

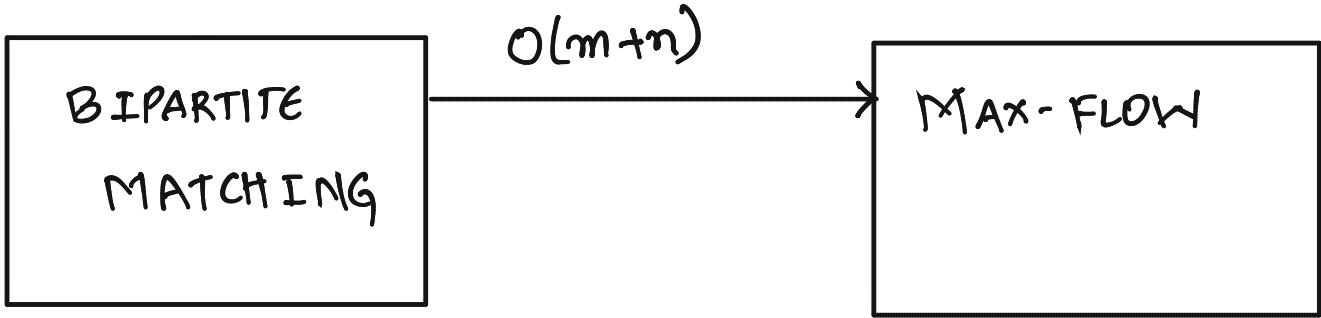
BIPARTITE

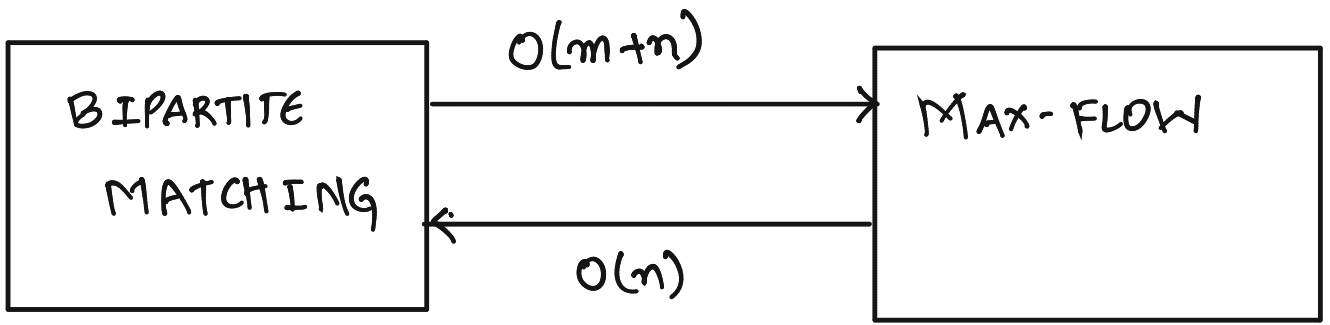
MATCHING

BIPARTITE
MATCHING

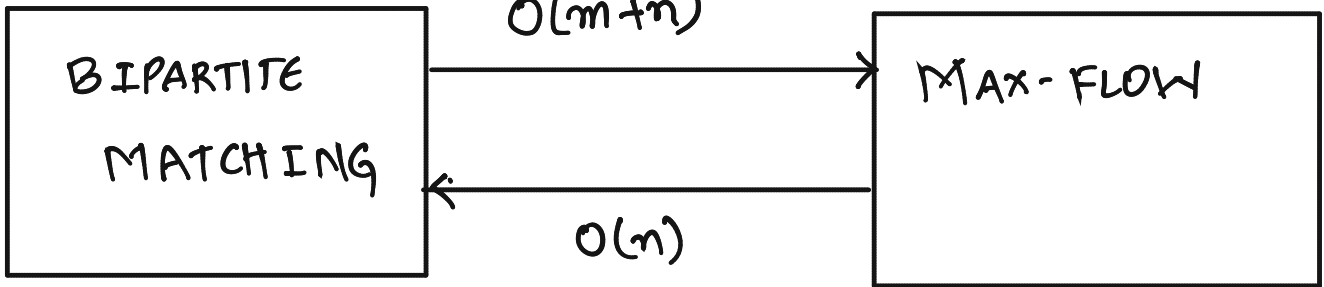


MAX-FLOW



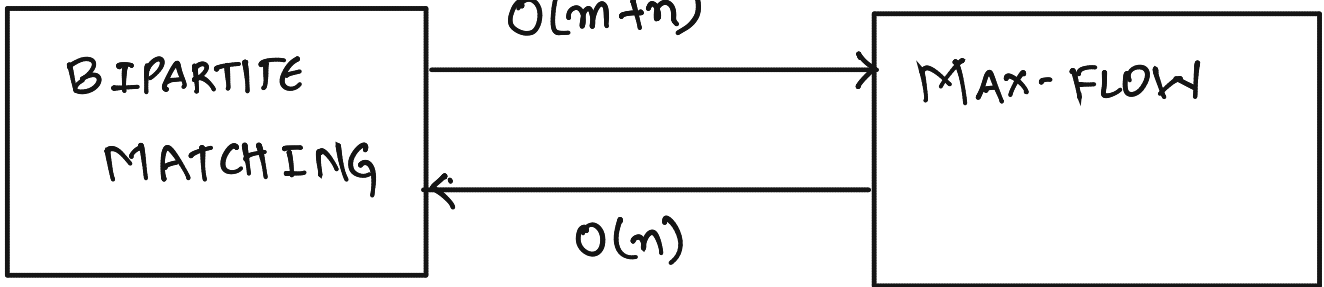


In POLYNOMIAL TIME WE REDUCED
MAX MATCH PROBLEM
TO MAX FLOW PROBLEM.



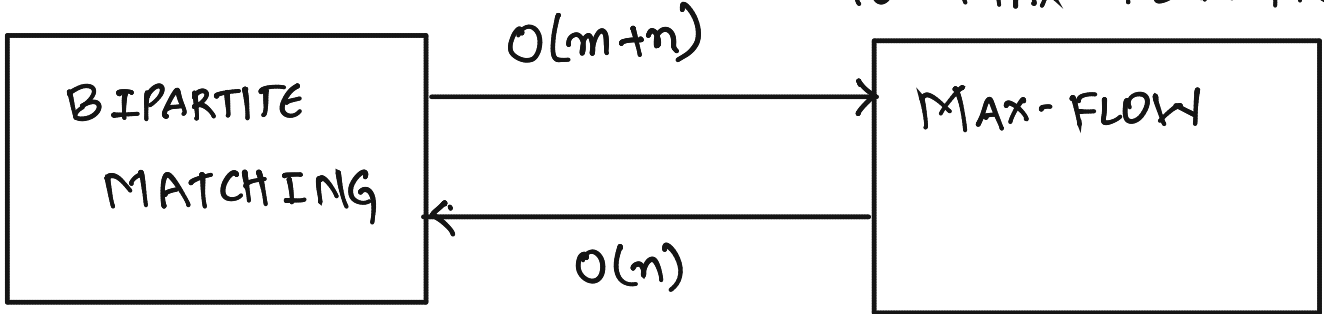
MAX MATCHING \leq_p MAXFLOW

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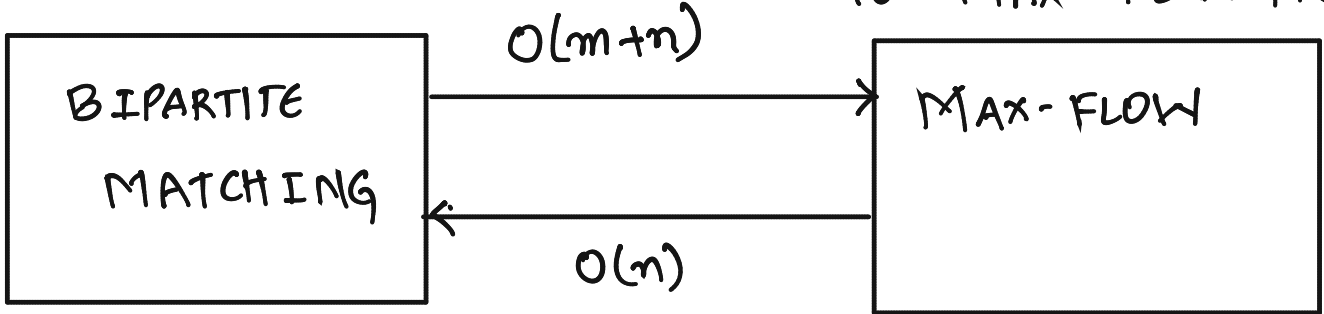


CIRCULATION WITH DEMAND

MAX FLOW

MAX MATCHING \leq_p MAXFLOW

$|n|$ POLYNOMIAL TIME WE REDUCED
MAX MATCH PROBLEM
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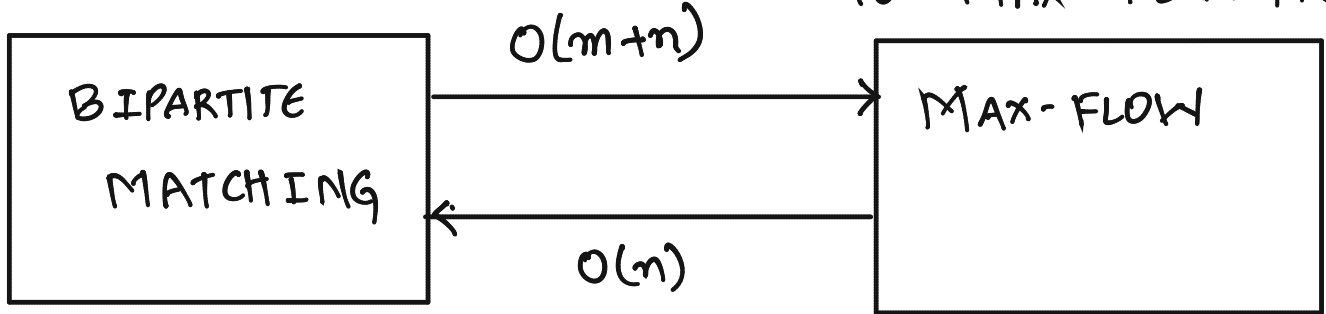


CIRCULATION WITH DEMAND

\leq_p MAX FLOW

MAX MATCHING \leq_p MAXFLOW

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CIRCULATION WITH DEMAND

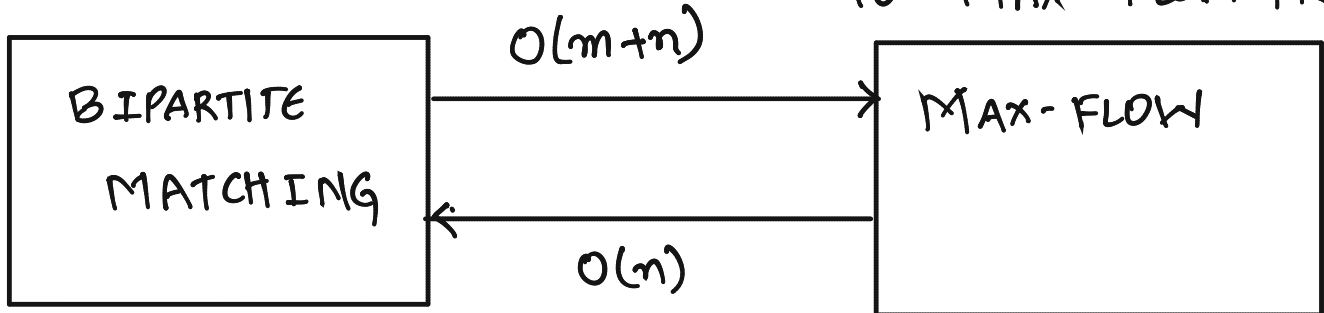
\leq_p MAX FLOW

CIRCULATION WITH DEMAND & LOWER BOUND

CIRCULATION WITH DEMAND

MAX MATCHING \leq_p MAXFLOW

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CIRCULATION WITH DEMAND

\leq_p MAX FLOW

CIRCULATION WITH DEMAND & LOWER BOUND

\leq_p CIRCULATION WITH DEMAND

DEF: $X \leq_p Y \Rightarrow$ ANY INSTANCE OF
X CAN BE SOLVED
IN SOME POLYNOMIAL
TIME + POLYNOMIAL
NUMBER OF CALLS TO
ANY ARBITRARY INSTANCES
OF Y.

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X CAN BE SOLVED
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IN OUR EXAMPLE OF
MAX MATCH \leq_p MAX FLOW

COMPUTATION STEPS $\rightarrow O(m+n)$
NUMBER OF CALLS TO MAX FLOW $\rightarrow 1$.

LEMMA : IF $X \leq_p Y$ & $Y \leq_p Z$, THEN
 $X \leq_p Z$.

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TRANSITIVITY PROPERTY

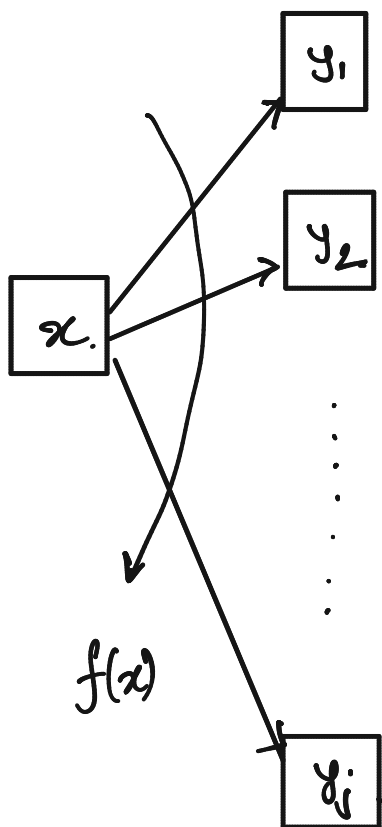
CIRCULATION WITH DEMAND & LOWER BOUND
 \leq_p CIRCULATION WITH DEMAND

CIRCULATION WITH DEMAND
 \leq_p MAX FLOW

\Rightarrow CIRCULATION WITH DEMAND & LOWER BOUND
 \leq_p MAX FLOW.

