

Minimum Cost

Spanning

Tree

$G = (V, E)$: Undirected graph

Tree: $T = (V', E')$; $V' = V$; $|E'| = |V| - 1$



induced by the graph G

T has no cycles

$T - e + e'$ is also a Tree

\downarrow
 $e \in E'$ $e' \in E$

Vertex Set partition in a Graph:

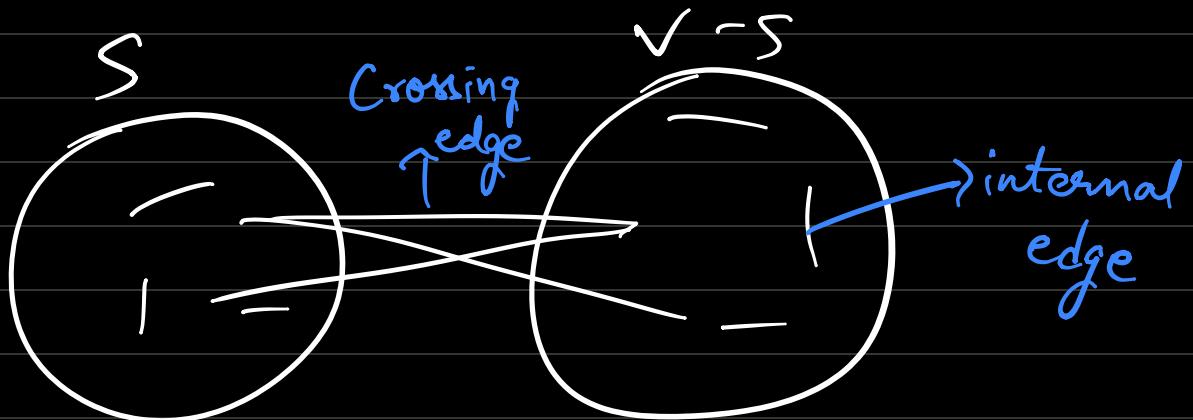
$(S, V-S)$ is a partition and

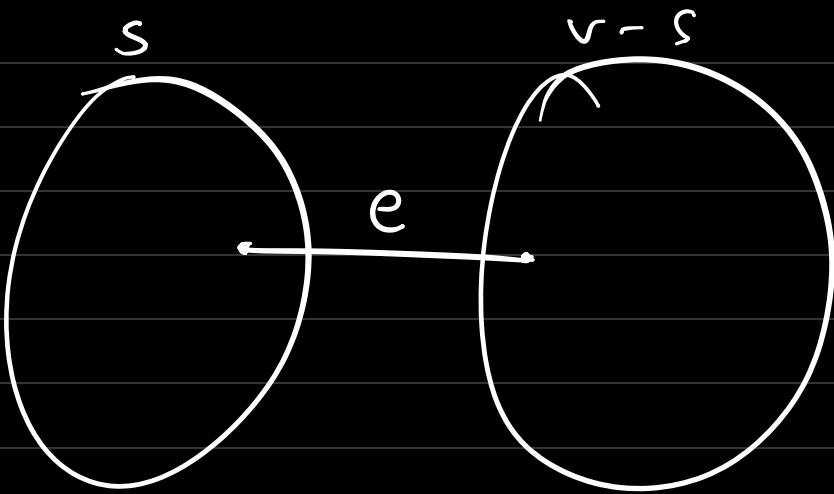
Internal edge $\Rightarrow (u, v)$ and u and v , both belong to exactly one of the partitions

Crossing edge $\Rightarrow (u, v)$ and $u \in S$ and $v \in V-S$ (or)

$u \in V-S$ and $v \in S$

Let $A \subseteq E$. We say a cut $(S, V-S)$ is respecting A iff all the edges in A are internal w.r.t the cut, $(S, V-S)$.





Let e be a crossing edge and e be of minimum weight among the crossing edges existing w.r.t cut $(S, V-S)$.

$\Rightarrow A \cup \{e\} \subseteq \text{some Spanning Tree}$

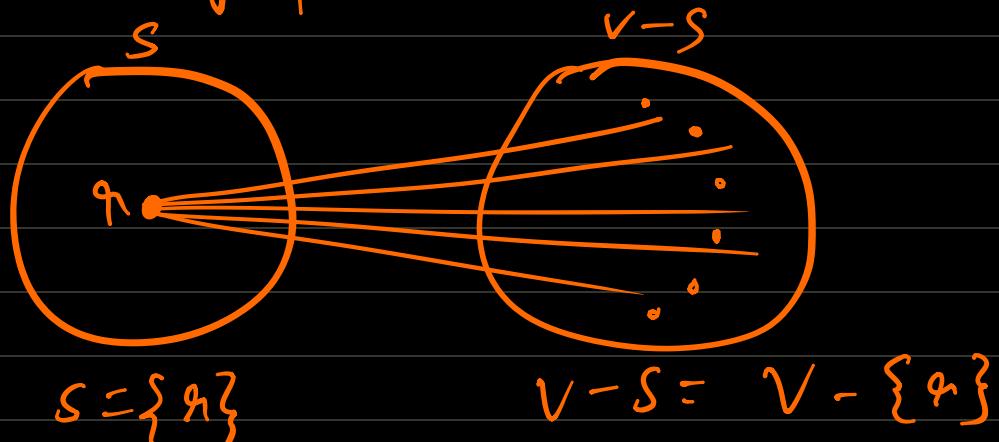
$A \subseteq \text{some Spanning Tree}$

e is a min. weight crossing edge of a cut respecting A .

