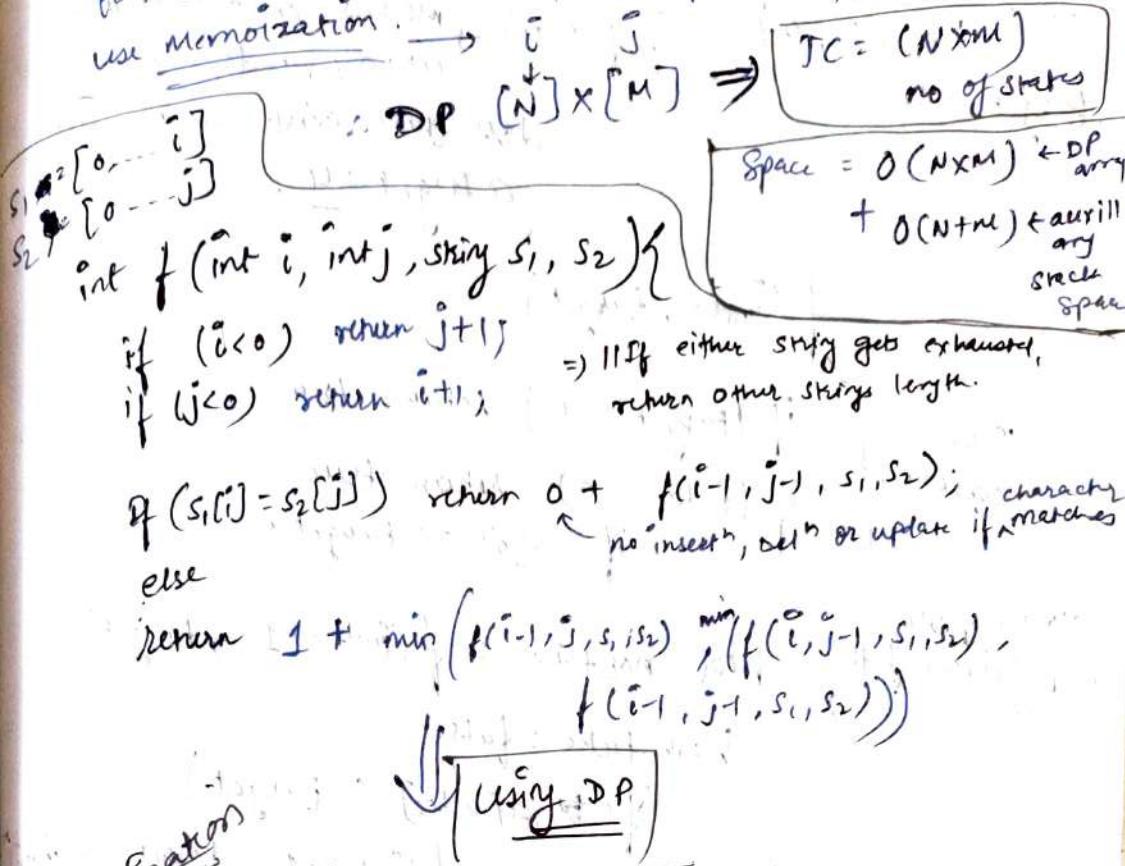


EDIT Distance using DP.

edit distance has overlapping subproblems, use memoization.



Memoization

f(i, j, &s1, &s2, &dp)

{
 if ($i < 0$) return $j + 1$;
 if ($j < 0$) return $i + 1$;
 if ($s1[i] == s2[j]$) return $0 + f(i - 1, j - 1, s1, s2, dp)$;
 else
 return $dp[i][j] = 1 + \min(f(i - 1, j, s1, s2, dp) \text{ (delete)}, f(i, j - 1, s1, s2, dp) \text{ (insert)}, f(i - 1, j - 1, s1, s2, dp) \text{ (update)})$

TC = $N \times M$

tabulation

$$n = \text{str1.size()}$$

$$m = \text{str2.size()}$$

Base cases: $dp[n+1][m+1]$
 ① for $i=0 \rightarrow N$ $dp[i][0] = i$;
 for $j=0 \rightarrow m$ $dp[0][j] = j$;

② for $i=1 \rightarrow n$ {
 for $j=1 \rightarrow m$ {
 if $s1[i-1] == s2[j-1]$ $dp[i][j] = dp[i-1][j-1]$
 else $dp[i][j] = \min\{dp[i-1][j] + 1, dp[i][j-1] + 1, dp[i-1][j-1] + 1\}$