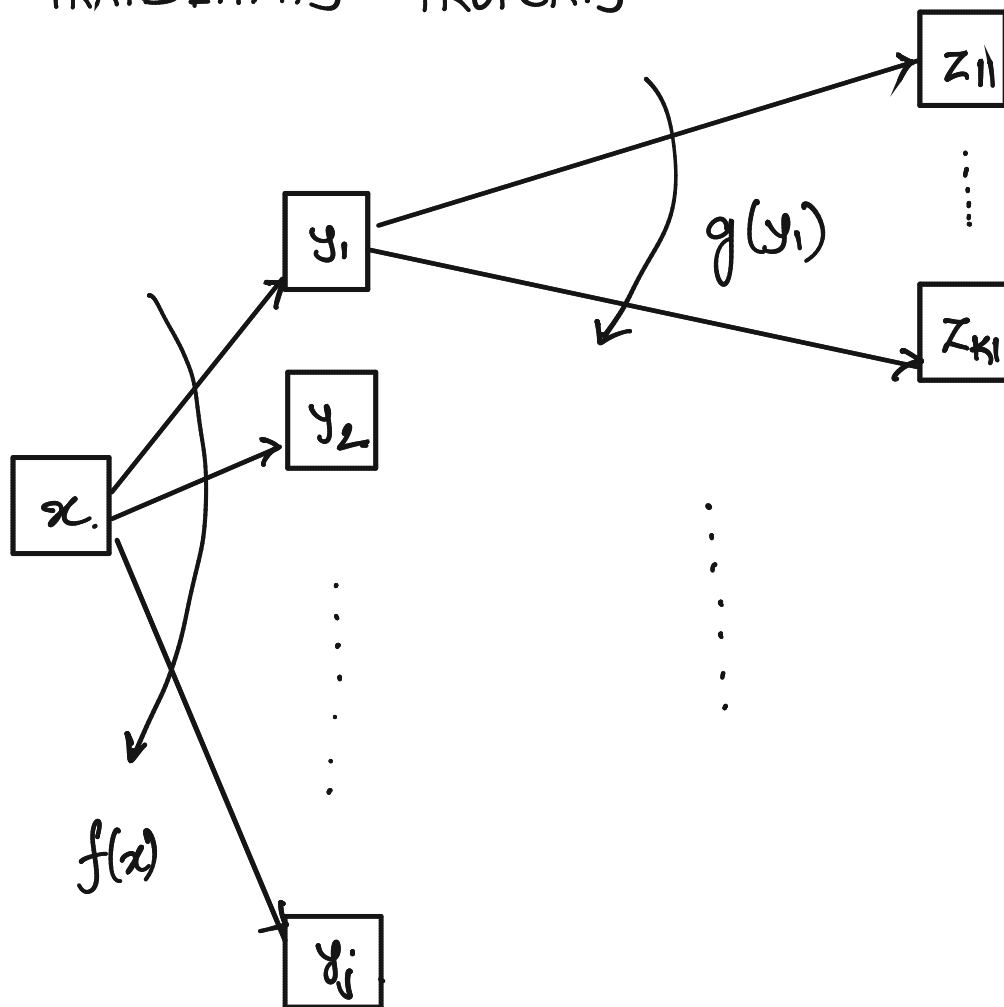
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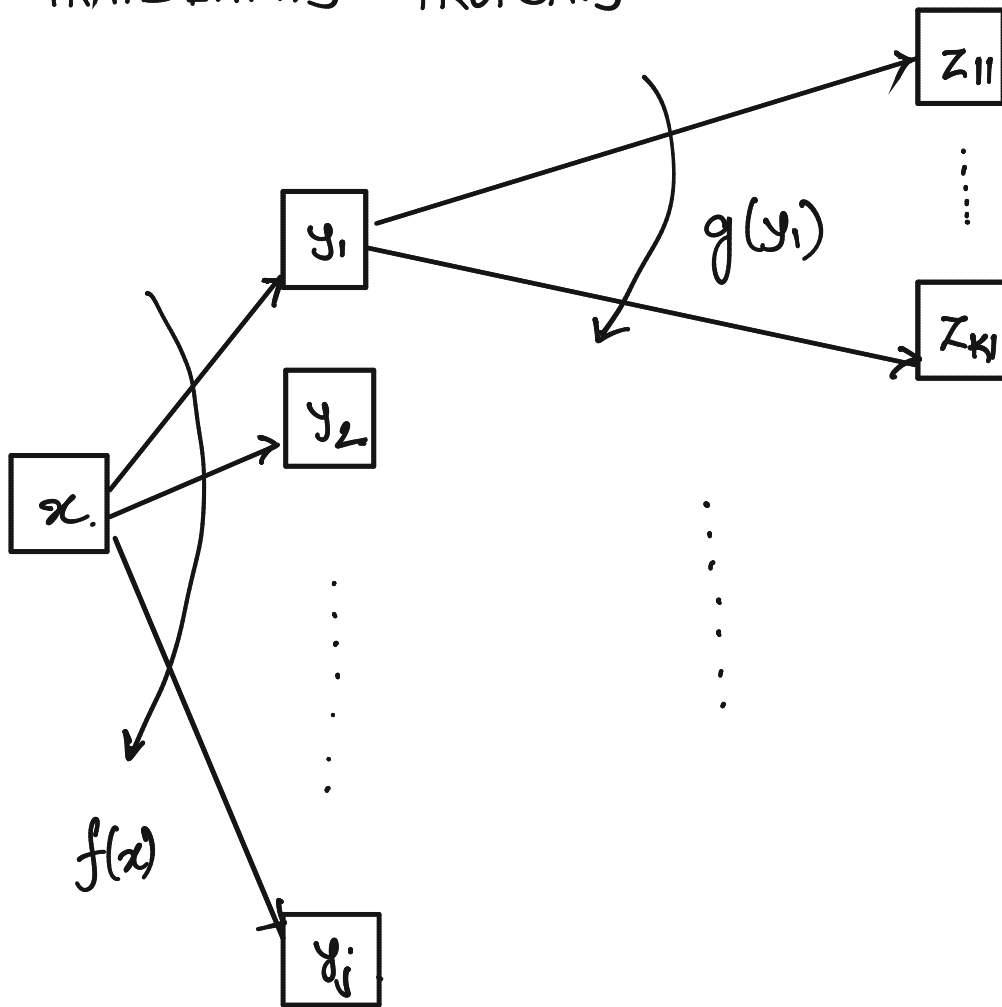
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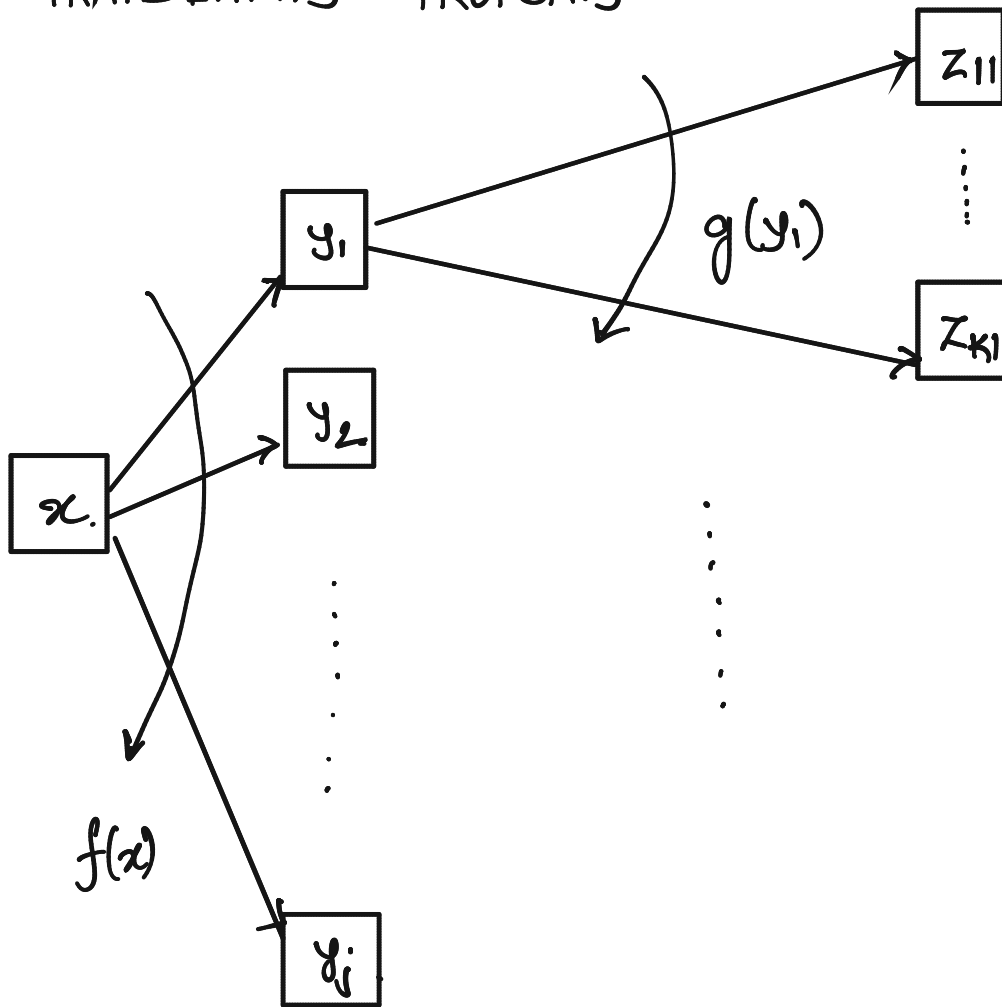
TRANSITIVITY PROPERTY



AN INSTANCE x CAN BE SOLVED IN

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TRANSITIVITY PROPERTY



AN INSTANCE x CAN BE SOLVED IN

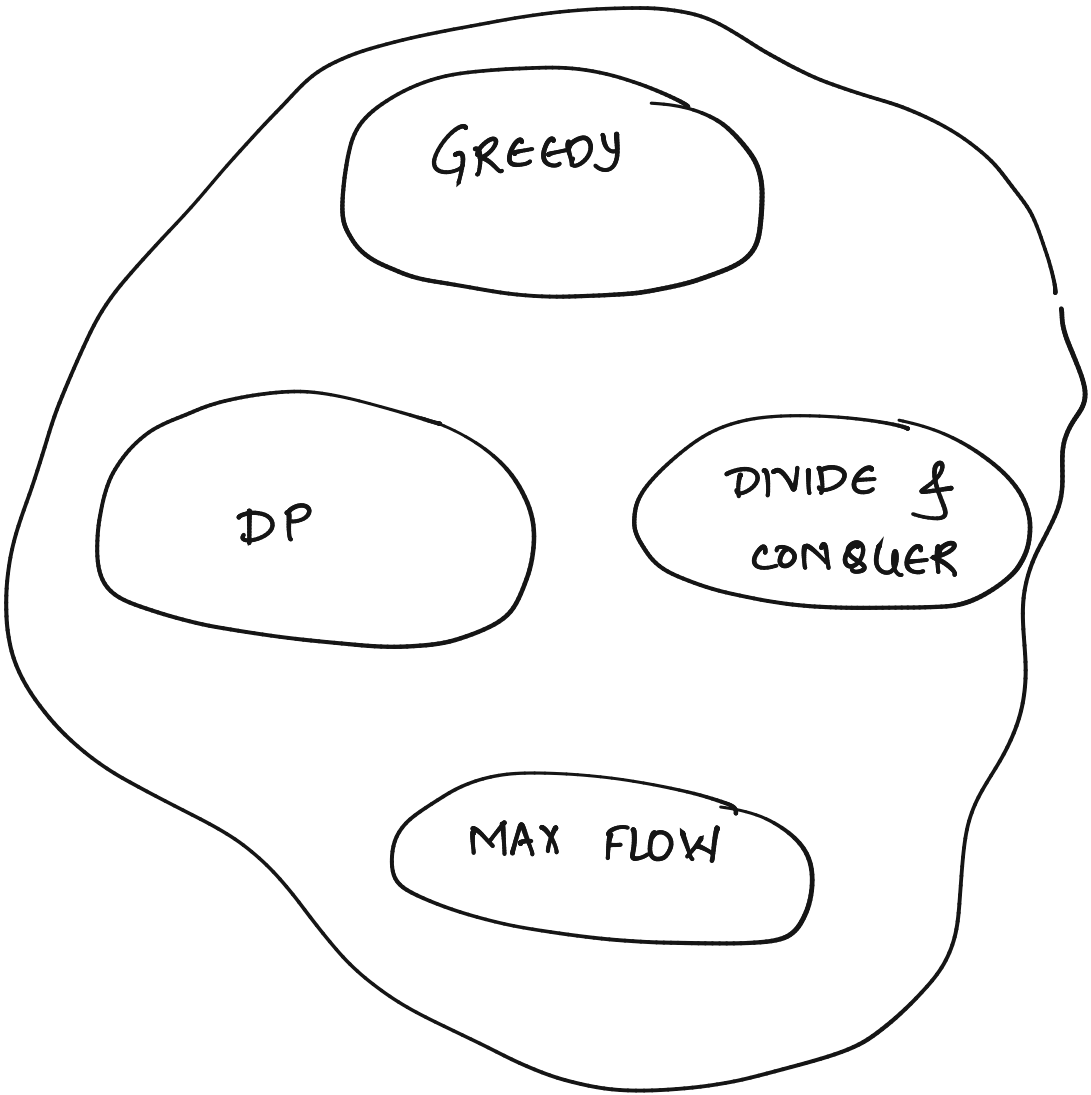
$$f(x) + \sum_{i=1}^i g(y_i) + \sum_{i=1}^i \sum_{l=1}^k \text{Running Time of Instance } z_{il}.$$