Then, $A \cup \{e\} \subseteq \text{some Spanning Tree}$

$A = \emptyset$ (initialization)

So, initially, the cut can have any vertex in the graph in the vertex set S .



Look at the adjList (q_1) and get the minimum edge weight

min. Cost Crossing edge is an edge (v, w)
 Such that
 $\omega(v, w) \leq \omega(v, x) \quad \forall x \in \text{adjList}(v)$

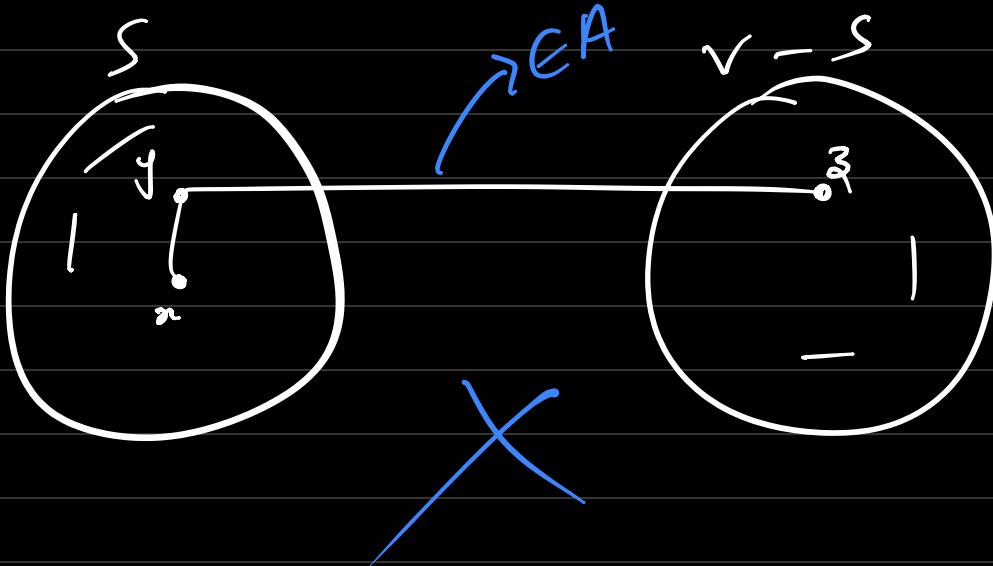
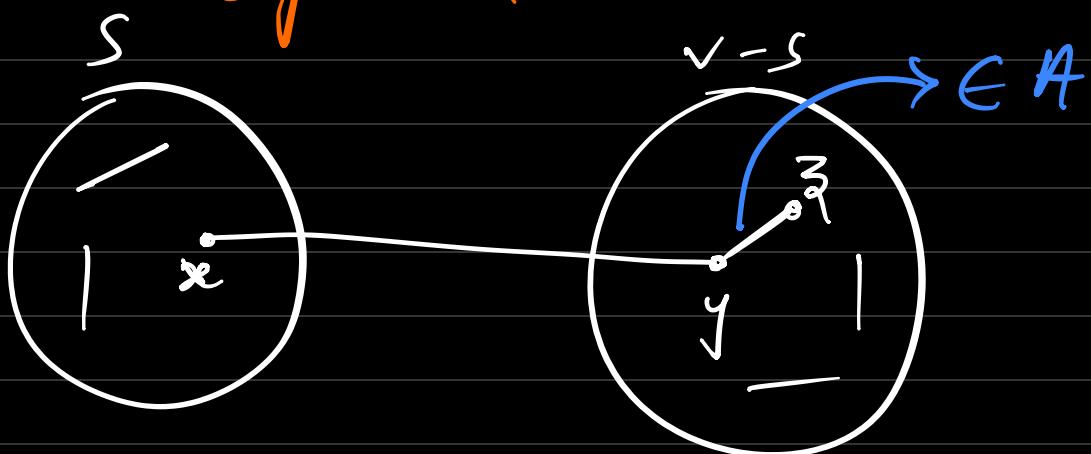
$$\text{Update : } A \leftarrow A \cup \{(v, w)\} = \emptyset \cup \{(v, w)\}$$

$$= \{(v, w)\}$$

$$\text{Move : } S \leftarrow S \cup \{w\}$$

$$V - S \leftarrow V - S$$

* an internal edge will become a crossing edge when we move v to S .