	0	1	2	3
0	0	1	2	3
1	1			
2		2		
3		3		
4		4		

#Subset sum equals to target

arr { 0, 1, 2, 3, 4 }
target = 4

f(3, 4) means on the entire array, index 0 to 3 does there exist someone with a target = 4.

f(index, target)

base cases: {
if (target == 0) return true;
if (index == 0) return true;
if (a[0] == target);

Now explore all possibilities of the index.

bool nottake = f(index - 1, target)

bool take = false

if ($a[\text{index}] \leq \text{target}$)

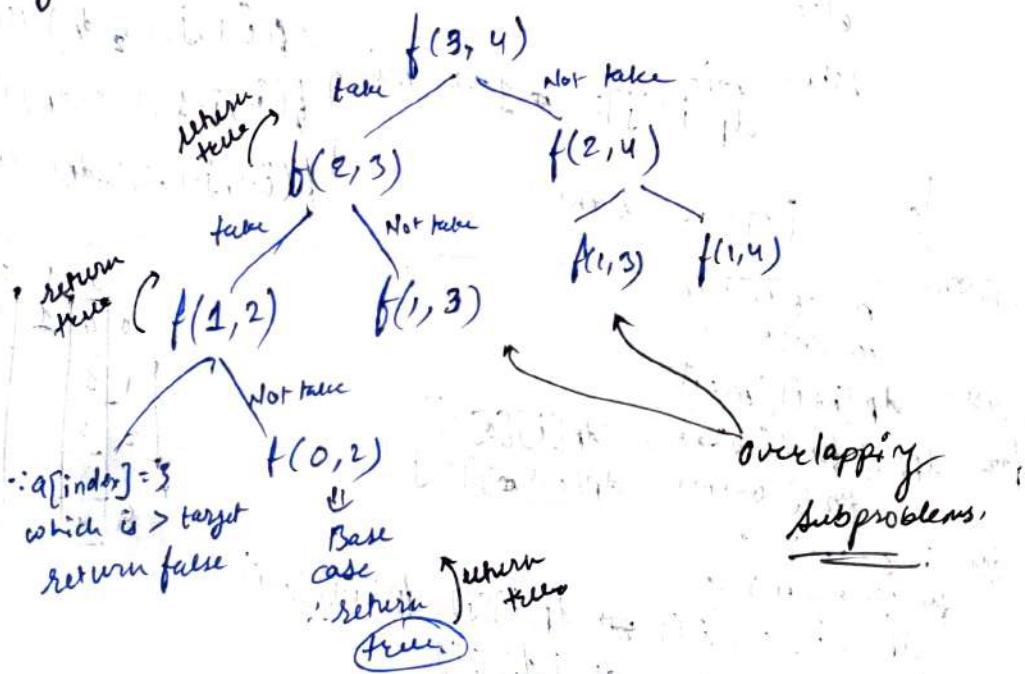
take = f(index - 1, target - a[index])

If any of the possibilities gives true for the target to exist, return it.

return (take) or (nottake);

main() { return f(n-1, target); }

Eg:- arr = { 2, 3, 1, 1 } target = 4



Recursion \Rightarrow Time Comp \Rightarrow $T(n) = 25(n-1) + c$
 $= O(2^n)$

There exist
subproblems

Space Comp \Rightarrow $O(n)$

Memorization
can be applied

① figure out change in states

index and target changes here

② So, DP array: [index] x [target]

Time Comp \Rightarrow $O(N \times \text{target})$

Space Comp \Rightarrow $O(N \times \text{target}) + O(n)$

Auxiliary
space

To reduce
auxiliary
space

↓
Tabulation

① Figure out base cases -

for ($i: 0 \rightarrow n-1$) $dp[0][0] = \text{true}$; target

$dp[0][a(0)] = \text{true}$;

② Form the nested loops.

index \rightarrow (1 to $n-1$)

target \rightarrow (1 to target)

③ Copy the recursion code

• T.C = $O(N \times \text{target})$
 • S.C = $O(N \times \text{target})$

Memoized code

bool f(index, target, arr, &dp) {

Base cases { if ($\text{target} == 0$) return true;

if ($\text{index} == 0$) return ($\text{arr}[0] == \text{target}$);

Check dp table \leftarrow if ($dp[\text{index}][\text{target}] != -1$) return $dp[\text{index}][\text{target}]$;

bool notTake = f(index-1, target, arr, dp);

bool take = false;

if ($\text{arr}[\text{index}] \leq \text{target}$)

take = f(index-1, target - arr[index], arr, dp);

return $dp[\text{index}][\text{target}] = \text{take} \text{ || Not take.}$

} Function call \Rightarrow f(n-1, target, arr, dp);

