

## \* LOCAL SEARCH

### ① Neighbor relation:

Current solution  $s \in C$  (Set of all possible solutions)

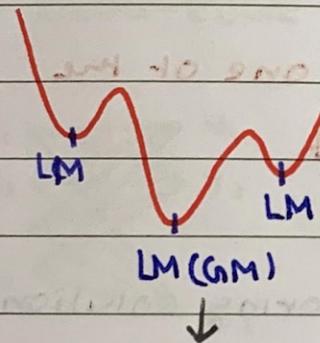
In a given step it chooses a neighbor  $s'$  of  $s$  then  $s'$  is current solution.

( $s'$  can be obtained from  $s$  by a small modification)

### → Feasibility graph:

Graph on set of all possible solutions with edges joining neighboring pairs of solutions.

### ② Analogy to Potential Energy



\* At every step we tend to move towards a good solution i.e.  $\downarrow PE$

\* When we are at a LOCAL minima the algorithm terminates.

\* Local minima may not be the global minima.

### ① Vertex Cover:

**Objective function:**

Min. no of vertices such that all edges are covered.

**Neighbor relation:**

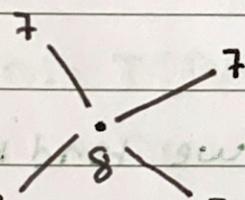
$V_1$  is neighbor of  $V_2$  if diff of only 1 vertex is there  
in 2 solutions

$$\{1, 2, 5\}$$

$$\{1, 2, 4, 5\}$$

$$\{1, 5\}$$

- \* Here the cost function is the no. of vertices in the set at each vertex & we want to minimize it.



\* We move towards one of the vertices with  $|V|=7$

- \* Each vertex has at most  $n$  neighboring solutions where  $n$  is the no. of vertices in  $G$ .

- \* ALGO: Initialise set  $res = \{ \}$  choose any vertex of the feasibility graph, consider set  $S = \{ \text{all vertices of graph} \}$

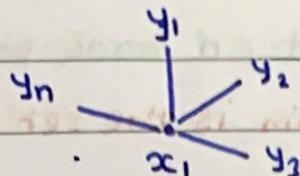
→ While  $S$  is not empty

↓  
Vertex of feasibility graph

\* Choose any vertex  $v \in S$ , add  $v$  to  $res$

$\exists (u, v) \in G$  & remove  $v$  &  $u$  &  $(u, v) \in G$  from  $S$

① \*



★ Start with the node.

{x\_1, y\_1, y\_2, ..., y\_n} in feasibility graph

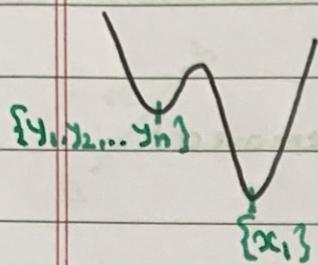
★ If we keep on removing y\_i's

STAR

{x\_1} as our local optimum

★ Remove x\_1 we have {y\_1, y\_2, ..., y\_n}

as local minimum.



② \*

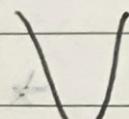
x\_1 x\_2

★ n: vertices, 0: edges

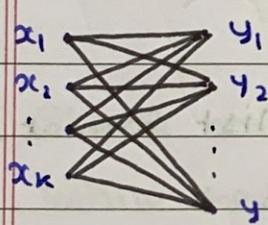
x\_n x\_1 x\_2 x\_3

★  $\phi$  is the only local minima

ZERO-EDGE



③ \*



★ Complete bipartite graph with l &gt; k

 $\rightarrow \{x_1, x_2, \dots, x_k\}$ 

{y\_1, y\_2, \dots, y\_l\} are the two

BIPARTITE

local minimas with the former

being deeper than the other.

( # no. of vertices )

(7+10) . T .