Idea: make sure that no edge in A is in $V - S$.

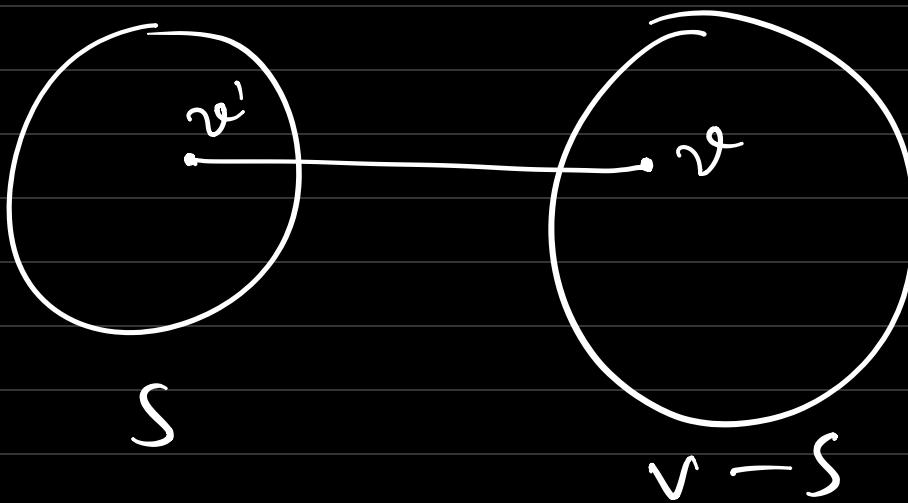
i.e., we maintain all edges of A as internal to S .

Development of Prim's Algorithm:

$$\frac{S}{\{v_i\}} \quad | \quad \frac{V-S}{V-\{v_i\}}$$

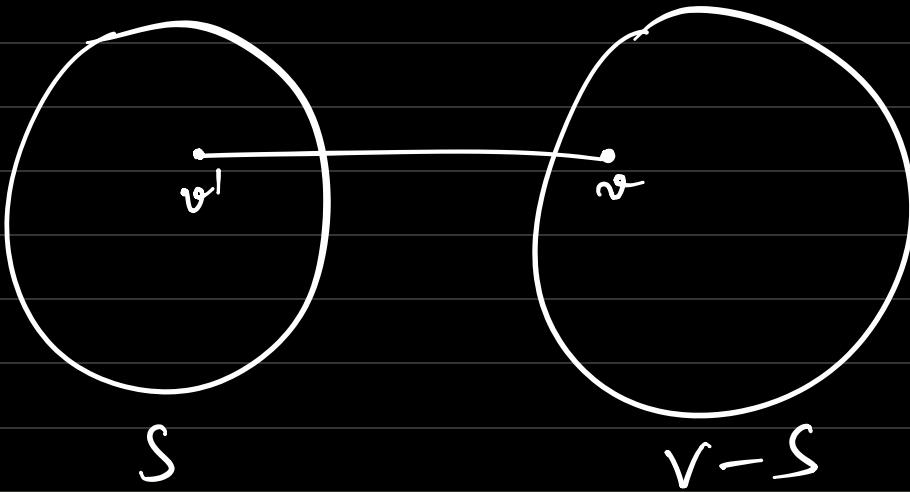
* for every $v \in V-S$, we maintain a minimum weight crossing edge (v, v') such that $v' \in S$.

Then, the overall min. weight crossing edge can be identified by only looking at the type of edges (v, v') & $v \in V-S$.



\Rightarrow By examining only $|V-S|$ edges, we identify the minimum crossing edge

$\therefore |V-S| \leq n-1$, this is a significant improvement.



(v, v') : min. weight crossing edge
incident on v .

$\Rightarrow \omega(v, v') \leq \omega(v, u) \quad \forall u \in S$
i.e., \nexists crossing edges (v, u)

$v' = p(v)$ (partner of v)

$c(v) = \omega(v, p(v))$

\therefore for each $v \in V - S$, we maintain
 $p(v)$ and $c(v)$ ' arrays.

Let $v \in V - S$ such that

$c(v) \leq c(u) \quad \forall u \in V - S$

Then, clearly $(v, p(v'))$ is the min-wt.
crossing edge.