Tabulation: ~~bool f (int arr[], target)~~

~~Same code as memoization~~

~~bool subsetSumToK (n, target, arr)~~

~~bool subsetSumToK (int n, target k, vector<int> arr)~~

~~{ vector<vector<bool>> dp (n, vector<bool> (k+1, 0));~~

① ~~base case { for (int i=0 → n) dp[i][0] = true;~~

② ~~for (int index = 1 to n-1) {~~

③ ~~for (int target = 1 to → k) {~~

~~bool notTake = dp[index-1][target];~~

~~bool take = false;~~

~~if (arr[index] ≤ target)~~

~~take = dp[index-1][target - arr[index]]~~

~~dp[index][target] = take || Not take;~~

~~}~~

~~}~~

~~return dp[n-1][k];~~

~~}~~

Reduction

$P = \{ \text{Problems solvable in polynomial time} \}$
 $NP = \{ \text{Decision problems solvable in non deterministic polynomial time} \}$

↓
 can guess our q.
 polynomially many options,
 if any guess leads to YES answer
 then we get such a guess
 in ~~poly time~~ - $O(1)$ time.

* 3SAT : Given Boolean formula of the form,

$$(x_1 \vee x_3 \vee \bar{x}_6) \wedge (\bar{x}_2 \vee x_3 \vee x_7) \wedge \dots$$

clause

Decision problem :- Can you set the variables x_1, x_2, \dots such that formula come out to be True.

→ This is a hard problem, we don't know polytime algo to solve this.

But we do have a polytime non-deterministic algo.
So, this problem is in NP.

3SAT NP :- guess $x_1 = \text{True or False}$ } All takes poly time.
 guess $x_2 = \text{True or False}$
 check formula $\begin{cases} \text{If True : set YES} \\ \text{If False : return NO.} \end{cases}$

This a polytime verifier algo that check if "sol" is valid. You can check it in polynomial time.

NP Complete :- A problem is NP-complete if
 1. $x \in NP$
 2. $A \leq_p x$ for some known NP-complete prob. A

x is NP complete if $x \in NP$ and x is NP-hard

x is NP-hard if every problem $y \in NP$ reduces to x .

x is NPC if $\boxed{\text{every } y \in NP \leq_p A \leq_p x}$ so every y reduces to x .
 A is a known NP complete

$$\begin{aligned} \text{All } NP &\rightarrow SAT \rightarrow x \\ \therefore \text{All } NP &\rightarrow x \end{aligned}$$

Reductions:- From Problem A \rightarrow Problem B.

\Rightarrow Polytime algorithm converting A input to equivalent B inputs

* NP complete:-

A problem X is NP-complete if:

① $X \in \text{NP}$

② $A \leq_p X$ for some known NP-C Problem A

\Rightarrow To prove B is NP-complete:

✓ Reduce known NP-C problem to B

✗ Never reduce B to known problem

\rightarrow To Prove B is NP-complete

1. $B \in \text{NP}$ ("A sol" can be verified in poly time)