④ \*

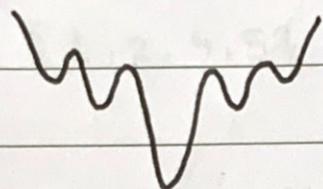
\*  $n^2$  is odd,  $n$  node path

$x_1, x_2, \dots, x_n$  \* Global min is the set of all even vertices

→ But even if any one even vertex is removed we cannot reach the global min. (mod 3)

→  $\{x_2, x_3, x_5, x_6, x_8, x_9, \dots\}$

is also local min. ( $1 \bmod 3$  indices removed)



\* At every step no. of vertices in the set of current vertex of Feasibility Graph  $\downarrow$  by 1  
 $\rightarrow \therefore$  there are almost  $O(n)$  iterations  
 (Achieved in case of zero-edge graph)

\* Time Complexity :  $O(V+E)$  (Adjacency list format)

Feasible solution initially  $\{x_1, x_2, \dots, x_n\}$

\* Choose Remove a vertex which is not marked.

Check it's list if any element already removed

we can't remove it. (if so mark it else remove it)

\* Hence list of each vertex is traversed only once

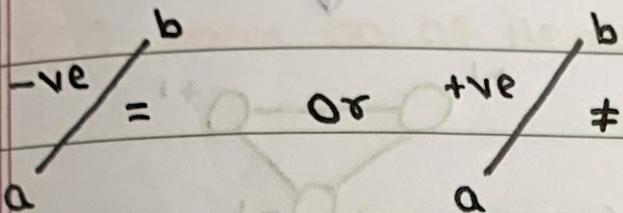
$\therefore T.C. O(V+E)$

## ② Hopfield Neural Network

Undirected weighted graph

each node assigned +1 or -1

\* Good edge



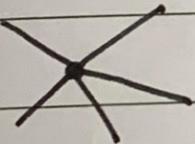
i.e. edge  $uv$  is good  $\Leftrightarrow w_{uv} s_u s_v < 0$

$w_{uv}$ : weight of the edge

$s_i$ : sign of the vertex

EDGES

\* Happy Node



$$\sum_{\text{good}} \text{lwe}_i \geq \sum_{\text{bad}} \text{lwe}_i$$

\* Stable config: all nodes are happy.