Hence, add $(v, p(v))$ to A
move v to S and
values must be updated $p(u), c(u)$
 $\forall u \in V - S$

$p(u)$ is updated only if $\exists (v, u) \in E$
and $w(v, u) < w(u, p(u))$
 $p(u) \leftarrow v.$

High Level pseudocode

$$A = \emptyset$$
$$V-S = V - \{q\}$$

For all $v \in V$,
 $p(v) = \text{NULL}$,
 $c(v) = \infty$

For each $u \in V-S$
if $(q, u) \in E$
 $p(u) = q$;
 $c(u) = w(q, u)$;

while ($V-S \neq \emptyset$)

Find a vertex $v \in V-S$
with minimum $c(v)$

move v to S and add $(v, p(v))$ to A

Update $c(u)$ and $p(u)$ if $u \in V-S$

}

Detailed Pseudocode for Prim's MST

$\{ \text{primMST}((V, E)) \}$

undirected

Algorithm

graph, remember!

$S = \emptyset$

$p(v) = \text{NULL}$ $\forall v \in V$

$c_p(v) = \infty$ $\forall v \in V$

$S = \{x\}$

For all $u \in V - S$

{

if $(u, v) \in E$

$p(u) = v$

$c_p(u) = \omega(u, v)$

}

while ($V - S \neq \emptyset$)

{

1) Find $v \in V - S$ such that

$c(v) \leq c(u) \quad \forall u \in V - S$

2) move v to S

3) For each $u \in V - S$

if $(u, v) \in E$ & $\omega(u, v) < c(u)$

$p(u) = v$

$c_p(u) = \omega(u, v)$

}

return $p(v)$

{

|| $T = (V, A)$ is an MST
 || $A = \{(u, p(v)), v \in V - \{x\}\}$

Kruskal's Algorithm for MST

Kruskal's Algorithm:

→ Greedy algorithm.

- only select those edges which contribute to the final MST at any time-step in the algorithm.

→ Rejection Rule:

we reject an edge $e \in E$
if it forms a cycle at any point in the algorithm

Outline

|| $G = (V, E)$: Connected, weighted, undirected graph

|| $T = (V, A)$: Output MST, a tree with $n-1$ edges.

|| A : Set of edges selected by the algorithm.

|| L : List of sorted edges according to their edge weights in non-decreasing order.

1. $A = \emptyset$; $e = \text{first edge of } L$

2. while ($\text{NOT end}(L)$)

2.1. if (e does not form a cycle with
any subset of edges in A)

$$A \leftarrow A \cup \{e\}$$

2.2. $e = \text{next}(e, L)$

A : acyclic, connected graph

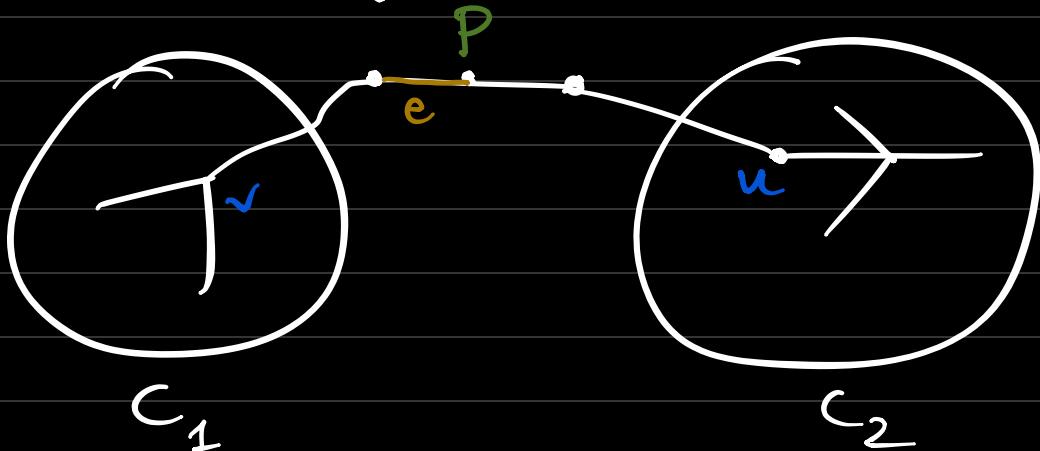
Proving the Correctness of Kruskal's Algorithm for
MST:

$T = (V, A)$ is a Tree

To prove: ① set of edges in A form a tree
② The graph induced by A is Connected.

P : a path in G connecting 2 diff. vertices belonging to 2 diff. components

e : an edge in P ; $e \notin A$



- * Not all edges in P are in A . Otherwise, C_1 and C_2 won't be 2 diff. Components.
- * Let $e \in P$ be the 1st edge that is not in A
- * This will not form a cycle with any set of edges in A .
- * If it forms, it would define a path to a vertex outside this component
- * $e \notin A$ is a **Contradiction** because when e was examined by the algorithm, e would have been included in A .

Thus, A induces a connected acyclic graph and this means A forms a tree.

Thus, A contains exactly $(n - 1)$ edges, where $n = |V|$

\therefore We've shown T is a Tree.