2. Let A be known NP-complete Problem

3. We construct a polytime "reduct" $A \rightarrow B$

4. We show A is satisfiable if and only iff B has ass

5. Hence B is NP-complete

• Identify known NPC problem

• State reduction

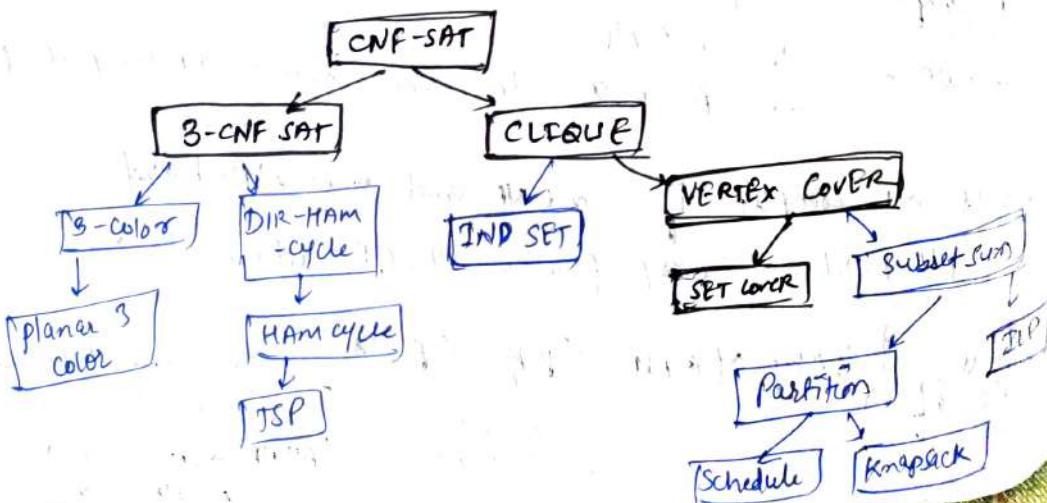
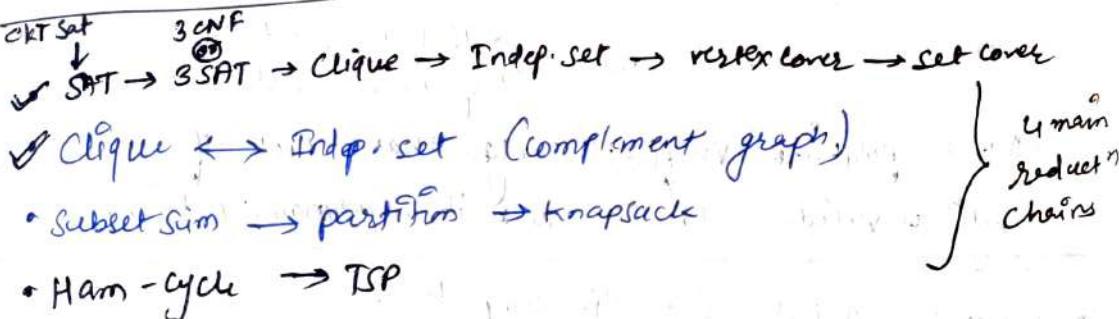
• Construct mapping

• Proof correctness

• mention poly time

Cook-Levin Theorem:-

SAT is NP-complete. Therefore every problem in NP can be polynomially reduced to SAT



Note:- To prove X is NP-complete, reduce a known NP-complete problem to X and show the reduction is polynomial and correctness preserving.

For example:-

To prove clique is NP-complete.

1. Write Clique \in NP.

2. Reduce 3SAT \rightarrow clique (\because SAT is a known NP-C problem by Cook's Theo.)

3. Construct a graph.

Where each literal is a vertex,

Connect compatible ~~literal~~ literals, seek k -clique.

4. Satisfiable \Leftrightarrow clique exist

• SAT \rightarrow General satisfiability

• CNF \rightarrow Format (AND of OR's)

• 3SAT \rightarrow SAT with 3 literals per clause

• Circuit-SAT \rightarrow Boolean circuit satisfiability

Q1) Prove that Clique \in NPC.

Clique :- Subset of vertices $V' \subseteq V$ such that every two distinct vertices in V' are connected by edge E .

Decision problem

In a graph $G(V, E)$ and integer k , does G contain a clique of size k ?

* Proof for NP:-
X: Instance of a graph $G(V, E)$ and, k
Y: Set $V' \subseteq V(G)$

$V(X, Y)$: Given a subset of vertices V' then

O(n²) time

i) If $|V'| \neq k$ return False \leftarrow no. of vertex not equal to clique size
ii) If $|V'| = k$
 for u in V' :
 for v in V' :
 If $u \neq v$ and $(u, v) \notin E$
 return False
 else return True

so verifying clique we need $O(n^2) = O(k^2)$ [polynomial] time

$\therefore \boxed{\text{Clique} \in \text{NP}}$

$\boxed{\text{Circuit SAT} \xrightarrow{\leq_p} \text{SAT} \xrightarrow{\leq_p} \text{3CNF} \xrightarrow{\leq_p} \text{Indep Set} \Leftrightarrow \text{Clique} \xrightarrow{\leq_p} \text{PCP} \xrightarrow{\leq_p} \text{DLP}}$

* Proof of NPC.

using Cook's Theorem we know circuit sat \in NPC, so we show $\text{Circuit SAT} \leq_p \text{SAT} \leq_p \text{3CNF} \leq_p \text{Clique}$

(A) Proof of $\text{Circuit SAT} \leq_p \text{SAT}$

- ① Assign variables x_i^0 for each input of a circuit.
- ② Assign variable x_0 for output.
- ③ Set up an if and only if formula for each gate. Let ϕ_k be the formula for k^{th} gate.