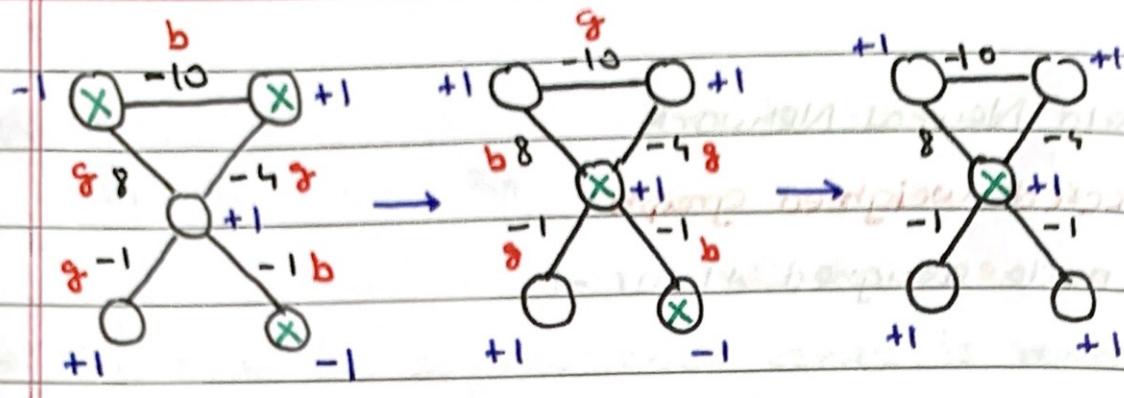
While the current config not stable

There must be an unsatisfied node

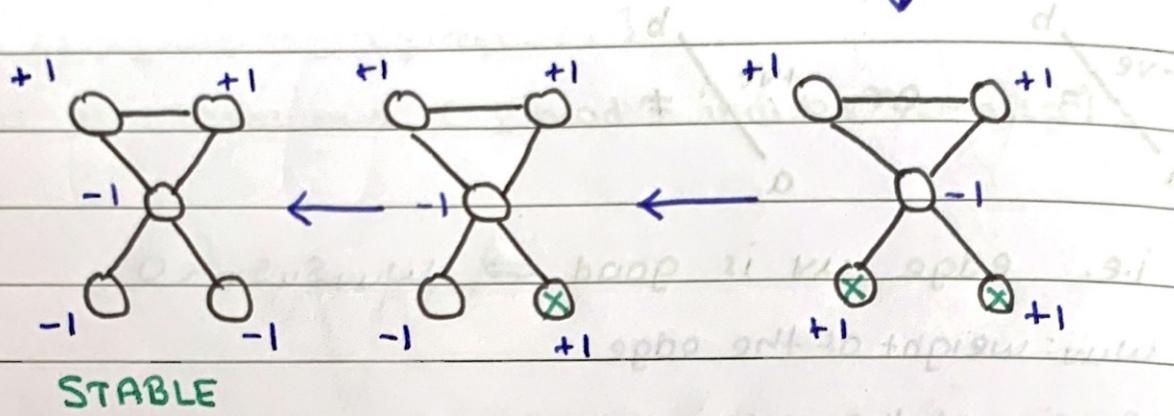
Chose that node  $u$

Flip the state (sign) at  $u$

End while.



$\downarrow$  alpha bound /



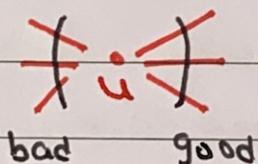
STABLE

\*  $W = \sum_e l_w e_l$

\*  $\sum_{\text{good}} l_w e_l \leq \sum_{\text{bad}} l_w e_l = W$

→ At every stage (flip)  $\sum_{\text{good}} l_w e_l$  increases

\* Let node  $u$  be unhappy



$|l_w u_g| < |l_w u_b| \dots \text{before}$   
after flip

$|l_w u_g| > |l_w u_b| \dots \text{after}$

$\because \text{good} \leftrightarrow \text{bad} \therefore \text{sum } \uparrow$

\* T.C.  $O(W \text{poly}(m, n))$

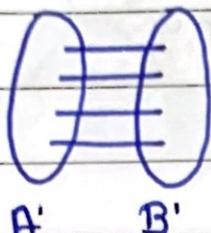
$\downarrow$  vertices  
 $\downarrow$  edges

$$2^{\log W} = 2^{\text{no. of bits to encode input } w}$$

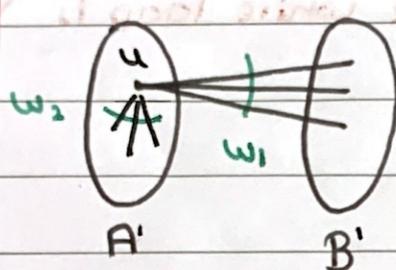
→ Such algo "Pseudo Polynomial Time"

(∴ max no. of iterations of the while loop is  $W$ )

### ③ Max Cut



maximise  $W(A', B') = \sum_{\substack{u \in A' \\ v \in B'}} w_{u,v}$   
 (Cut weight)



IF  $w_2 > w_1$

Move u from A' to B'

\* Neighbor Relation: Change of 1 vertex in partition.