Let $\alpha_1 < \alpha_2 < \dots < \alpha_{n-1}$ $\forall \alpha_i \in A$ & $1 \leq i \leq n-1$

$\forall e_1, e_2 \in E$, $w(e_1) \neq w(e_2)$

\downarrow
all edge weights are distinct

\downarrow
edge in A
 \downarrow
set of edges in the final MST produced by Kruskal's algorithm.

If T is not a MST (let T' be a MST with $\omega(T') < \omega(T)$)

and let $y_1 < y_2 < \dots < y_{n-1} \forall y_i \in$

algorithm's: $x_1 < x_2 < \dots < x_j < x_{j+1} < \dots < x_{n-1}$
 $y_1 < y_2 < \dots < y_j < y_{j+1} < \dots < y_{n-1}$

j : first index in $1, 2, \dots, n-1$ such that $x_j \neq y_j$

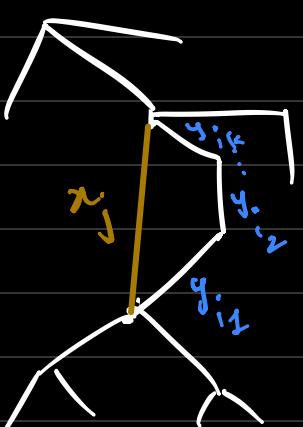
$\forall i < j, x_i = y_i$

Thus, we have $\omega(x_j) < \omega(y_j)$
($\because x_j$ was chosen greedily by the algorithm)

T'' be a spanning tree cheaper than T' that we try to construct.

$\langle y_{i_1}, y_{i_2}, \dots, y_{i_k} \rangle$: a path in T'
after we add x_j to T'

This is a unique cycle C



$x_j + T'$: cycle C

If $\langle y_{i_1}, y_{i_2}, \dots, y_{i_k} \rangle \subseteq \{y_1, y_2, \dots, y_{j-1}\}$

then $y_{i_1} = x_{i_1}, y_{i_2} = x_{i_2}, \dots, y_{i_k} = x_{i_k}$

because $\langle y_1, \dots, y_{j-1} \rangle = \langle x_1, \dots, x_{j-1} \rangle$

Thus, $x_j, x_{i_1}, x_{i_2}, \dots, x_{i_k}$ would form the cycle C .

This is impossible as $x_j, x_{i_1}, x_{i_2}, \dots, x_{i_k}$ are all edges of T and T is a tree.

Hence, the path $\langle y_{i_1}, y_{i_2}, \dots, y_{i_k} \rangle$ must contain an edge outside $\{y_1, y_2, \dots, y_{j-1}\}$

That means the path has an edge y_t of T' where $t \geq j$

NOTE: $\omega(y_t) \geq \omega(y_j) > \omega(x_j)$

Now, we define $T'' = T' + x_j - y_t$
 T'' is now a tree, since the cycle is broken by removing y_t

$$\begin{aligned} \Rightarrow \omega(T'') &= \omega(T' + x_j - y_t) \\ &= \omega(T') + \omega(x_j) - \omega(y_t) \\ &< \omega(T') \end{aligned}$$

This contradicts the minimality of T'
Thus, a spanning tree with cost lesser than the cost of the spanning tree produced by Kruskal's algorithm cannot exist.

NOTE: Here, we're talking about the cost of the MST, and not the MST produced. There can be multiple MSTs & STs with the same total cost.

Key Question: How will you determine if e will entail a cycle?

Reframe the question:

$$e = (x, y)$$

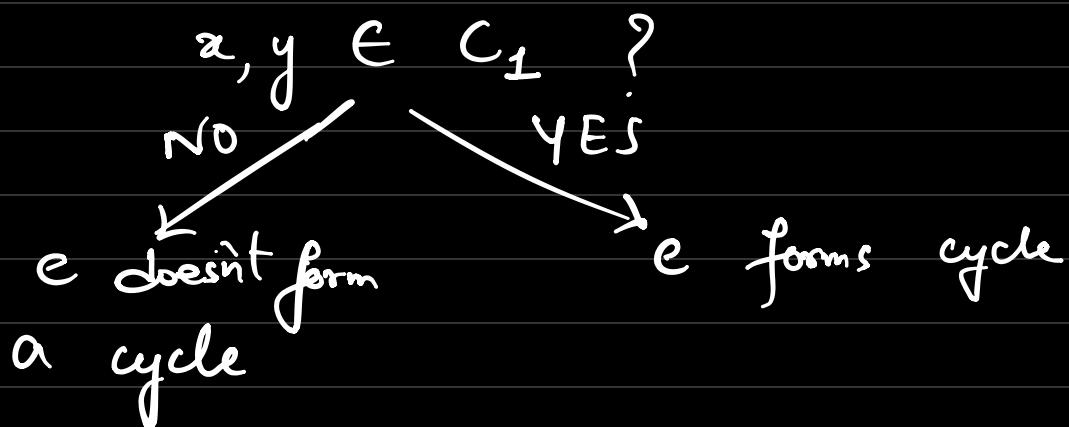
Current edge set of T ,
↑ the MST

Check if \exists path (x, y) in (V, A)

This will answer our predicate of e forming a cycle in (V, A) or not.

