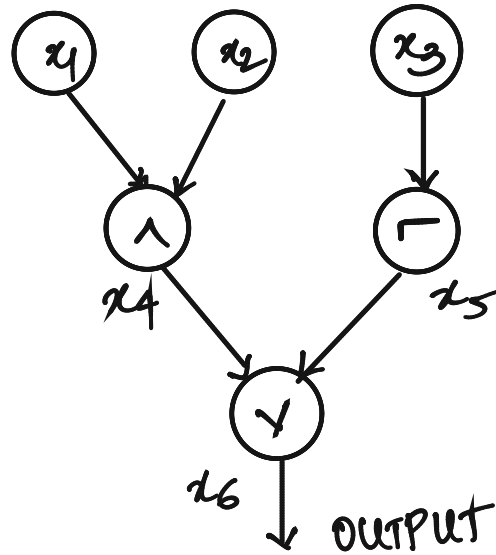
IS THERE A SATISFIABLE ASSIGNMENT TO THE ABOVE CLAUSES?

⇓ YES

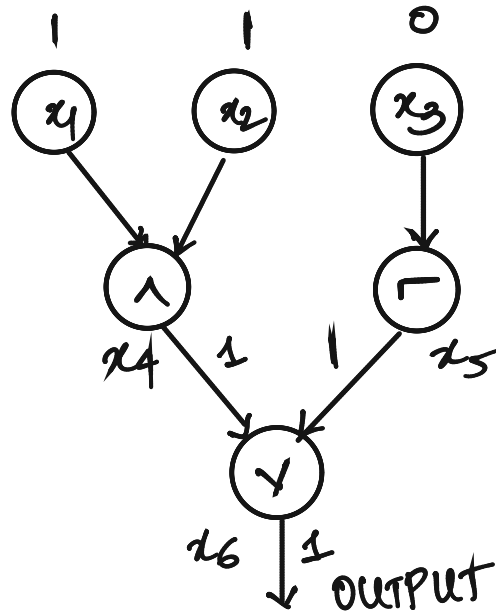
⇓ NO

CAN WE SAY ITS A YES INSTANCE OF CIRCUIT SATISFIABILITY

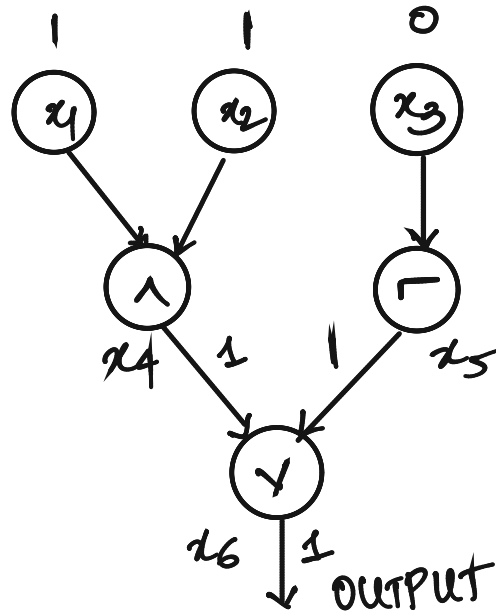
→ IF THE GIVEN INSTANCE IS A YES INSTANCE OF CIRCUIT SATISFIABILITY, THEN THE CORRESPONDING 3-SAT INSTANCE IS SATISFIABLE.



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$$x_1 = 1$$

$$x_2 = 1$$

$$x_3 = 0$$

$$x_4 = 1$$

$$x_5 = 1$$

$$x_6 = 1$$

⇒ A SATISFIABLE ASSIGNMENT FOR 3-SAT

## SUSPICIOUS USER PROBLEM.

- YOU ARE OWNER OF IITGN NETWORK.
- EACH USER OF IITGN ACCESSES ONE WEBSITE PER MINUTE. THIS ACCESS IS LOGGED → e.g.  
(gmanoj, 24, www.facebook.com).

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- THERE WAS A CO-ORDINATED ATTACK FROM IITGN WHERE SOME USERS ACCESSED  $t$  DISTINCT SITE OVER  $t$  MINUTES

$(u_1, i_1, s_1)$

$(u_2, i_2, s_2)$

$(u_3, i_3, s_3)$

⋮

$(u_t, i_t, s_t)$

- IS THERE A GROUP OF  $k$ -USERS THAT HAVE CARRIED OUT THE ATTACK? OR THERE IS ATLEAST ONE USER IN THIS GROUP THAT ACCESSES  $s_j$  AT TIME  $i_j$   
( $1 \leq j \leq t$ )

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( $1 \leq j \leq t$ )
- SUP IS NP-COMplete.