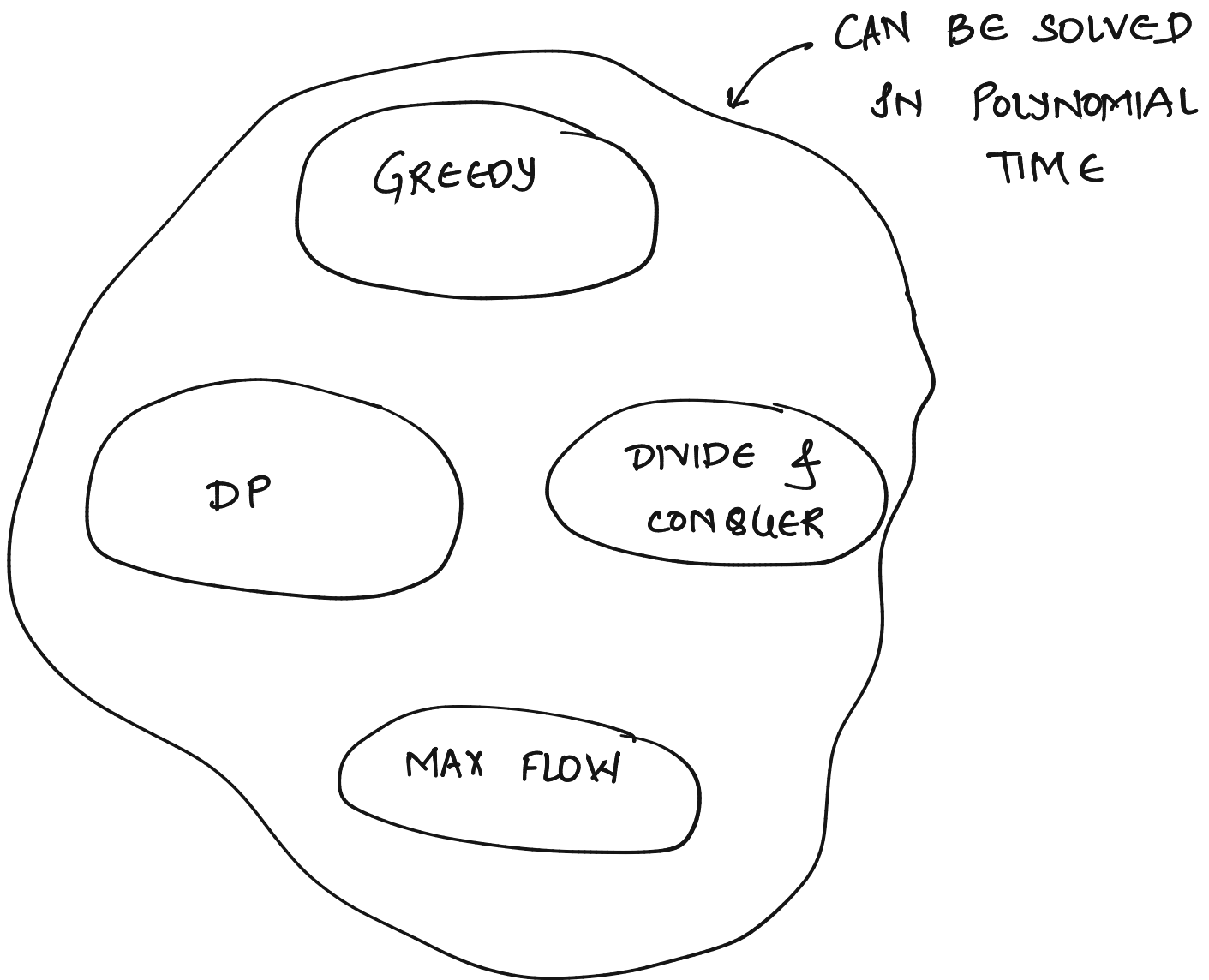
LEMMA: IF $X \leq_p Y$, THEN IF Y IS SOLVABLE
IN POLYNOMIAL TIME, THEN

LEMMA : IF $X \leq_p Y$, THEN IF Y IS SOLVABLE
IN POLYNOMIAL TIME, THEN X IS
ALSO SOLVABLE IN POLYNOMIAL TIME.

LEMMA: IF $X \leq_p Y$, THEN IF X IS NOT SOLVABLE IN POLYNOMIAL TIME THEN

LEMMA: IF $X \leq_p Y$, THEN IF X IS NOT SOLVABLE IN POLYNOMIAL TIME THEN Y IS NOT SOLVABLE IN POLYNOMIAL TIME.







INDEPENDENT SET

VERTEX COVER

GREEDY

DP

DIVIDE &
CONQUER

MAX FLOW

SET COVER

SAT

NO POLYNOMIAL
SOLUTION
KNOWN TILL
NOW

INDEPENDENT SET

VERTEX COVER

GREEDY

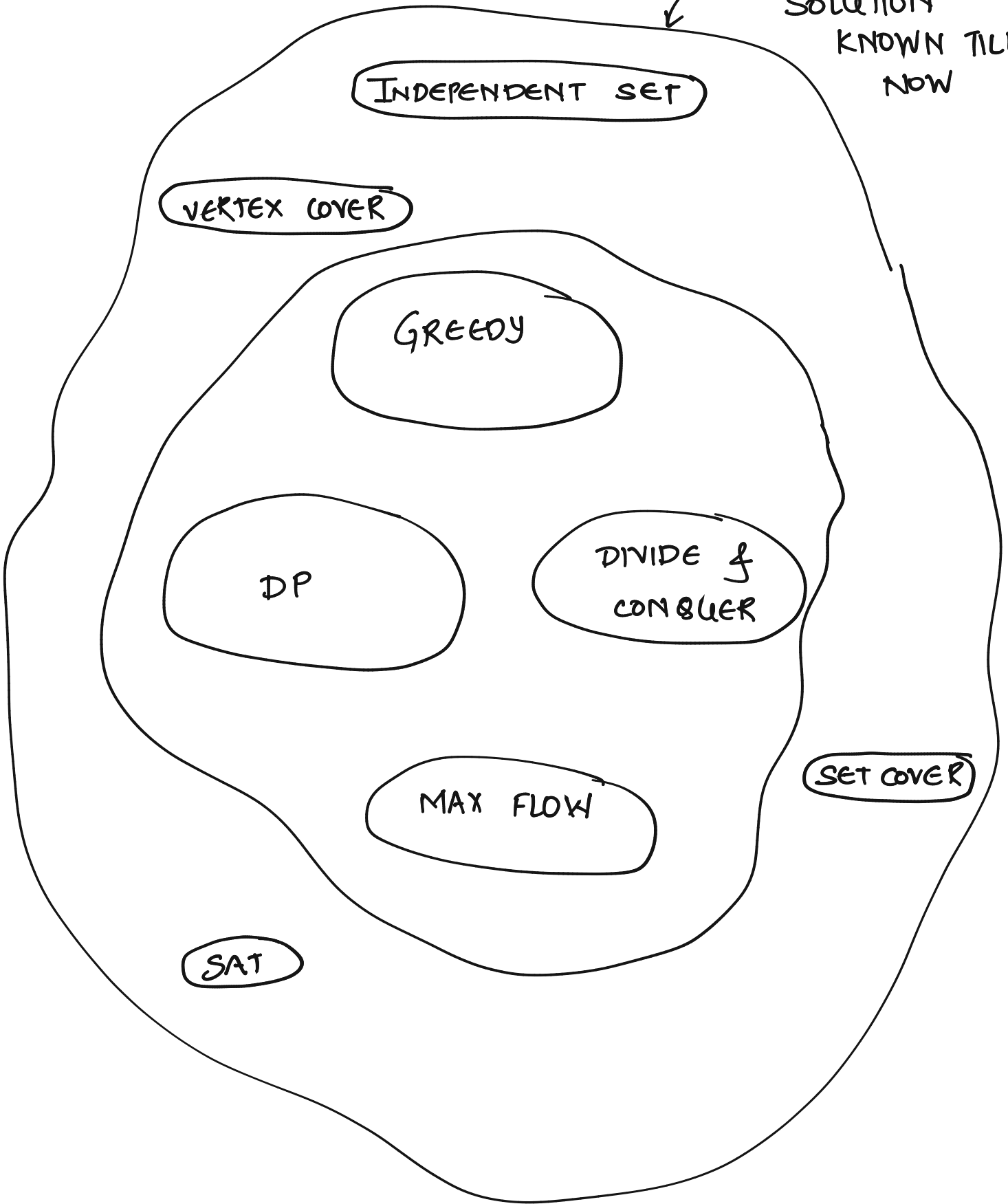
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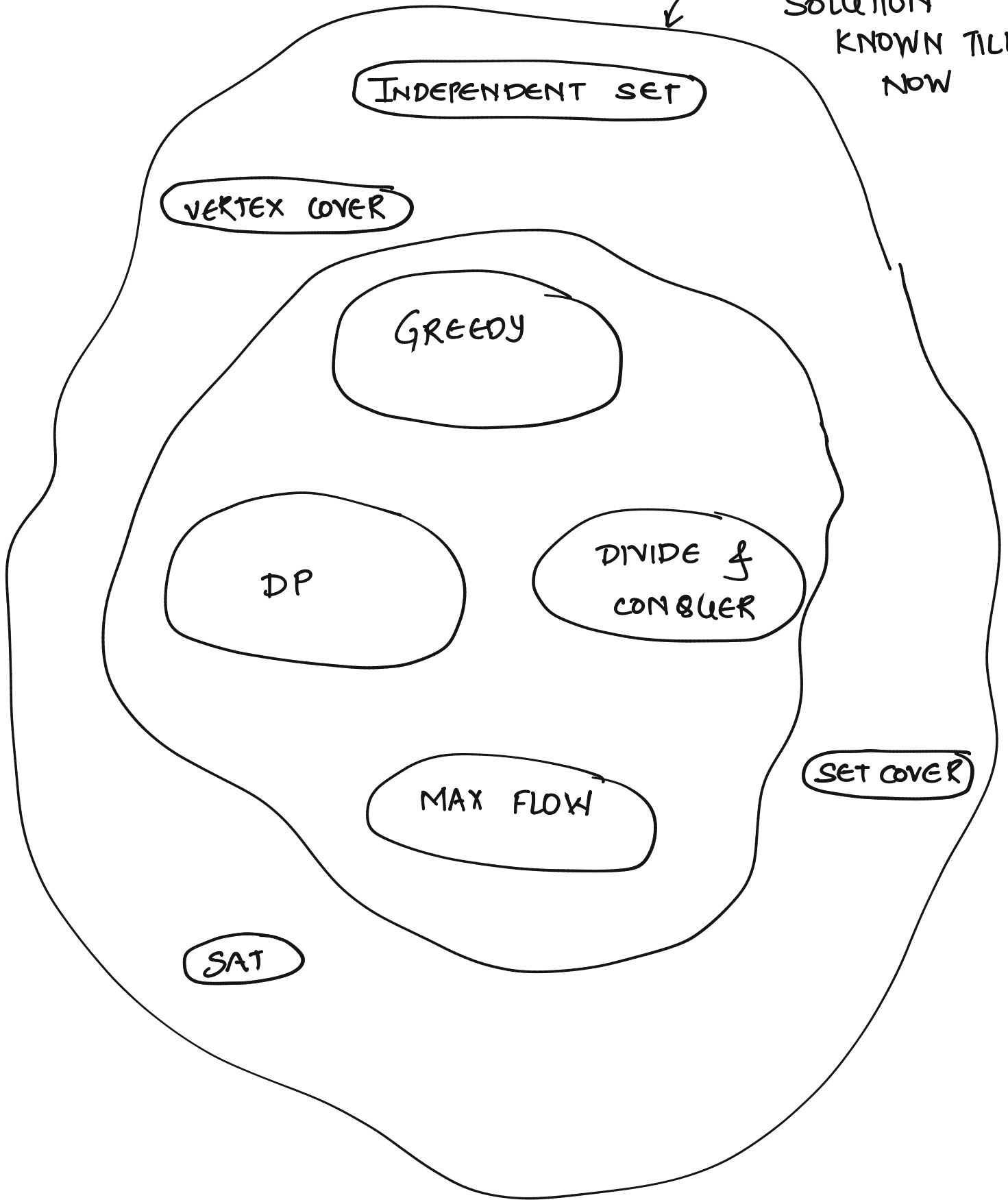
MAX FLOW

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NO POLYNOMIAL
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IS \leq_p VC \leq_p SC \leq_p SAT \leq_p IS

$IS \leq_p VC \leq_p SC \leq_p SAT \leq_p IS$

OBSERVATION

→ A CLASS OF PROBLEMS

→ IF WE CAN SOLVE ANY ONE OF THEM
IN POLYNOMIAL TIME, ALL OTHERS CAN
BE SOLVED IN POLYNOMIAL TIME.

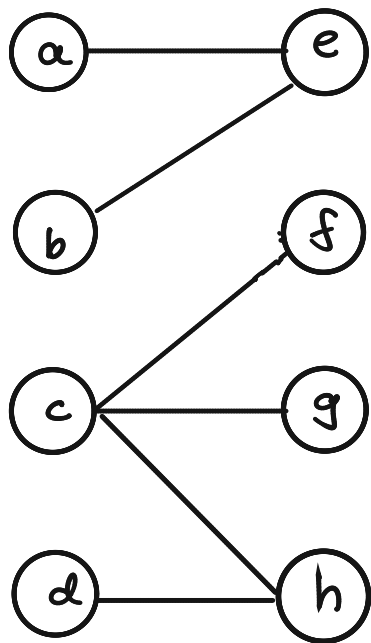
$IS \leq_p VC \leq_p SC \leq_p SAT \leq_p IS$

OBSERVATION

- A CLASS OF PROBLEMS
- IF WE CAN SOLVE ANY ONE OF THEM IN POLYNOMIAL TIME, ALL OTHERS CAN BE SOLVED IN POLYNOMIAL TIME.
- NO POLYNOMIAL TIME IS KNOWN FOR ANY ONE OF THEM.