Connected Component:

Check if x, y belong to the same component of T .



Find(x): Returns the name of the connected component in T that contains x .

Let $e = (x, y)$
if $\text{Find}(x) \neq \text{Find}(y)$
add e to A

else

ignore e

* Adding a new edge $e = (x, y)$ to A will change the components in T:

components will reduce by 1 always when a new edge is added to A.

This operation is Union(X, Y).

↓
merges the connected Components X and Y of T into a new connected component. The connected Components X & Y are automatically removed.

Initialize:

$$A = \emptyset$$

$e =$ First edge in L

initialize the names of the connected components of $T = (V, A)$

Process:

while (NOT END of L)

{ let $e = (x, y)$

$x = \text{Find}(x)$

$y = \text{Find}(y)$

if ($X \neq Y$)

$A \leftarrow A \cup \{e\}$

Union(X, Y)

$e = \text{next}(e, L)$

Output:

$$\overrightarrow{T} = (V, A)$$



a MST of G

Now, we have to define the functions $\text{Find}()$ and $\text{Union}()$.

Detour: Graph Theory

Connected Component of a graph G_1 is a maximally connected sub-graph of G_1 .

G_1' : maximally connected sub-graph of G_1

$\Leftrightarrow G_1' + e$ is not maximally connected for any new edge e in G_1 and not in e' .

Acyclic \Leftrightarrow no cycles

Forest = collection of trees

Connected
acyclic
graphs

Forest = Acyclic graph

* Relation maximally connected forms a partition on V and the relation is an equivalence relation.

Partition ADT

$V = \{1, 2, 3, \dots, n\} \quad n \geq 1$
↓
finite set of vertices

K -partition of V : Collection of K subsets of V

S_1, S_2, \dots, S_K such that

mutually exclusive $\rightarrow S_i \cap S_j \neq \emptyset, i \neq j$

$\bigcup_{i=1}^K S_i = V \rightarrow$ mutually exhaustive

n -partition of V :

$\{\{1\}, \{2\}, \dots, \{n\}\}$: all singletons of V .

Name of a set: Identifier of a set

\because any vertex in V can only be in one of the partitions, we can use any element of the set to serve as an identifier of the set in a partition.

Name Array Representation

* Implementation of Find(), Union() on a partition

E.g.:

$\{1, 2, 4, 7\}$, $\{3, 8, 10\}$, $\{5, 6, 9, 11\}$, $\{12, 14\}$, $\{13\}$

Name:

1

3

5

12

13

$$\text{Name}[1] = 1$$

$$\text{Name}[2] = 1$$

...

$$\text{Name}[3] = 3$$

$$\text{Name}[8] = 3$$

$$\text{Name}[13] = 13$$

$$\text{Name}[14] = 12$$

$\text{Name}[x]$: name of the set containing x .

Defining Union() , Find() operations

$O(1)$ $\{$ **Find(x) :**
 return $Name[x]$;
Union(x, y) :
 // w.l.o.g assume $x < y$
 for i in range ($1, \dots, n$) :
 if ($Name[i] = y$)
 $Name[i] = x$