④ Let x_0 be final output $\Rightarrow x_{0,f} = \phi_1 \cdot \phi_2 \cdot \phi_3 \dots$
 (CNF formula)

• Reductⁿ for NOT Gate

$$\begin{aligned}\phi &= x_1 \leftrightarrow \bar{x}_2 \\ &= (\bar{x}_1 + \bar{x}_2)(x_1 + \bar{x}_2) \quad |x_1| \rightarrow \text{Do } x_2 \\ &= (\bar{x}_1 + \bar{x}_2)(x_1 + x_2)\end{aligned}$$

So NOT gate can be reduced to CNF in poly time.

• Reductⁿ for AND Gate

$$\begin{aligned}\phi &= x_3 \leftrightarrow x_1 \cdot x_2 \quad |x_1| \rightarrow D \quad |x_2| \rightarrow D \quad |x_3| \rightarrow D \\ &= (x_3 + \bar{x}_1 \cdot \bar{x}_2)(\bar{x}_3 + x_1 \cdot x_2) \\ &= (x_3 + \bar{x}_1 + \bar{x}_2)(\bar{x}_3 + x_1)(\bar{x}_3 + x_2)\end{aligned}$$

Hence AND Gate can be reduced to CNF in polytime

• Reductⁿ for OR Gate

$$\begin{aligned}\phi &= x_3 \leftrightarrow x_1 + x_2 \\ &= (x_3 + (x_1 + x_2))(\bar{x}_3 + x_1 + x_2) \\ &= (x_3 + \bar{x}_1)(x_3 + \bar{x}_2)(\bar{x}_3 + x_1 + x_2)\end{aligned}$$

So OR gate can also be reduced to CNF in polytime

Hence each gate can be reduced to CNF formula ϕ in poly time

$\boxed{\text{Ckt SAT} \leq_p \text{SAT}}$

⑤ Proving 3SAT \leq_p Clique

We reduce a known NP-complete problem 3SAT to clique

- Let the input formula be

$$\phi = (x_{11} + x_{12} + x_{13})(x_{21} + x_{22} + x_{23}) \dots (x_{n1} + x_{n2} + x_{n3})$$

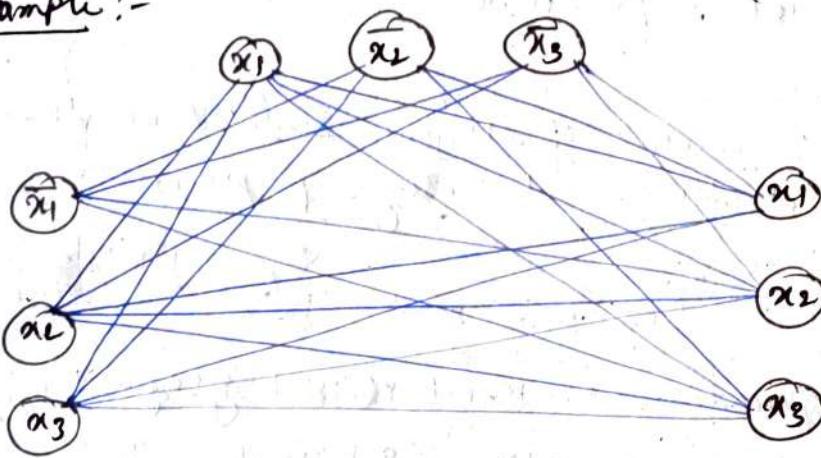
There are n clauses, each clause contains 3 literals.

* Construction of Graph G .

- Construct a graph G of k clusters with 3 nodes each.
- Each cluster corresponds to a clause (each clause contributes 3 vertices).
- For each literal in each clause, create a vertex.

- ⑥ Add an edge between two vertices if:
1. They come from different clauses, and
 2. add edge except for the pairs of the form (x_i, \bar{x}_i)

Example:-



⑦ Correctness

- If ϕ is satisfiable, then each clause has at least one true literal. Choosing one true literal from each clause gives K vertices, all pairwise compatible.
Hence they must form a clique of size $K^{f(n)}$
- If G has a clique of size K , it must select one vertex from each clause (\because no edges exist b/w same clause). These chosen literals cannot contradict, so they give a satisfying assignment for ϕ .
 $\therefore \phi$ is satisfiable $\Leftrightarrow G$ has a clique of size K .

The construct is clearly polynomial.

$\therefore 3SAT \leq_p \text{Clique}$

So, clique is NP-Hard.

⑧ Conclusion

since 1. Clique \in NP

2. $3SAT \leq_p \text{Clique}$ and $3SAT$ is NP-complete

Clique is NP-complete

* Reductions and Decision Problems

(Q1) Prove that PCS is in class NP (10 marks)

(~~PCS = circuit SAT~~)

~~You need to only show a sol^o (input assignment) can be verified in poly time.~~

• Decision Problem:-

Is there a schedule of all jobs such that they all finish before deadline d using p processors.