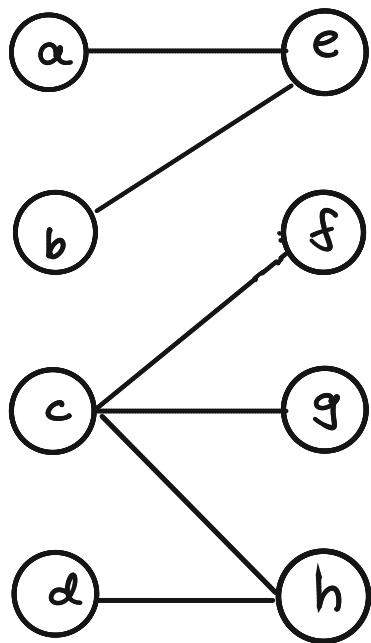
IS : GIVEN A GRAPH G , AN INDEPENDENT SET IS A VERTEX SET SUCH THAT NO TWO VERTICES IN THE SET ARE ADJACENT TO EACH OTHER

PROBLEM : FIND AN INDEPENDENT SET OF MAXIMUM SIZE



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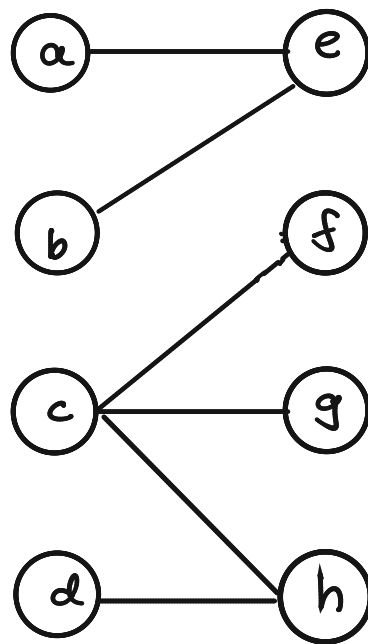
$$MIS = \{ f, g, h, a, b \}$$

VC : VERTEX COVER IS A SET OF VERTICES SUCH THAT EACH EDGE IN THE GRAPH HAS ATLEAST ONE ENDDPOINT IN THE SET.

PROBLEM: FIND THE MINIMUM VERTEX COVER

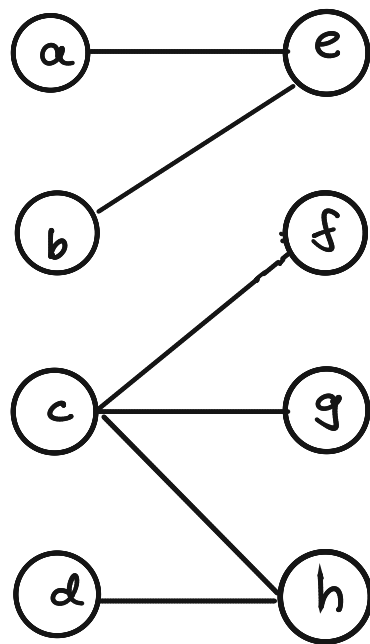
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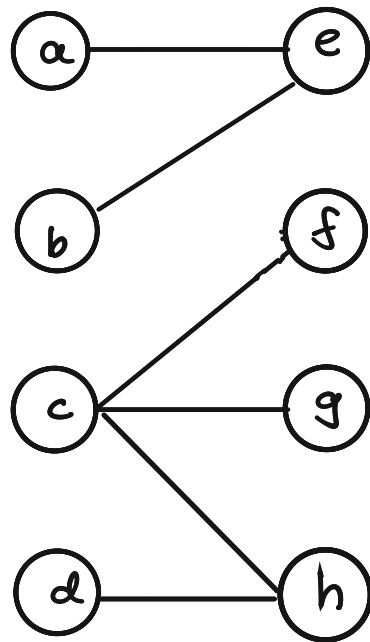
PROBLEM: FIND THE MINIMUM VERTEX COVER



$$MVC = \{c, e, d\}$$

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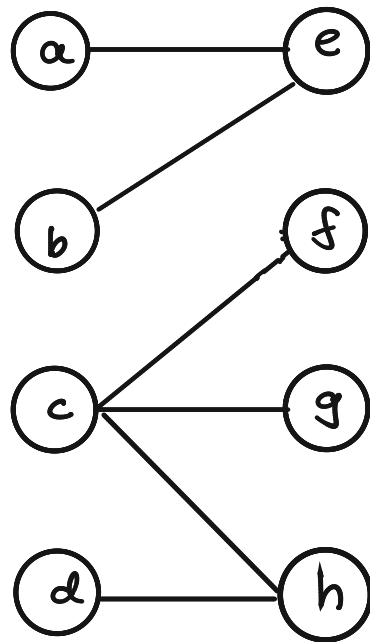


$$MVC = \{c, e, d\}$$

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PROBLEM: FIND THE MINIMUM VERTEX COVER



$$MVC = \{c, e, d\}$$

$$MIS = V - MVC$$

$$MIS = \{f, g, h, a, b\}$$

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↑
PACKING PROBLEM:

VC : VERTEX COVER IS A SET OF VERTICES SUCH THAT EACH EDGE IN THE GRAPH HAS ATLEAST ONE ENDPPOINT IN THE SET.

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PACKING PROBLEM: PACK AS MANY OBJECTS UNDER SOME CONSTRAINTS.

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PROBLEM : IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

↑

PACKING PROBLEM: PACK AS MANY OBJECTS UNDER SOME CONSTRAINTS.

VC : VERTEX COVER IS A SET OF VERTICES SUCH THAT EACH EDGE IN THE GRAPH HAS ATLEAST ONE ENDPPOINT IN THE SET.

PROBLEM : IS THERE A VERTEX COVER OF SIZE ATMOST k IN G ?

↑

COVERING PROBLEMS: COVER ALL (OR AS MANY) OBJECTS USING MINIMUM NUMBER OF SAME OR OTHER OBJECTS.

PROBLEM : IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

DECISION PROBLEM

PROBLEM : FIND AN INDEPENDENT SET OF MAXIMUM SIZE IN G ?

OPTIMIZATION PROBLEM.

PROBLEM : IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

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OPTIMIZATION PROBLEM.

CAN YOU SOLVE DP USING OP OF IS ?

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CAN YOU SOLVE OP USING DP OF IS ?

A: YES

FROM HERE ON WE WILL ASSUME THAT WE ARE SOLVING DECISION VERSION OF ANY PROBLEM

LEMMA: $JS \leq_p VC.$

LEMMA: $IS \subseteq_p VC$.

IF S IS A VC, THEN $V-S$ IS
AN INDEPENDENT SET.

LEMMA: $IS \subseteq_p VC$.

PROOF:

IF S IS A VC, THEN $V-S$ IS
AN INDEPENDENT SET.

$x, y \in V-S$

CAN THERE BE AN EDGE $(x, y) \in E$?

LEMMA: $IS \subseteq_p VC$.

PROOF:

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CAN THERE BE AN EDGE $(x, y) \in E$?

NO. OTHERWISE EITHER x OR y
SHOULD HAVE BEEN IN VC.

LEMMA: $IS \subseteq_p VC$.

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LEMMA: $|S| \leq p$ VC.

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IS \rightarrow IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

IS THERE A VERTEX COVER OF SIZE ATMOST

LEMMA: $|S| \leq p$ VC.

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IS \rightarrow IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

IS THERE A VERTEX COVER OF SIZE ATMOST $n-k$ IN G ?

LEMMA: $|S| \leq p$ VC.

PROOF:

IF S IS A VC, THEN $V-S$ IS AN INDEPENDENT SET.

$x, y \in V-S$

CAN THERE BE AN EDGE $(x, y) \in E$?

NO. OTHERWISE EITHER x OR y SHOULD HAVE BEEN IN VC.

$\Rightarrow V-S$ IS AN INDEPENDENT SET

IS \rightarrow IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

IS THERE A VERTEX COVER OF SIZE ATMOST $n-k$ IN G ?

\downarrow YES

\downarrow NO

IS: YES

IF S IS AN IS IN G , THEN $V-S$
IS A VC IN G .

IF S IS A IS IN G , THEN $V-S$
IS A VC IN G .

ASSUME FOR CONTRADICTION THAT $V-S$
IS NOT A VC.

IF S IS A IS IN G , THEN $V-S$
IS A VC IN G .

ASSUME FOR CONTRADICTION THAT $V-S$
IS NOT A VC $\Rightarrow \exists (x,y)$ ST
NEITHER x NOR $y \in V-S$

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$\Rightarrow x, y \in S$

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ASSUME FOR CONTRADICTION THAT $V-S$
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NEITHER x NOR $y \in V-S$

$\Rightarrow x, y \in S$

BUT $(x,y) \in G$

$\Rightarrow S$ IS NOT AN INDEPENDENT SET.

\Rightarrow A CONTRADICTION

LEMMA: $IS \leq_p VC$.

PROOF:

$IS \rightarrow$ IS THERE AN INDEPENDENT SET OF SIZE ATLEAST k IN G ?

IS THERE A VERTEX COVER OF SIZE ATMOST $n-k$ IN G ?

↓ YES

↓ NO

IS: YES

IS: NO

LEMMA : $\forall C \leq_p IS.$

SET COVER : GIVEN A COLLECTION OF
OBJECTS $U = \{u_1, u_2, \dots, u_m\}$ AND A COLLECTION
OF SETS S_1, S_2, \dots, S_n SUCH THAT EACH
 $S_i \subseteq U$, DOES THERE EXIST AT MOST k SETS
WHOSE UNION IS THE SET U .

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PACKING OR COVERING PROBLEM ?

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PACKING OR COVERING PROBLEM

LEMMA: $VC \leq_p SC$

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PACKING OR COVERING PROBLEM

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$U = \{e_1, e_2, \dots, e_m\}$

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PACKING OR COVERING PROBLEM

LEMMA: $VC \leq p \ SC$

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FOR VERTEX i , MAKE SET

$$S_i = \{e \mid e \text{ IS ADJACENT TO } i \text{ IN } G\}$$

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IF \exists SC OF SIZE ATMOST k

$\Rightarrow \exists$ A VC OF SIZE ATMOST k

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\Rightarrow

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$$U = \{e_1, e_2, \dots, e_m\}$$

FOR VERTEX i , MAKE SET

$$S_i = \{e \mid e \text{ IS ADJACENT TO } i \text{ IN } G\}$$

IF \exists SC OF SIZE ATMOST k

$\Rightarrow \exists$ A VC OF SIZE ATMOST k

IF \exists SC OF SIZE ATMOST k

$\Leftarrow \exists$ A VC OF SIZE ATMOST k

SET PACKING. GIVEN A UNIVERSE U OF
 n ELEMENTS f SETS S_1, S_2, \dots, S_m SUBSETS
OF U , DOES THERE EXIST ATLEAST k
SETS SUCH THAT NONE OF THEM INTERSECT?

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LEMMA: IS \leq_p SP.

SAT:

n BOOLEAN VARIABLES

x_1, x_2, \dots, x_n

SAT:

n BOOLEAN VARIABLES

x_1, x_2, \dots, x_n

TERM: x_i OR \bar{x}_i

CLAUSE: DISJUNCTION OF DISTINCT

$t_1 \vee t_2 \vee \dots \vee t_e$

WHERE $t_i \in \{x_1, x_2, \dots, x_n, \bar{x}_1, \bar{x}_2, \dots, \bar{x}_n\}$

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C EVALUATES TO 1 IF

SAT:

n BOOLEAN VARIABLES

x_1, x_2, \dots, x_n

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$t_1 \vee t_2 \vee \dots \vee t_e$

WHERE $t_i \in \{x_1, x_2, \dots, x_n, \overline{x_1}, \overline{x_2}, \dots, \overline{x_n}\}$

$$C = x_1 \vee x_2 \vee \overline{x_3}$$

C EVALUATES TO 1 IF

$$x_1 = 1$$

$$x_2 = 1$$

$$\text{OR } x_3 = 0$$

SAT:

n BOOLEAN VARIABLES

x_1, x_2, \dots, x_n

TERM: x_i OR \bar{x}_i

CLAUSE: DISJUNCTION OF DISTINCT

$t_1 \vee t_2 \vee \dots \vee t_e$

WHERE $t_i \in \{x_1, x_2, \dots, x_n, \bar{x}_1, \bar{x}_2, \dots, \bar{x}_n\}$

$$C = x_1 \vee x_2 \vee \bar{x}_3$$

C EVALUATES TO 1 IF

$x_1 = 1$
 $x_2 = 1$
OR $x_3 = 0$ } assignment.

An assignment satisfies

$C_1, C_2, C_3, \dots, C_k$ clauses

if each of them evaluates to 1
wrt the assignment.

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

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$$x_1 = 1$$

$$x_3 = 0$$

$$x_2 = 0 \text{ or } 1$$

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

$$x_1 = 1$$

$$x_3 = 0$$

$$x_2 = 0 \text{ or } 1$$

ASSIGNMENT EVALUATES

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

To 1.

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

$$x_1 = 1$$

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$$x_2 = 0 \text{ or } 1$$

ASSIGNMENT EVALUATES

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

TO 1.

SAT: IS THERE AN ASSIGNMENT THAT
SATISFIES

$$C_1 \wedge C_2 \wedge C_3 \wedge \dots \wedge C_k$$

WHERE EACH C_i IS A CLAUSE.

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

$$x_1 = 1$$

$$x_3 = 0$$

$$x_2 = 0 \text{ or } 1$$

ASSIGNMENT EVALUATES

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

TO 1.

3-SAT: IS THERE AN ASSIGNMENT THAT SATISFIES

$$C_1 \wedge C_2 \wedge C_3 \wedge \dots \wedge C_k$$

WHERE EACH C_i IS A CLAUSE OF LENGTH 3.

LEMMA : 3-SAT \leq_p INDEPENDENT SET

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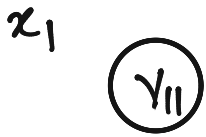
$$(x_1 \vee \bar{x}_2 \vee x_5) \wedge (x_3 \vee x_2 \vee \bar{x}_5) \wedge \dots \\ \dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.