$\} O(n)$

$Name[n]$: an array that stores the name of each vertex in V
 $n = |V|$

Inverted Forest data structure

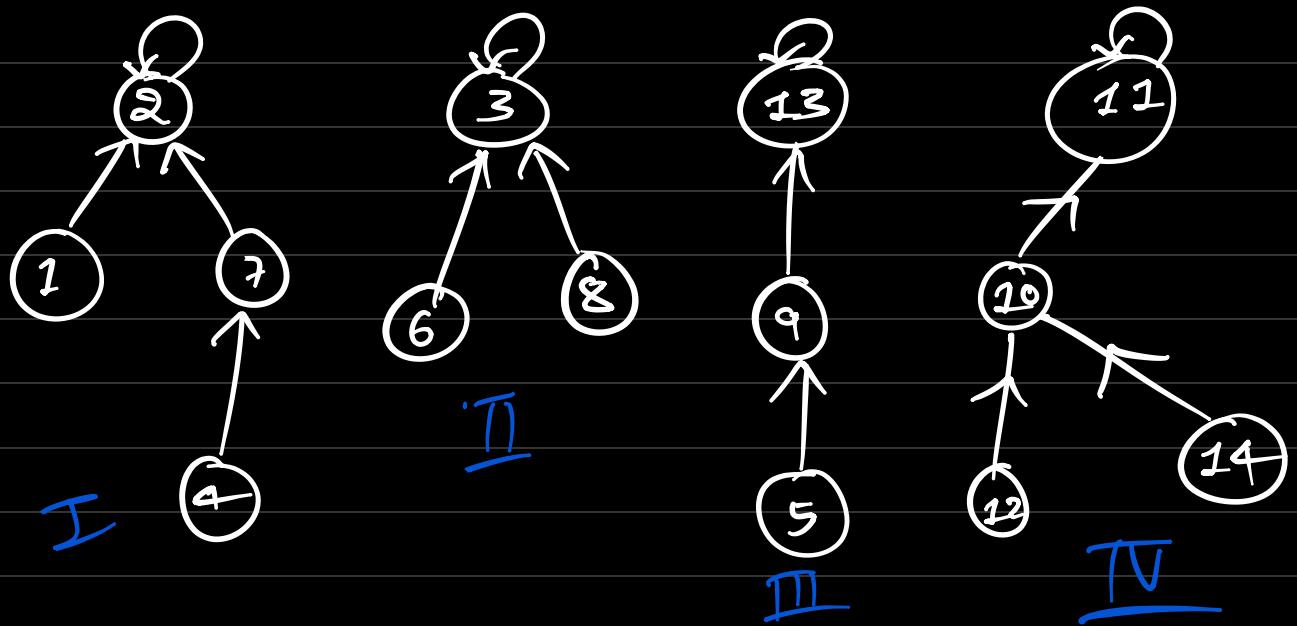
In-tree : directed rooted tree where each edge is oriented toward the root

Self-loop for the root

In-forest : collection of in-trees

A k -partition can be represented as an inforest of k in-trees.

$\text{root(Tree)} = \text{Name of the corresponding set.}$

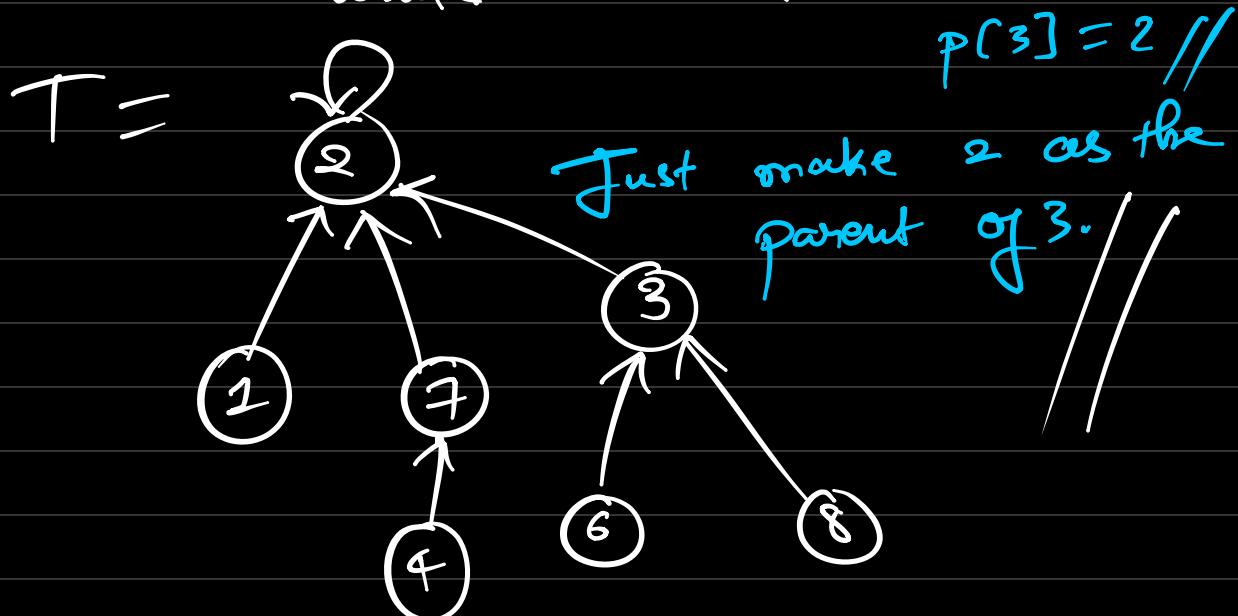


Tree Hooking

Tree hooking \equiv Union

$T = \text{Tree hook } (I, II)$

then T would look like



* Find (α) is done through ancestor
chasing

Find(x)

// "ancestor chasing"
// returns the name of the set containing x .
// i.e., return the value at the root
// of the tree containing x .

$y = p(x)$ // parent of x

while ($y \neq p(y)$)
 $y = p(y)$

return $p(y)$

Worst case

} $O(n)$

* Efficient Implementation of tree hooking would be hooking the smaller tree to the larger tree, so that the larger tree won't become any larger.

measure : height of the tree



no. of edges in
the longest path
from root to the
leaf.