• PCS : $V(X, Y)$

X: set of precedence constraints (Task graph T), containing set of jobs $J = \{J_1, J_2, J_3, \dots, J_n\}$, No of processors P and Deadline D.

Y: $t_1, t_2, \dots, t_n \leftarrow$ Processing time for jobs
 $t_i^o =$ time at which job i^o is scheduled.

To show a problem is in NP, we must show

Given a proposed sol^o, it can be verified in polytime.

Proof:- We are given a certificate (proposed sol^o) consisting of an ordering of all jobs (Schedule) we verify this certificate in polytime by

① Check Precedence constraints

For every constraint $J_i < J_j$:

- verify that job J_i^o appears before J_j^o in schedule
- This can be done by scanning Job order
 - takes almost $O(n^2)$ time

② Check completion time:

- Simulate the scheduling by adding processing times in order

• Compute total finishing time

- verify that it is $\leq D$

→ This takes $O(n)$ time

③ Time complexity :- Both checks are polynomial
∴ verification runs in polytime

∴ $\boxed{\text{PC8 ENP}}$

*Q) Prove Independent Set is in NP:

Decision Problem:- Does G contain Indep. set of size k
(k vertices with no edges b/w any pair)

Input:-

- A graph $G(v, E)$
- An integer k

Proof:- we show that proposed soln can be verified in polytime
set of vertices $S = \{v_1, v_2, \dots, v_n\}$ claimed to be
indep. set

- ① check that $|S| = k \rightarrow O(1)$
- ② for every pair (v_i, v_j) with $i \neq j$ check
 $(v_i, v_j) \notin E \rightarrow O(k^2)$

Conclusion:- A certificate can be verified in polytime.

$\boxed{\text{Indep set} \in \text{NP}}$

*Q) Prove that Indep-set is NP-complete.

Step 1:- Indep set $\in \text{NP}$ ← already proved.

Step 2:- Independent set is NP-Hard.

we reduce a known NP-complete prob CLIQUE to Indep-set
 $\text{Clique} \leq_p \text{Indep set}$

* Construction

Instance of clique:

- Graph $G(v, E)$
- Integer k
- Question: Does G have a clique of size k .

Construct a new Graph

Let \bar{G} be the complement of Graph G

- Same vertices : V
 - Edge exist in \bar{G} if and only if it does not exist in G
keep the same integer k
 - Clique in G : Every pair is connected
 - Indep. set in \bar{G} : No pair is connected.
 - Since edges are flipped, these conditions are equivalent
- * correctness of reduction
- $$(G, k) \in \text{CLIQUE} \Leftrightarrow (\bar{G}, k) \in \text{Independent set}$$
- so solving Indep. set on \bar{G} solves Clique on G
- * Poly time :-
constructing complement graph takes $O(|V|^2)$ time

* conclusion:-

1. Independent set $\in \text{NP}$
2. $\text{AClique} \leq_p \text{Indep. set}$

Hence Indep. is NP-C
set

* Q) Prove that ~~Indep.~~ vertex cover is NP-complete

(Indep. set \leq_p vertex cover)

↓
 known
 decision
 problem

Theorem :- Vertex cover decision problem is NP-complete

Step ① :- Vertex cover belongs to NP

Decisn prob:- Does G have a vertex cover of size $\leq k$?
(A set of vertices that touches every edge)

Input:-

- Graph $G = (V, E)$
- Integer k

Certificate:- A set $C \subseteq V$ with $|C| \leq k$

Verification (poly time) :- For every edge $(u, v) \in E$, check
 $u \in C$ or $v \in C$

This takes $O(|E|)$ time. \leftarrow polynomial

Hence $\boxed{\text{vertex cover } \in \text{NP}}$

Step ② :- vertex cover is NP-Hard

We reduce Independent Set (Known decisiⁿ problem) to vertex cover

Construction:-

Instance of independent set

- Graph $G = (V, E)$, Integer k

Construct instance of vertex cover

- use the same graph G

- set new integer $k' = |V| - k$

Key Lemma :- A set S is an independent set in G if and only if $V \setminus S$ is a vertex cover in G

Proof :- If S is an independent set, no two vertices in S share an edge.

\therefore Every edge must have at least one endpoint outside S so all edges are covered by $V \setminus S$

• conversely if C is a vertex cover, then no edge has both endpoints outside C . So $V \setminus C$ contains no adjacent vertices \rightarrow independent set

Correctness :-

$$(G, k) \in \text{Indep set} \iff (\neg G, |V|-k) \in \text{vertex cover}$$

thus solving vertex cover solves independent set.