LEMMA : 3-SAT \leq_p INDEPENDENT SET

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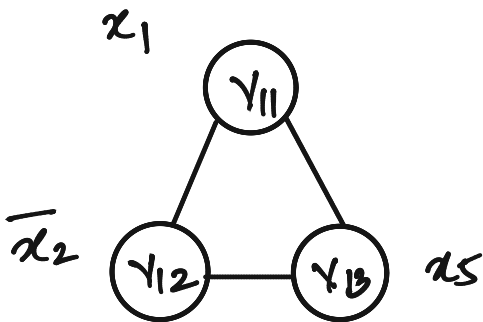
MAKE A GRAPH OUT OF CLAUSES.



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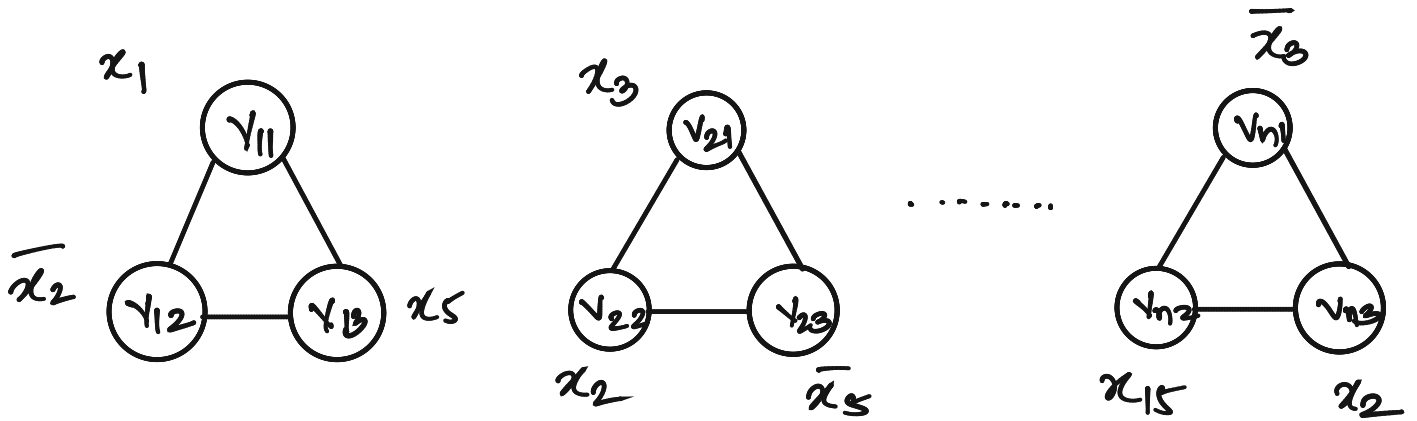
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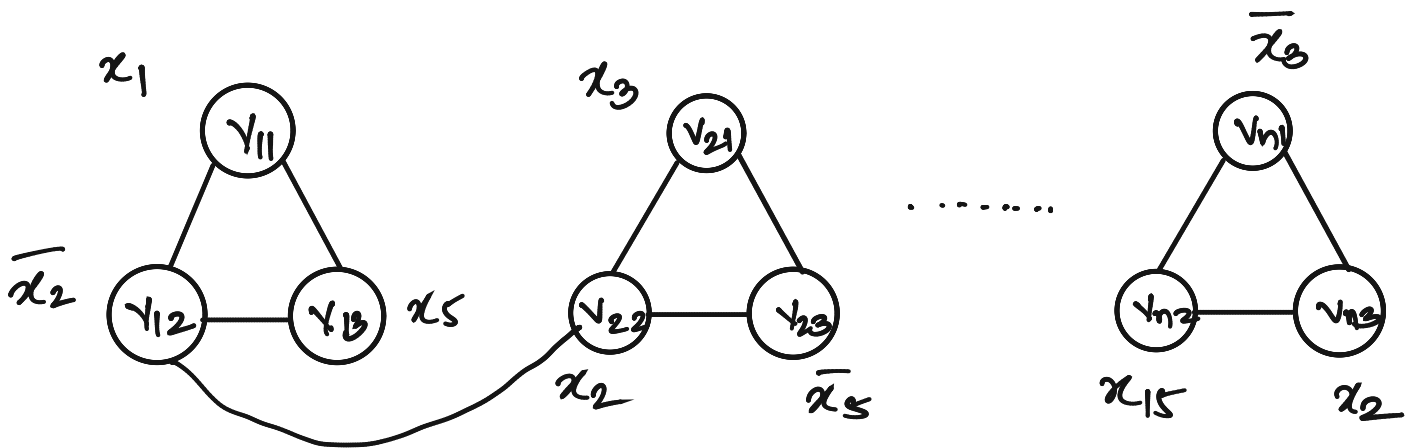


LEMMA : 3-SAT \leq_p INDEPENDENT SET

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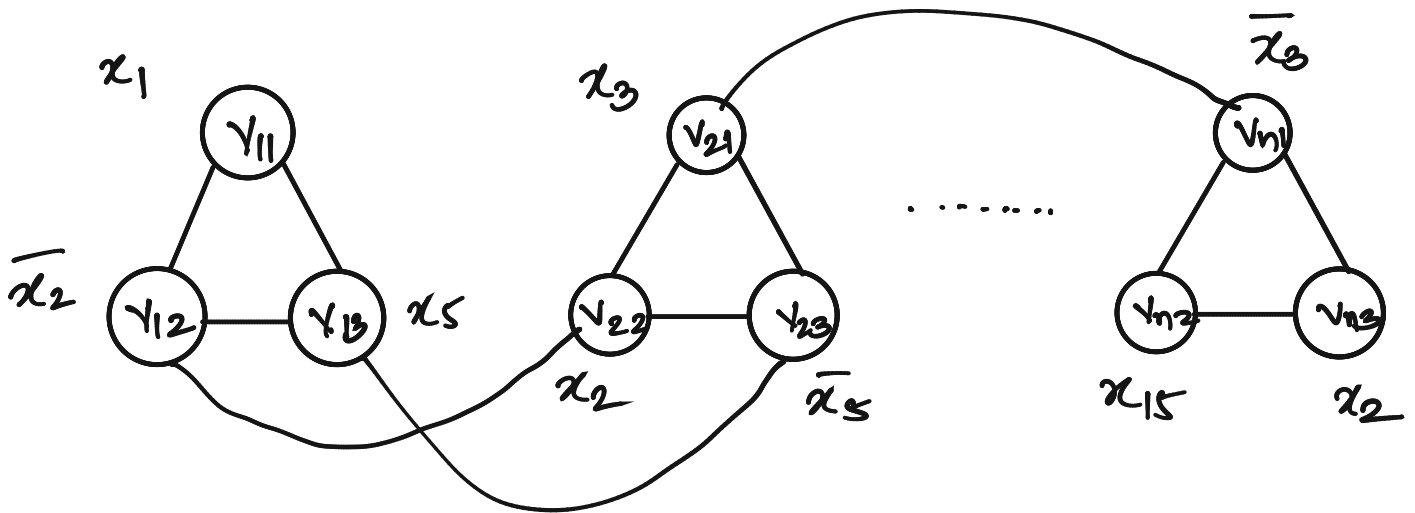
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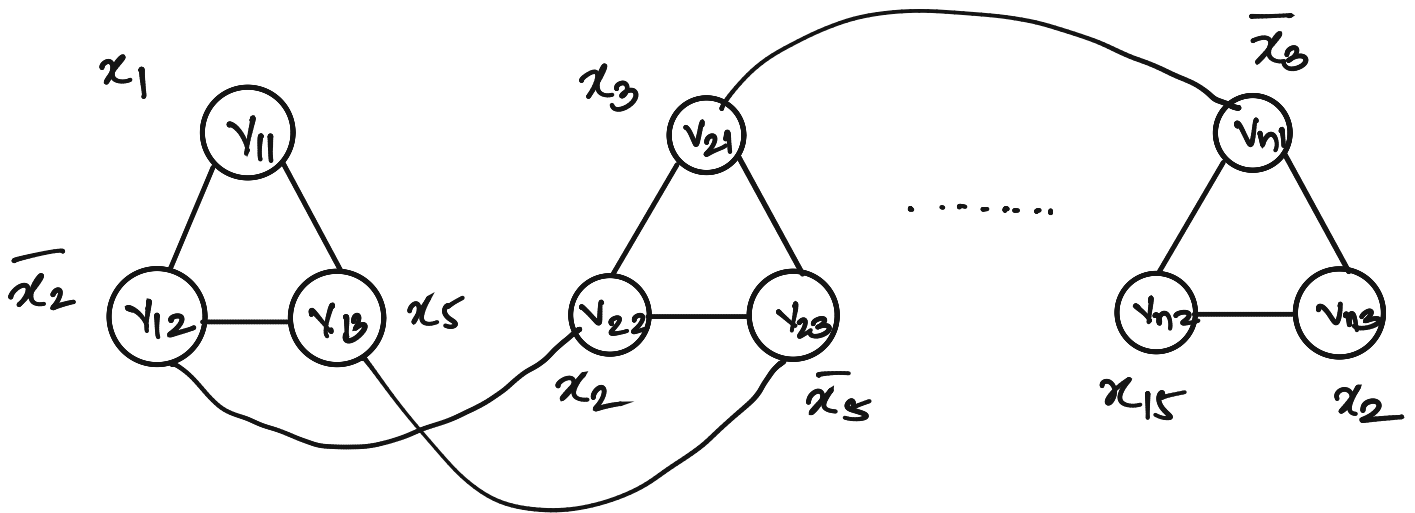


GIVE THIS INPUT TO INDEPENDENT SET
BLACKBOX ALGORITHM

LEMMA : 3-SAT \leq_p INDEPENDENT SET

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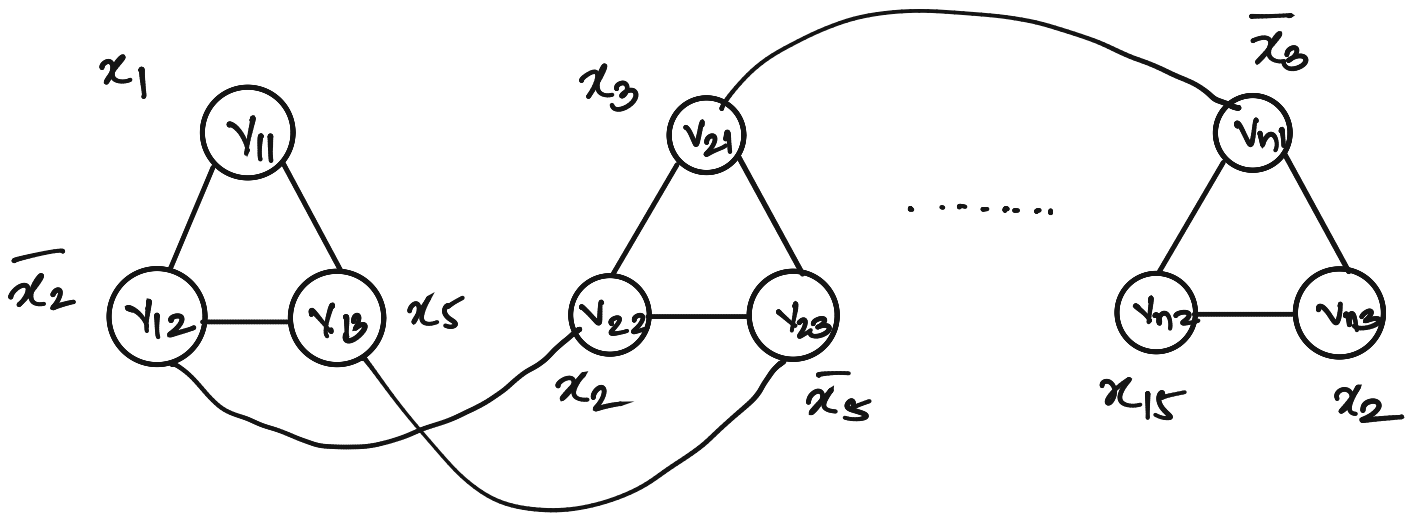
GIVE THIS INPUT TO INDEPENDENT SET BLACKBOX ALGORITHM

Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST IN G?

LEMMA : 3-SAT \leq_p INDEPENDENT SET

$$(x_1 \vee \bar{x}_2 \vee x_5) \wedge (x_3 \vee x_2 \vee \bar{x}_5) \wedge \dots \\ \dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

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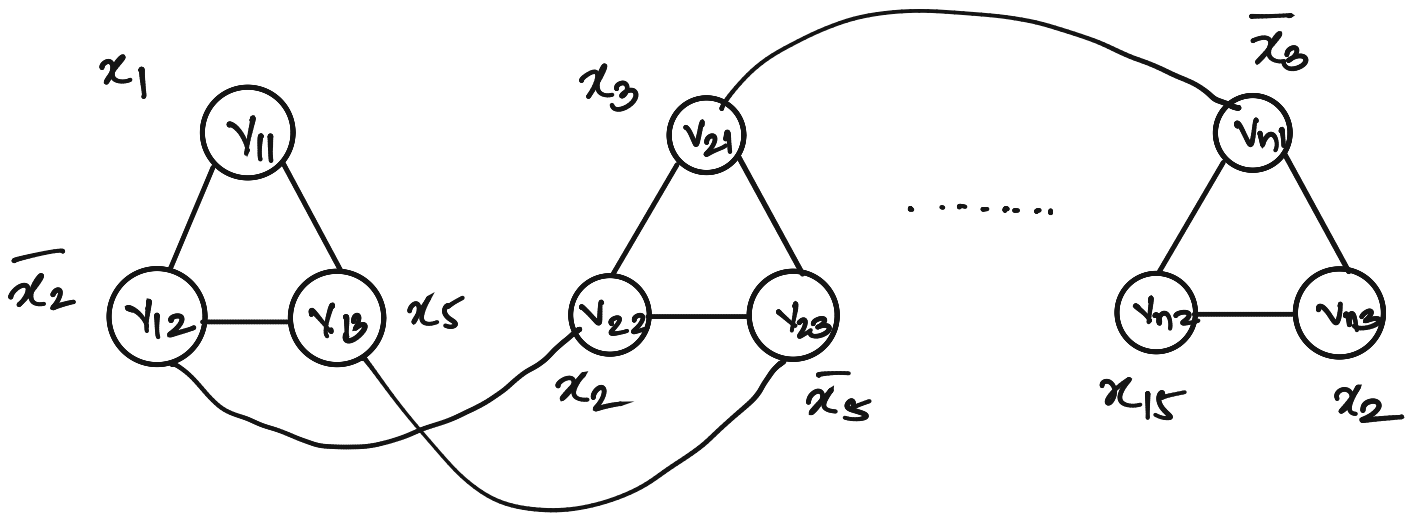
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Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST K IN G ?