Union Algorithm

Union (A, B) :

if ($\text{size}(A) \leq \text{size}(B)$)

$p(A) = B$

$\text{size}(B) = \text{size}(B) + \text{size}(A)$

else :

$p(B) = A$

$\text{size}(A) = \text{size}(A) + \text{size}(B)$

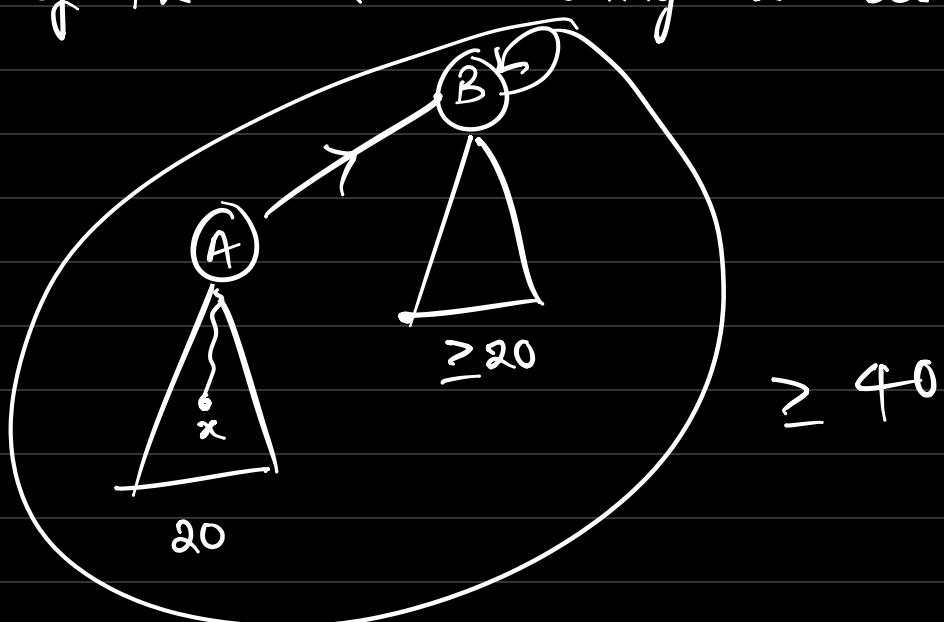
hook smaller tree to the larger tree

Time Complexity:

Find () : $O(\log n)$

Union () : $O(1)$

* For every increase in depth of x by 1, size of the set containing x at least **Doubles**.



So x goes into a set of sizes $1, \geq 2, \geq 4, \geq 8, \dots$

Thus $\text{find}() = O(\log n)$ Doubling

Pseudocode of Kruskal's Algorithm

$$|V| = n ; |E| = m$$

Sorted $\Rightarrow O(m \log m)$

Initialize:

$$A = \emptyset$$

$e = \text{1st edge of } L$

Initialize the names of the connected components of $T = (V, A)$

Sorted \Rightarrow

Process:

while (NOT END of L):

let $e = (x, y)$

$\begin{cases} x = \text{Find}(x) \\ y = \text{Find}(y) \end{cases}$

if $x \neq y$)

$A \leftarrow A \cup \{e\}$

$2m$
find()
operations

$(n-1)\text{union}()$
operations

$e = \text{next}(e, L)$

Output:

$T = (V, A)$

// T is a MST graph

Total time Complexity:

time complexity of building L + $O(m \log m)$

$2m$ Find() + total # edges in the input graph

$(n-1)$ union()

n -Forest
solution

$$T(n, m) = O(m \log m) + 2m \log n + (n-1)n$$

$$T(n, m) = O(m \log n) + 2m + (n-1)n$$

$$= O(m \log n + m + n^2)$$

Name-
Array
implementation

$$T(n, m) = O(m \log n + n^2)$$

Name - Array vs In - Forest

	Name - Array	In - Forest
Find()	$O(1)$	$O(\log n)$
Union()	$O(n)$	$O(1)$
$T(n, m)$	$O(m \log m) + 2m O(1)$ ✓ $+ n O(n)$ $= O(m \log m + 2m + n^2)$ $= O(m \log m + n^2 + m)$	$O(m \log m) + 2m O(\log n)$ ✓ $+ (n-1) O(1)$ $= O(m \log m + 2m \log n + n-1)$ $= O(m \log m + m \log n + n)$

If $m \log m$ is ignored, as a pre-processing cost,

$$\text{Name - Array} \rightarrow O(n^2 + m)$$

$$\text{In - Forest} \rightarrow O(m \log n)$$

Which is better?

Depends on the sparsity of the input graph,

Dense Graph $\Rightarrow m = O(n^2) \Rightarrow$ Name - array is preferred

Sparse Graph $\Rightarrow m = O(n) \Rightarrow$ In - forest is preferred

\therefore Name - array based implementation \rightarrow Dense Graphs
 In - forest based implementation \rightarrow Sparse Graphs