Is  $\text{SUP} \in \text{NP}$  ?

IS SUP  $\in$  NP ?

YES.

REDUCE A KNOWN NP-COMPLETE PROBLEM  
TO SUP.

IS SUP  $\in$  NP ?

YES.

REDUCE A KNOWN NP-COMplete PROBLEM  
TO SUP.

VERTEX COVER.

VC  $\leq_p$  SUP

$$VC \leq p \sup$$

$$\{e_1, e_2, e_3, \dots, e_m\}$$

$$\text{where } e_j = (u_j, v_j)$$

$$VC \leq p \sup$$

$\{e_1, e_2, e_3, \dots, e_m\}$

where  $e_j = (u_j, v_j)$

IS THERE A SET OF AT MOST  $k$  NODES  
COVER ALL THE EDGES ?

⇓

SUSPICIOUS USER PROBLEM

$$VC \leq p \text{ SUP}$$

$$\{e_1, e_2, e_3, \dots, e_m\}$$

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IS THERE A SET OF AT MOST  $k$  NODES  
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⇓

SUSPICIOUS USER PROBLEM

Q: MAKE LOGS USING THE ABOVE  
GRAPH ?

$$VC \leq p \sup$$

$\{e_1, e_2, e_3, \dots, e_m\}$

where  $e_j = (u_j, v_j)$

IS THERE A SET OF AT MOST  $k$  NODES  
COVER ALL THE EDGES?

⇓

SUSPICIOUS USER PROBLEM

Q: MAKE LOGS USING THE ABOVE  
GRAPH?

AT TIME  $t_j$ , SITE  $s_j$   
WAS ACCESSED BY  $u_j$  &  $v_j$   
AND ALL OTHER NODES  
ACCESSED NOTHING.

$$VC \leq p \sup$$

$\{e_1, e_2, e_3, \dots, e_m\}$

where  $e_j = (u_j, v_j)$

IS THERE A SET OF AT MOST  $k$  NODES  
COVER ALL THE EDGES?

⇓

SUSPICIOUS USER PROBLEM

Q: MAKE LOGS USING THE ABOVE  
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WAS ACCESSED BY  $u_j$  &  $v_j$   
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IS THERE A SET OF  $k$  USERS  
THAT ACCESSED SITES  $s_1, s_2, \dots, s_m$   
AT TIME  $1, 2, \dots, m$  RESPECTIVELY?



$VC \leq_p SUP$

$\{e_1, e_2, e_3, \dots, e_m\}$

where  $e_j = (u_j, v_j)$

IS THERE A SET OF AT MOST  $K$  NODES  
COVER ALL THE EDGES?

INSTANCE OF  
VC



INSTANCE OF  
SUP

AT TIME  $i_j$ , SITE  $s_j$   
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THAT ACCESSED SITES  $s_1, s_2, \dots, s_m$   
AT TIME  $1, 2, \dots, m$  RESPECTIVELY?

↓ YES

AT TIME  $t_j$ , SITE  $s_j$   
WAS ACCESSED BY  $u_j$  &  $v_j$   
AND ALL OTHER NODES  
ACCESSED NOTHING.

IS THERE A SET OF AT MOST  $K$  USERS  
THAT ACCESSED SITES  $s_1, s_2, \dots, s_m$   
AT TIME  $1, 2, \dots, m$  RESPECTIVELY?

↓ YES

↓ NO

A VERTEX COVER OF  
SIZE  $\leq K$

AT TIME  $t_j$ , SITE  $s_j$   
WAS ACCESSED BY  $u_j$  &  $v_j$   
AND ALL OTHER NODES  
ACCESSED NOTHING.

IS THERE A SET OF AT MOST  $K$  USERS  
THAT ACCESSED SITES  $s_1, s_2, \dots, s_m$   
AT TIME  $1, 2, \dots, m$  RESPECTIVELY?

↓ YES

↓ NO

A VERTEX COVER OF  
SIZE  $\leq K$

LEMMA: If  $\exists$  A VERTEX COVER OF SIZE  
AT MOST  $K$  IN  $G$ , THEN THE  
CORRESPONDING SUP PROBLEM  
IS A YES INSTANCE.