LEMMA : 3-SAT \leq_p INDEPENDENT SET

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MAKE A GRAPH OUT OF CLAUSES.



GIVE THIS INPUT TO INDEPENDENT SET BLACKBOX ALGORITHM

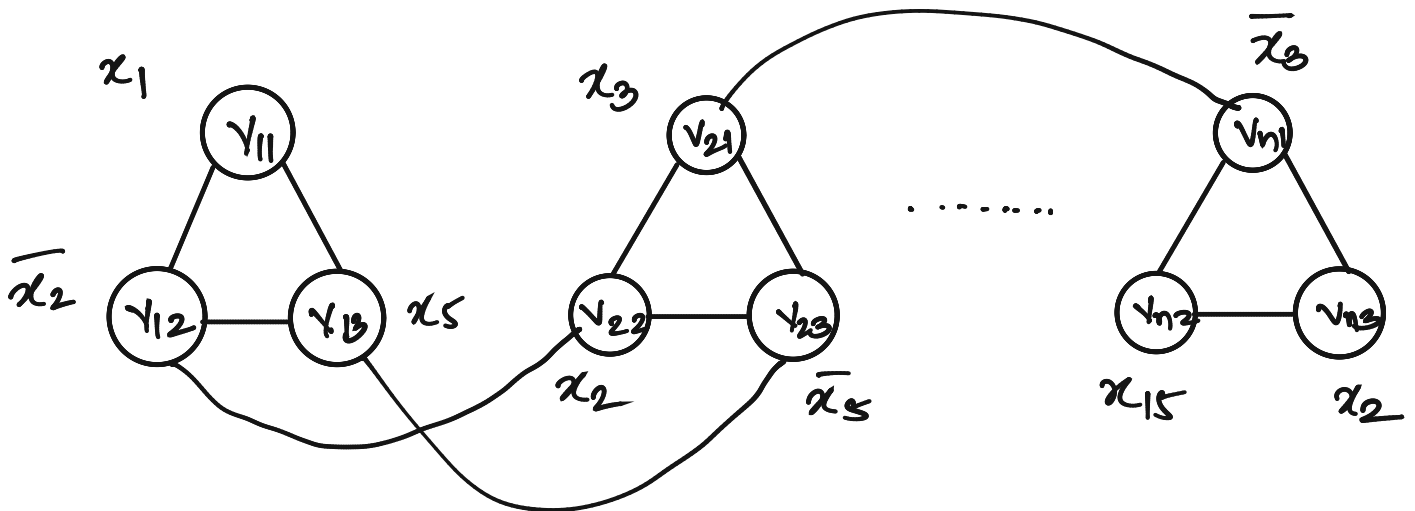
Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST K IN G ?

A: YES

LEMMA : 3-SAT \leq_p INDEPENDENT SET

$$(x_1 \vee \bar{x}_2 \vee x_5) \wedge (x_3 \vee x_2 \vee \bar{x}_5) \wedge \dots \\ \dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



GIVE THIS INPUT TO INDEPENDENT SET BLACKBOX ALGORITHM

Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST K IN G ?

A: YES

FOR EACH $v_{ij} \in$ INDEPENDENT SET

SET TO CORRESPONDING TERM

v_{ij} to 1

NEED TO PROVE THAT

- EACH CLAUSE EVALUATES TO 1 USING THIS ASSIGNMENT
- ITS A VALID ASSIGNMENT

NEED TO PROVE THAT

- EACH CLAUSE EVALUATES TO 1 USING THIS ASSIGNMENT — EASY
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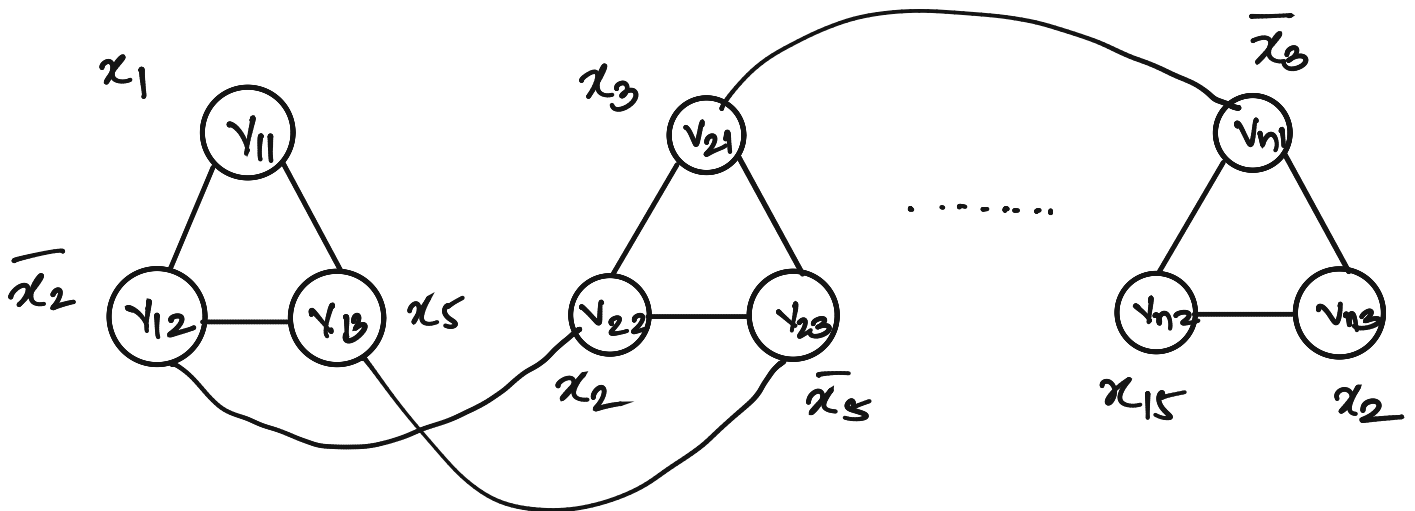
↳ IF $v_{ij} = x_e$ & $v_{i'j'} = \overline{x_e}$

THEN BOTH v_{ij} & $v_{i'j'}$ CANNOT
BE SET TO 1.

LEMMA : 3-SAT \leq_p INDEPENDENT SET

$$(x_1 \vee \bar{x}_2 \vee x_5) \wedge (x_3 \vee x_2 \vee \bar{x}_5) \wedge \dots \\ \dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



GIVE THIS INPUT TO INDEPENDENT SET BLACKBOX ALGORITHM

Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST K IN G ?

A: NO

IF \exists AN INDEPENDENT SET OF SIZE
 $k \rightarrow \exists$ A SATISFYABLE ASSIGNMENT.

IF \nexists AN INDEPENDENT SET OF SIZE k
 $\rightarrow \nexists$ A SATISFYABLE ASSIGNMENT

IF \exists AN INDEPENDENT SET OF SIZE
K $\rightarrow \exists$ A SATISFYABLE ASSIGNMENT.

IF \nexists AN INDEPENDENT SET OF SIZE K
 $\rightarrow \nexists$ A SATISFYABLE ASSIGNMENT

\downarrow
IF \exists A SATISFYABLE ASSIGNMENT
 $\rightarrow \exists$ AN INDEPENDENT SET.

IF \exists AN INDEPENDENT SET OF SIZE
 $k \rightarrow \exists$ A SATISFYABLE ASSIGNMENT.

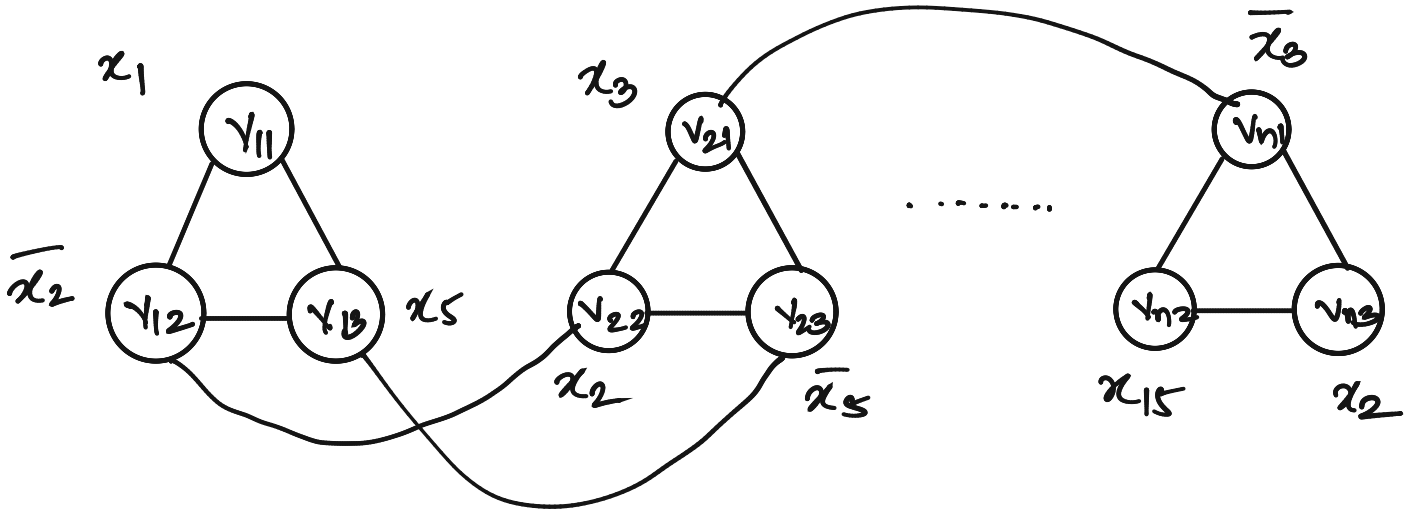
IF \nexists AN INDEPENDENT SET OF SIZE k
 $\rightarrow \nexists$ A SATISFYABLE ASSIGNMENT

\downarrow
IF \exists A SATISFYABLE ASSIGNMENT
 $\rightarrow \exists$ AN INDEPENDENT SET ATLEAST
 k .

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.

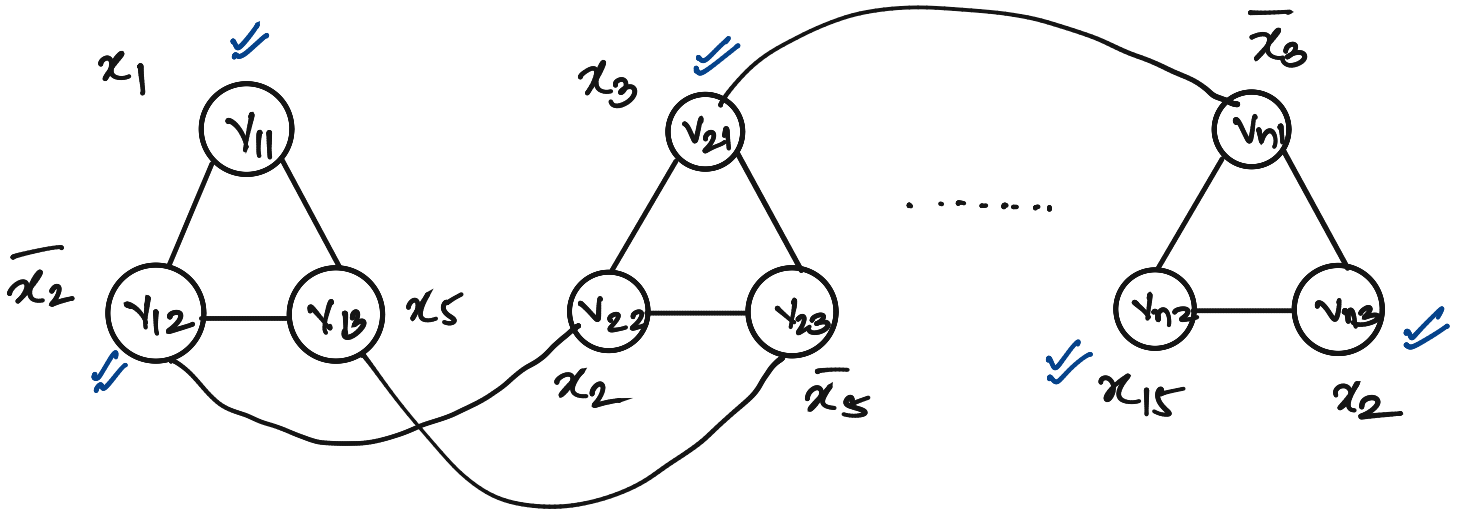


LOOK AT ALL TERMS WHICH ARE SET TO 1.