→ At every iteration  $W(A', B') \uparrow$

\* At local optima:

$$\left. \begin{array}{l} \forall u \in A' \quad \sum_{v \in B'} w_{u,v} \leq \sum_{v \in A'} w_{u,v} \\ \forall u \in B' \quad \sum_{v \in A'} w_{u,v} \leq \sum_{v \in B'} w_{u,v} \end{array} \right\} n \text{ equations}$$

$$\Rightarrow 2 \sum_{u \in A'} w_{u,v} + 2 \sum_{u \in B'} w_{u,v} \leq 2W(A', B')$$

$$\Rightarrow W \leq 2W(A', B')$$

↓  
 Total weight

$$\text{But } W(A', B') \leq OPT \leq W$$

$$\therefore \frac{1}{2} \text{OPT} \leq W(A, B) \leq \text{OPT}$$

$$\frac{1}{2}\text{OPT} \quad \text{OPT}$$

$\therefore$  our algo outputs a soln between  
 $\frac{1}{2}\text{OPT}$  &  $\text{OPT}$

\* This is an approximation algo.

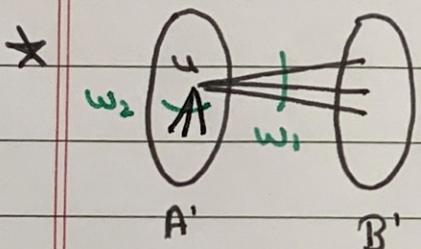
Time:  $O(W \text{poly}(m, n))$  : Pseudo Polynomial Time algo

\*  $n$  : input given

$O(n)$ : Pseudo poly

$O(\log n)$ : Weakly poly (# gcd)

$O(1)$ : Strongly poly



\* move u from A' to B'

$$\text{if } w_2 > w_1 (1 + \epsilon/n)$$

\* At local optima:

$$\forall u \in A \quad \sum_{v \in A} w(u, v) \leq \sum_{v \in B} w(u, v) + \frac{\epsilon}{n} W(A, B)$$

$$\forall u \in B \quad \sum_{v \in B} w(u, v) \leq \sum_{v \in A} w(u, v) + \frac{\epsilon}{n} W(A, B)$$

Adding  
n equations :  $2 \sum_{U, V \in A} w(U, V) + 2 \sum_{U, V \in B} w(U, V) \leq 2w(A, B) + \epsilon (w(A, B))$

$$\Rightarrow W \leq 2w(A, B) + \frac{\epsilon}{2} w(A, B)$$

$$\Rightarrow W \leq (2 + \epsilon/2) w(A, B)$$

$$\therefore \frac{OPT}{(2 + \epsilon/2)} \leq w(A, B) \leq OPT$$

where  $\epsilon > 0$

Initially  $w(A', B')$

$$(1 + \epsilon/n) w(A', B')$$

$$(1 + \epsilon/n)^2 w(A', B')$$

:

$$(1 + \epsilon/n)^{n/2} w(A', B')$$

$$\because (1 + \epsilon/n)^x \geq 2 \text{ for } x \geq 1$$

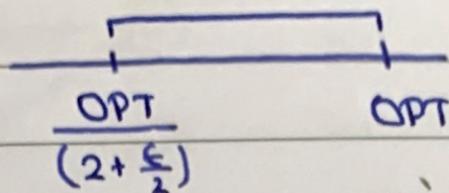
$$\therefore (1 + \epsilon/n)^{n/2} \geq 2$$

$\therefore$  Objective Function  $\uparrow$  by at least 2 every  $n/2$  flips  
or transitions.

$$\therefore w(A', B') \leq W$$

$$\therefore \text{T.C. is } O\left(\frac{n}{\epsilon} (\log W) \text{poly}(n, m)\right) \therefore \text{Weakly poly.}$$

## \* Polynomial Time approximation Scheme (PTAS)



\* As  $\epsilon \uparrow$ , T.C.  $\downarrow$ , approx range  $\uparrow$

→ moving maxima to top of  $\Omega$  in  $\mathbb{R}$  dimension \*  
 doing  $\Omega$  to memory using  $\mathcal{O}(W \times M)$  space algo  
 moving and shifting maxima in  $\mathbb{R}$  to memory  
 avoid over flow problem need to both \*