The transformation is clearly polytime

Conclusion :-

• vertex cover $\in \text{NP}$

• Indep set \leq_p vertex cover

$\therefore \boxed{\text{Vertex cover is NP-complete}}$

Ques 2) Prove that formula satisfiability \leq_p 3-CNF satisfiability and show SAT is NPc.

Part A :-

Formula SAT \leq_p 3-CNF SAT
(i.e SAT \leq_p 3SAT)

Given:-

SAT = Satisfiability of any Boolean.

3SAT = Satisfiability of Boolean Formula in 3CNF form
(each clause 3 literals).

We must show that SAT instance can be converted into 3SAT in poly time

Step①:- Convert SAT to CNF

Any Boolean formula can be transferred into Conjunctive Normal form (CNF) using logical equivalence

• De Morgan's law • Distributive law.

This transformation takes poly time

So:- [SAT \leq_p CNF-SAT]

Step②:- Convert CNF to 3-CNF

If a clause has more than 3 literals

$$\text{eg:- } (x_1 + x_2 + x_3 + x_4)$$

$$\text{replace by:- } (x_1 + x_2 + y_1) \wedge (y_1 + x_3 + x_4)$$

If a clause has less than 3 literals

$$\text{eg:- } (x_1 + x_2)$$

$$\text{replace by:- } (x_1 + x_2 + z) \wedge (x_1 + x_2 + \neg z)$$

Hence

CNF-SAT \leq_p 3SAT

part B :- Prove that SAT is NP-complete

Step 1:- SAT ∈ NP.

Given a truth assignment for variables, we can verify whether the formula is true by evaluating it in polytime.

Hence :- SAT ∈ NP

Step 2:- SAT is NP-Hard.

By Cook's Theorem, every problem in NP can be reduced to SAT in polytime. Since SAT and Circuit-SAT are polynomial-time equivalent, every NP problem is also reducible to Circuit-SAT.

Hence :- SAT is NP-Hard

Conclusion :-

1. Since SAT ∈ NP
2. SAT is NP-Hard
3. SAT \leq_p 3SAT

we conclude

SAT is NP-complete and SAT \leq_p 3SAT

Ques 4) Prove that Independent-set \leq_p Circuit-Sat and IS is NP complete

Soln * IS - Decision Problem

* Input :- Graph $G = (V, E)$, integer k

* Question :- Does G contains indep. set of size atleast k ?
(no two vertices in the set are adjacent)

* Circuit satisfiability (Circuit-SAT)

* Input :- Boolean circuit C with some input variables

* Question :- Is there an assignment to the inputs such that the output of C is 1.

We must build, in polytime, a circuit $C_{G,k}$ that is satisfiable iff G has an indep. set of size atleast k .

*Construction of circuit

Claim 1 - If circuit outputs to 1, then S forms an indep. set

Proof:- ① Variable Assignment

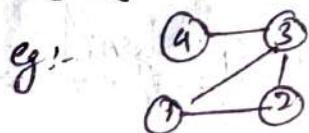
For each vertex $v_i \in V$ creates a boolean variable x_i^v such that
 $x_i^v = 1$ if v_i ~~is part of~~ is part of indep. set
 $x_i^v = 0$ if v_i is not part of indep. set

② Non Adjacency Constraint

For an edge $(v_i^v, v_j^v) \in E$ we need a constraint that includes only one of v_i^v, v_j^v . That is both can't come at a time

\therefore clause is $v_i^v(x_i^v \wedge x_j^v) \Rightarrow (\bar{x}_i^v \vee \bar{x}_j^v)$ [DeMorgan's law]