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

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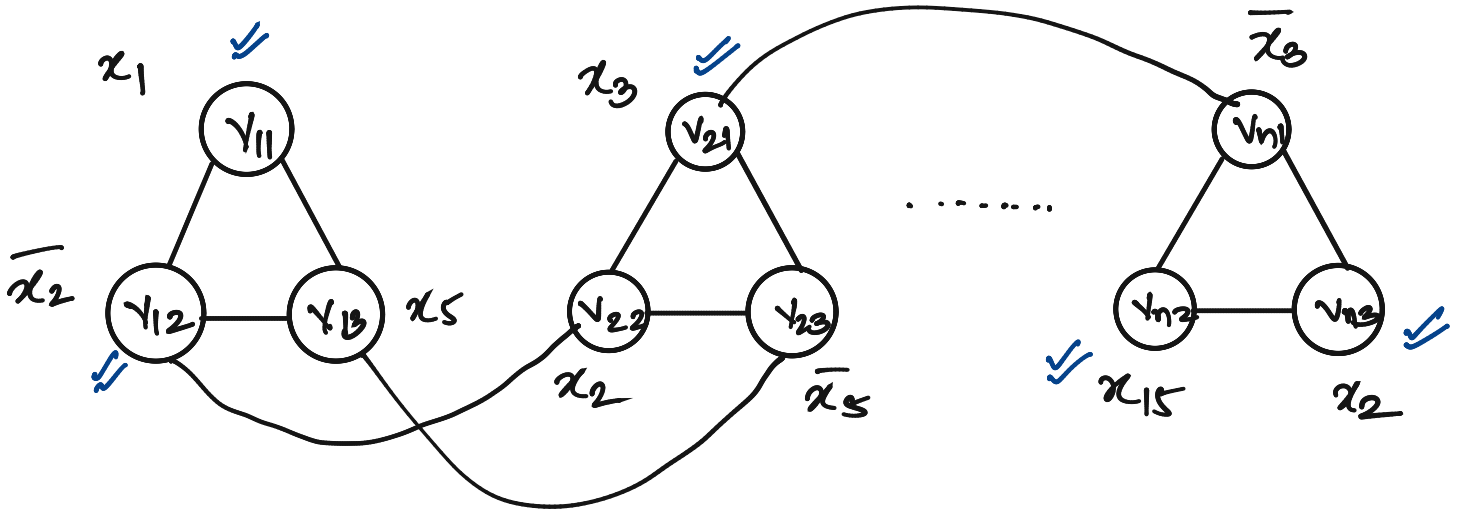


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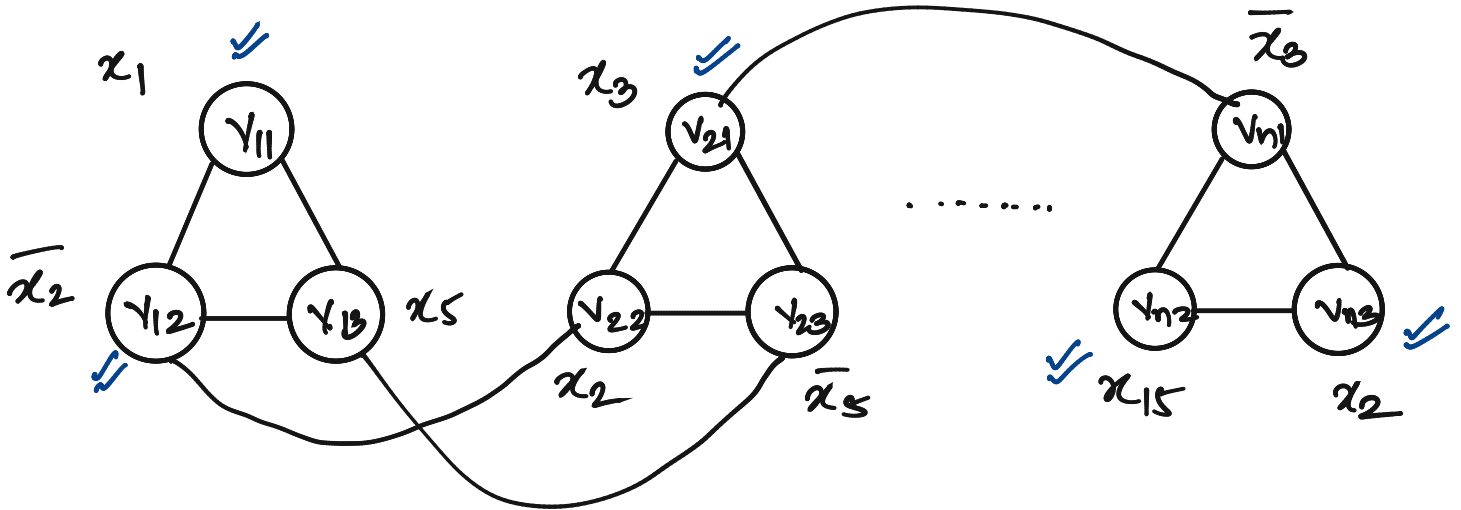
LOOK AT ALL TERMS WHICH ARE SET TO 1.

Q: CAN THERE BE A CLAUSE IN WHICH NO TERM IS SET TO 1?

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

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MAKE A GRAPH OUT OF CLAUSES.



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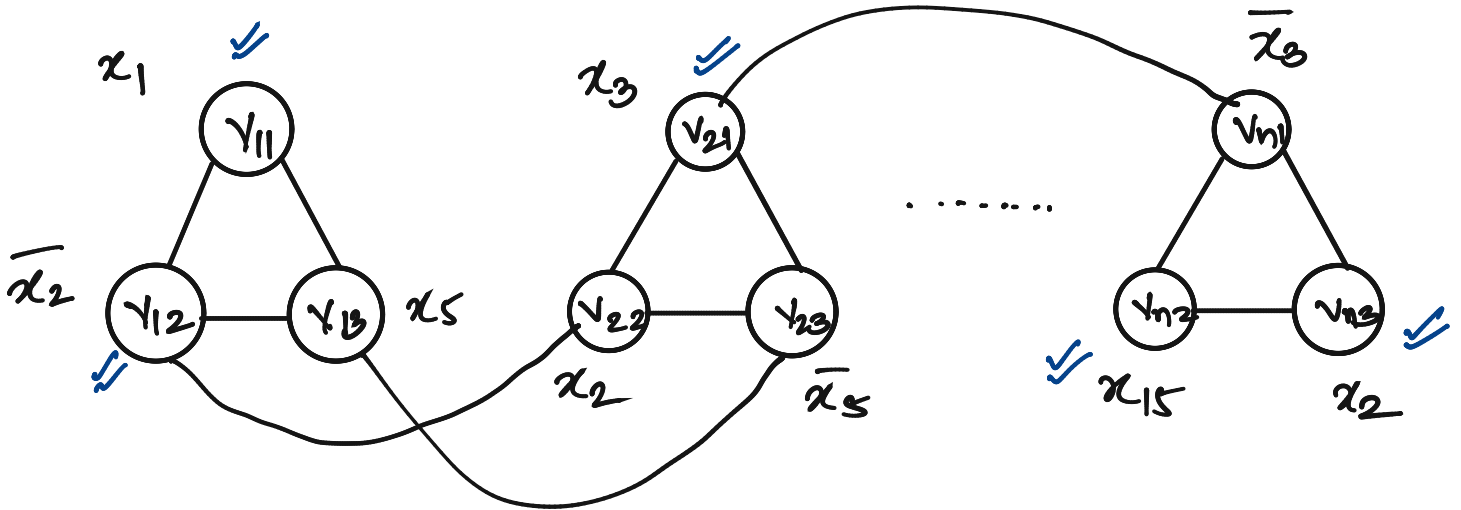
Q: CAN THERE BE A CLAUSE IN WHICH NO TERM IS SET TO 1?

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

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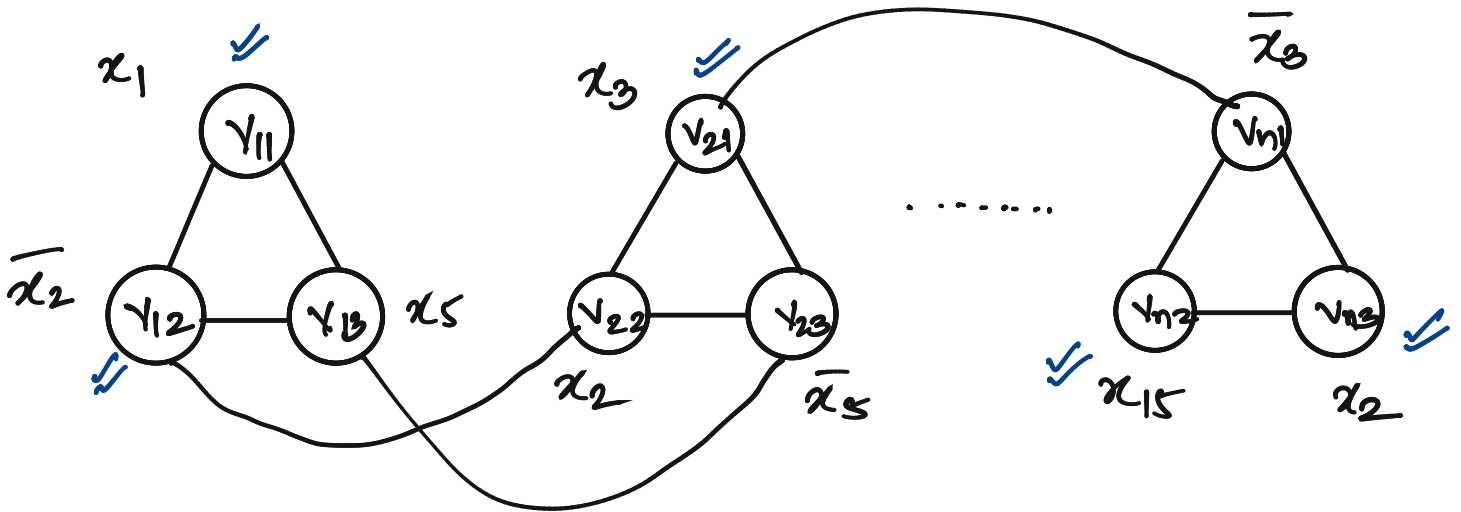
A: NO.

Q: CAN $v_{ij} = x_e$ & $v_{ij'} = \bar{x}_e$ BE SET TO 1?

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



LOOK AT ALL TERMS WHICH ARE SET TO 1.

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A: NO.

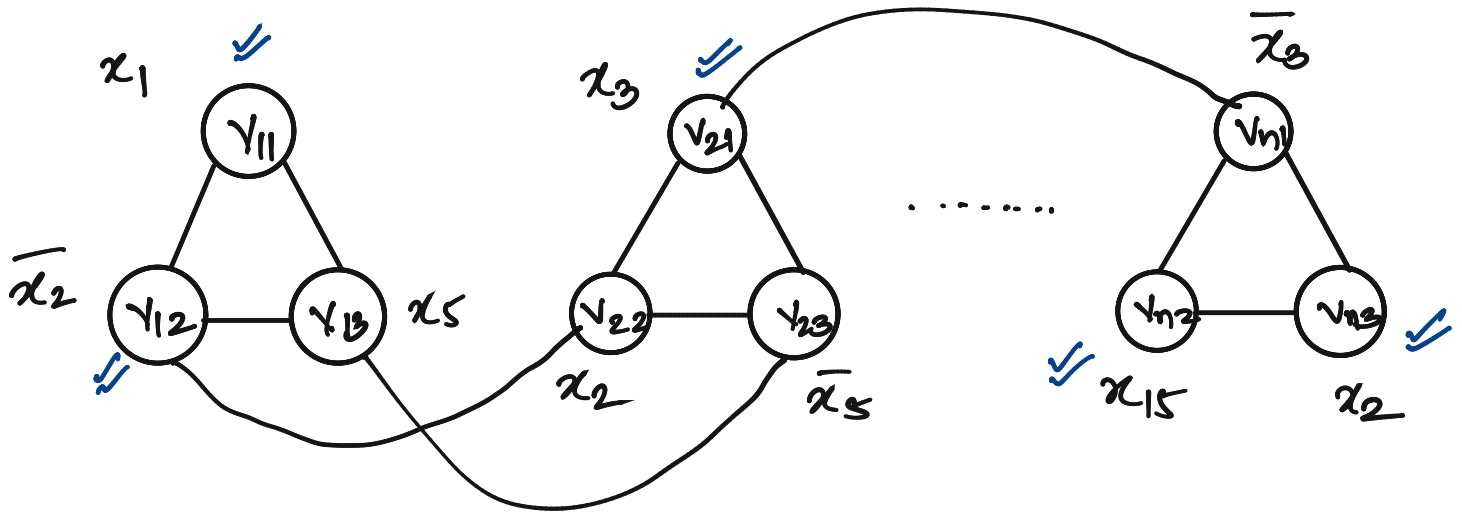
Q: CAN $v_{ij} = x_e$ & $v_{i'j'} = \bar{x}_e$ BE SET TO 1?

A: NO

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



LOOK AT ALL TERMS WHICH ARE SET TO 1.

Q: CAN THERE BE A CLAUSE IN WHICH NO TERM IS SET TO 1?

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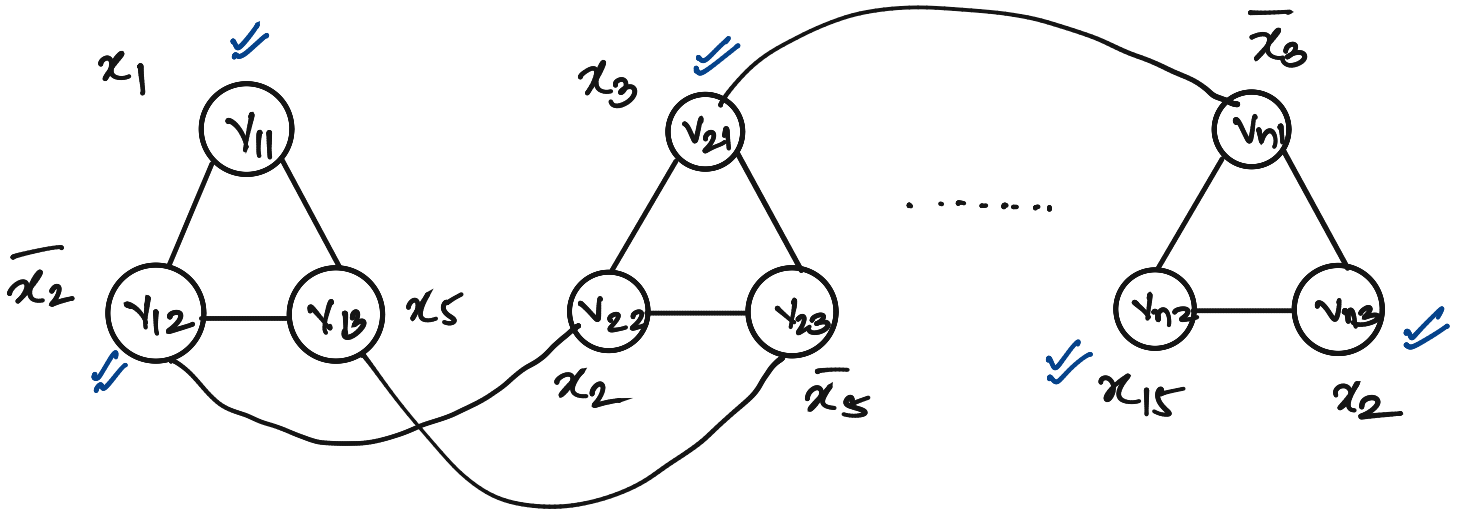
A: NO

\Rightarrow EDGE GOING ACROSS CLAUSES ARE NOT A PROBLEM.

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.

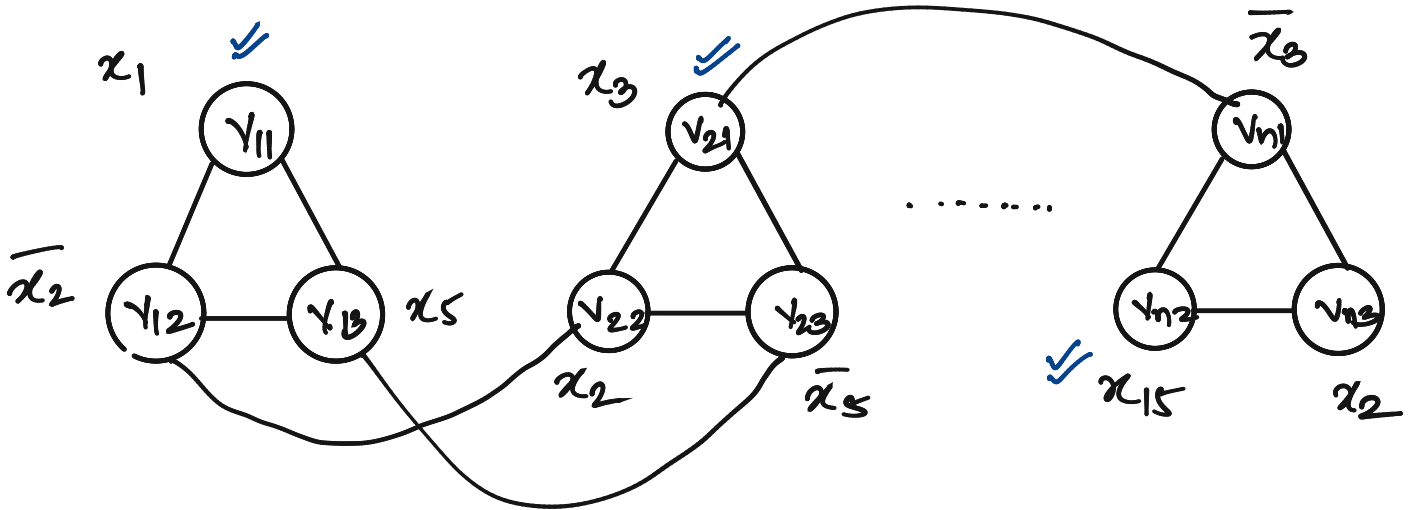


BUT EDGES INSIDE CLAUSES MAY
CREATE PROBLEM

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

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MAKE A GRAPH OUT OF CLAUSES.

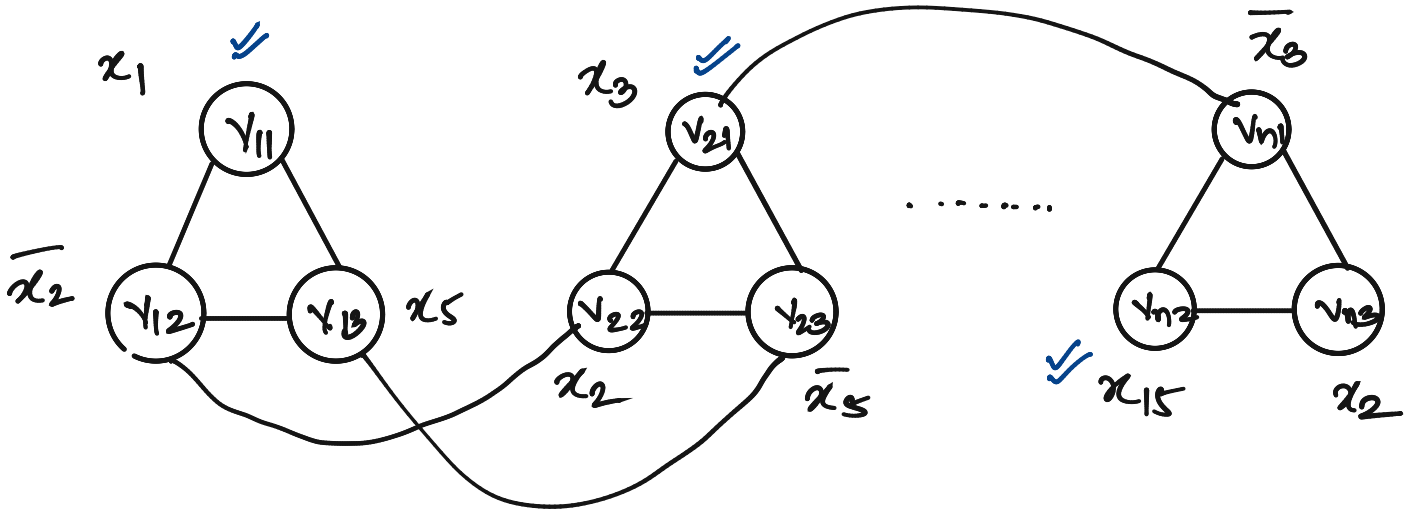


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MAKE A GRAPH OUT OF CLAUSES.



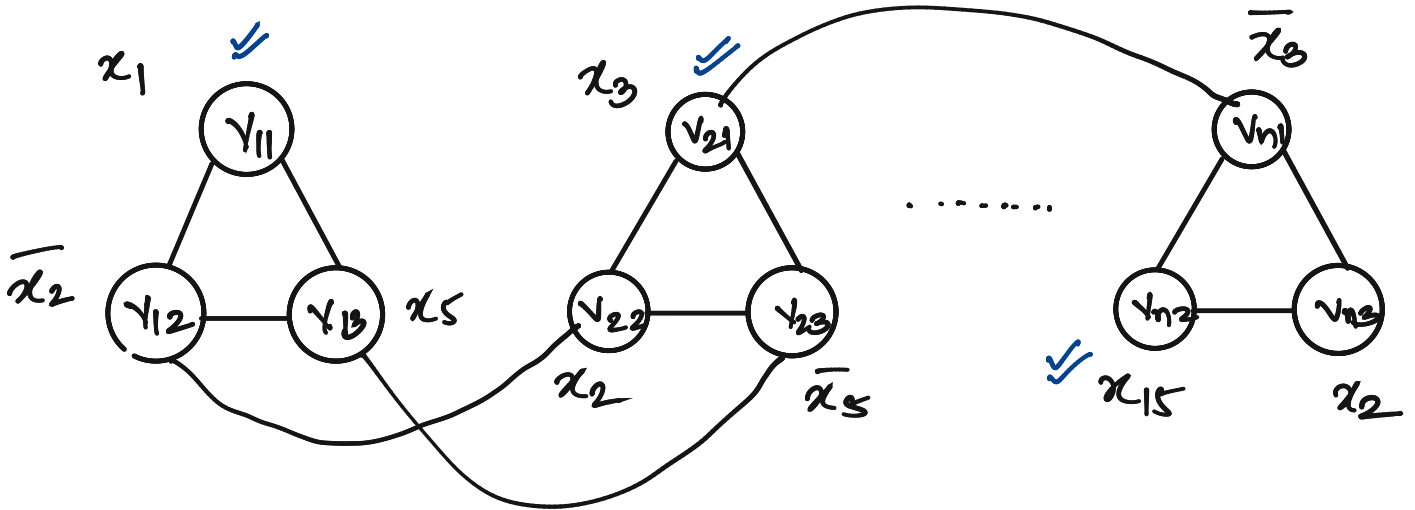
BUT EDGES INSIDE CLAUSES MAY
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IS THIS SET AN INDEPENDENT SET?

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



BUT EDGES INSIDE CLAUSES MAY
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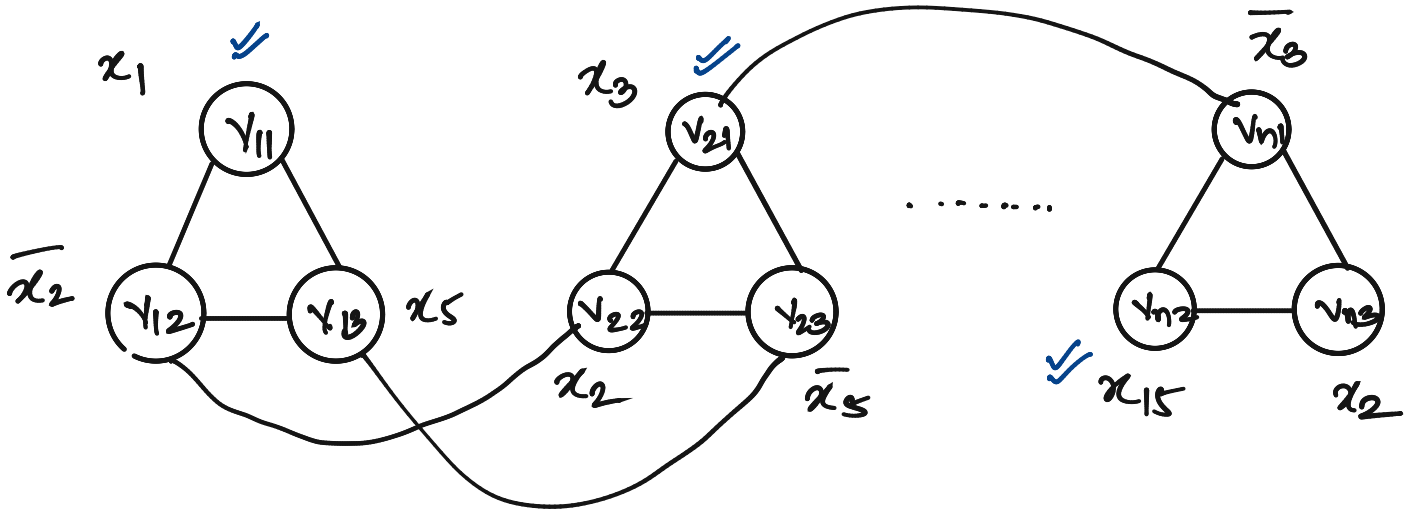
YES

SIZE OF THIS INDEPENDENT SET?

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

$$\dots \wedge (\bar{x}_3 \vee x_{15} \vee x_2)$$

MAKE A GRAPH OUT OF CLAUSES.



BUT EDGES INSIDE CLAUSES MAY
CREATE PROBLEM

IS THIS SET AN INDEPENDENT SET?

YES

SIZE OF THIS INDEPENDENT SET?

X

IF \exists AN INDEPENDENT SET OF SIZE
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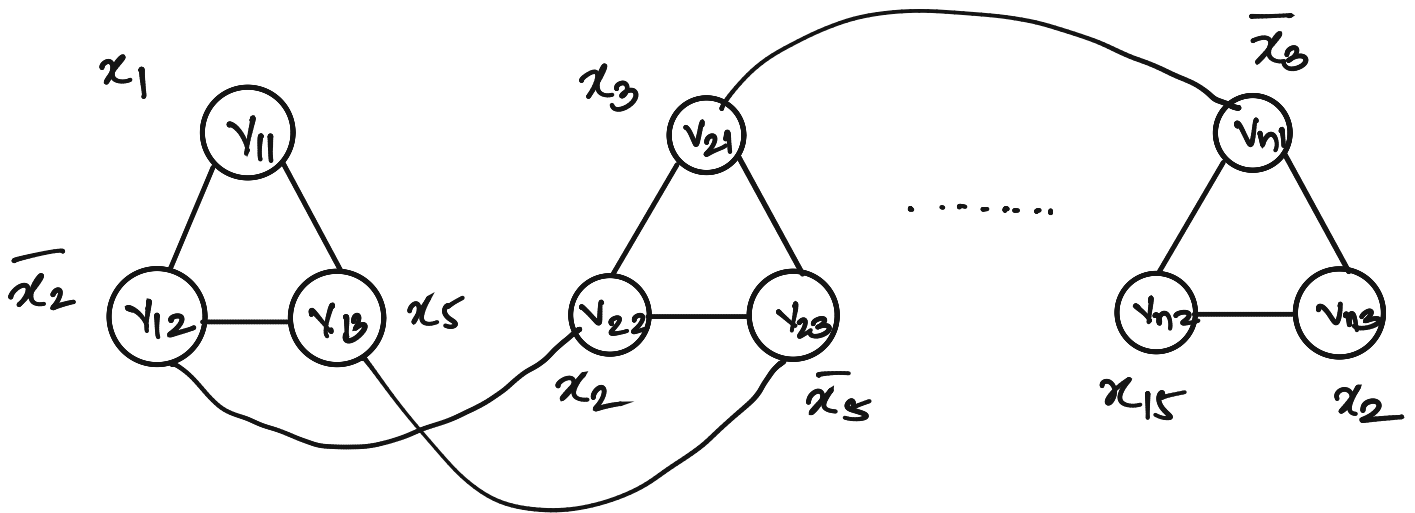
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MAKE A GRAPH OUT OF CLAUSES.



GIVE THIS INPUT TO INDEPENDENT SET BLACKBOX ALGORITHM

Q: IS THERE AN INDEPENDENT SET OF SIZE ATLEAST K IN G ?

A: NO

NO SATISFYING ASSIGNMENT.