These are ~~and~~ AND and OR operations which can be implemented by logic gates

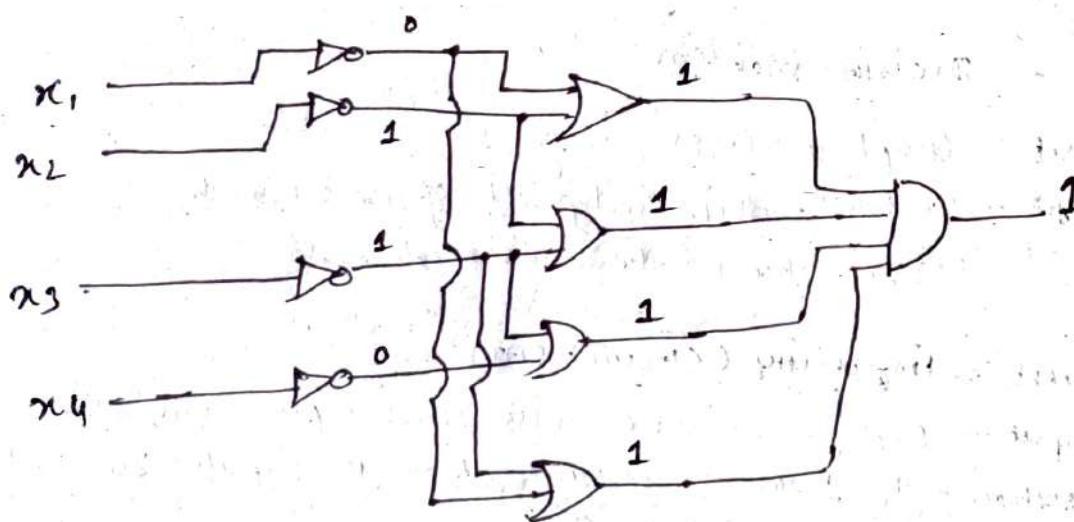


$$k=2, G = \{v(1,2,3,4)\}$$

$$E[(1,2)(1,3)(1,2)(4,3)]\}$$

$$\text{Ind. set} \rightarrow S = \{1, 4\}$$

Variable assignment	x_1	x_2	x_3	x_4
	1	0	0	1



Circuit C1

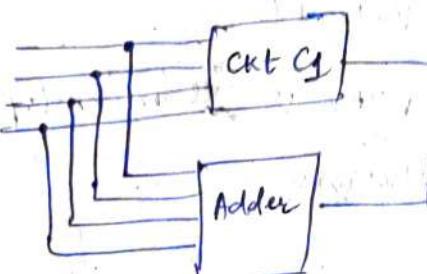
Above is logical circuit handling non adjacency vertices in the given subgraph

(3) Size constraint

$|S| \leq k$ needs to be ensured in indep. set using adder circuit.

$$\sum_{v \in V} x_v \geq k$$

Such circuit can be built in polytime using adders



The output is a single bool can variable that determines whether indep set is valid.

The o/p of gate is satisfied if

(i) Indep set is of size k

(ii) No two adjacent vertices are part of Indep set.

Thus if circuit is satisfiable, this satisfying assignment corresponds to independent set

and mapping $(G, k) \leftrightarrow$ circuit is completable in polytime

$\boxed{\text{Independent set } \leq_p \text{Circuit - SAT}}$

Ques) Show that Max^m Independent set is polytime reducible to DLP.

Proof:- Max^m Independent set (MIS)

I/P: An undirected graph $G = (V, E)$

O/P: largest subset $V' \subseteq V$ such that no two vertices in V' are adjacent i.e. $(u, v) \in V'$ but $(u, v) \notin G$

Integer linear programming (ILP):

I/P: A set of linear inequalities and an objective fn with variables i.e. A, B and objective fn

O/P: The values of the variables that maximize or minimize the objective fn while satisfying constraints i.e. a

such that $Ax \leq B$

* Reduction from MIS to ILP.

→ To represent MIS as ILP, we can use binary variables to model the selection of vertices in the independent set.

Step①:- Let's define binary variable

$$x_i = \begin{cases} 1 & \text{if vertex } v_i \text{ is in indep set} \\ 0 & \text{otherwise} \end{cases}$$

Step②:- Objective fn.

To maximize the no. of vertices in Indep. set.

$$\text{maximize } Z = \sum_{i=1}^{|V|} x_i$$

Step③:- Constraints (No two adjacent vertices)

For every edge $(v_i, v_j) \in E$, we cannot select both vertices simultaneously, so add constraint

$$x_i + x_j \leq 1 \quad x_i, x_j \in \{0, 1\} \quad \forall i, j$$

The above constraint guarantees that if $x_i = 1$ (vertex i is in IS) then $x_j = 0$ and vice versa, thus ensuring no two adjacent vertices are both selected.

* Polytime reduction

→ To convert an instance of MIS to ILP, we simply need to

① create a variables x_i for each vertex $i \Rightarrow O(V)$

② set up objective fn $\sum_{i \in V} x_i \Rightarrow O(V)$

③ for each edge $(i, j) \in E$ add constraint $x_i + x_j \leq 1 \Rightarrow O(E)$

$$\therefore \text{Overall time comp} = O(V + V + B) = O(V + B) = \text{polytime}$$

$$\boxed{\text{MIS} \leq_p \text{ILP}}$$