

• Degree seq, Characterization, Recursive Algorithm

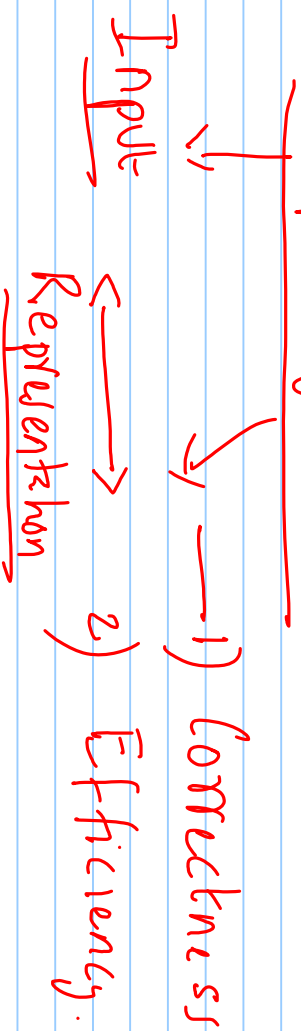
• Graph, Count the # of spanning trees, L , M , M_{11} ,

= $\det(M_{11})$, Gaussian Elimination Algorithm for
determinant - $\mathcal{O}(n^3)$

Direct Algorithm - $\mathcal{O}(n!)$

• The same problems must can be solved in unit time.

Day 3 - Graph Algorithms



- Accessing the i th element in list: Get(L, i) ✓

Arguments \approx Domain

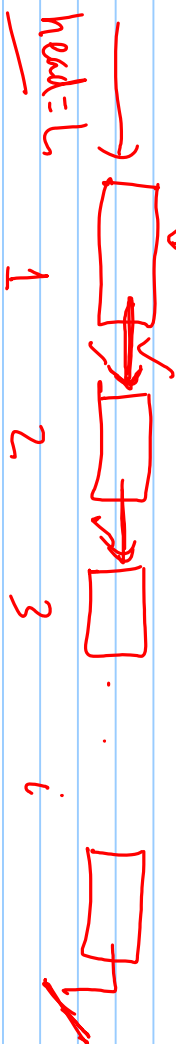
Return Value \approx Range.

Function

Return - Value \rightarrow Range of the function.

LIST X INTEGER

get(L, i) Takes i units of time to return the value ✓ $O(i)$ time



One unit of time for a List is one pointer traversal
↳ find address ✓
↳ Check Value in Address ✓

get(L, i)

* L is an Array ✓
is a Vector each data
item has an index L[i] ✓

$$\text{Address}(L(i)) = \text{Address}(L(0)) + i \text{ (units)} ✓$$

Takes 1 unit of time $O(1)$ time

Sort(A) in time $|A| \log_2 |A| \rightarrow$ Comparison

Dequeue (Queue Q) \rightarrow Element at the head of the queue.

$O(1)$ time

FIFO data

Enqueue (Q) $\rightarrow O(1)$

Store
structure

pop (stack S) \rightarrow top of the stack.

$O(1)$ time

push (stack S) \rightarrow adds to the top.

If you want to check if an element is present, do not
Use stack or queue

Graphs require Non-linear Storage (Visualization or in reality)

Linear means - For each element well defined Pred, Succ.

$$\text{Verbes} \quad h = (V, E)$$

$$\text{Storage} - O(n^2)$$

$$O(nm)$$

$$\text{Edges} \quad \text{Adjacency Matrix} \quad |V| \times |V|$$

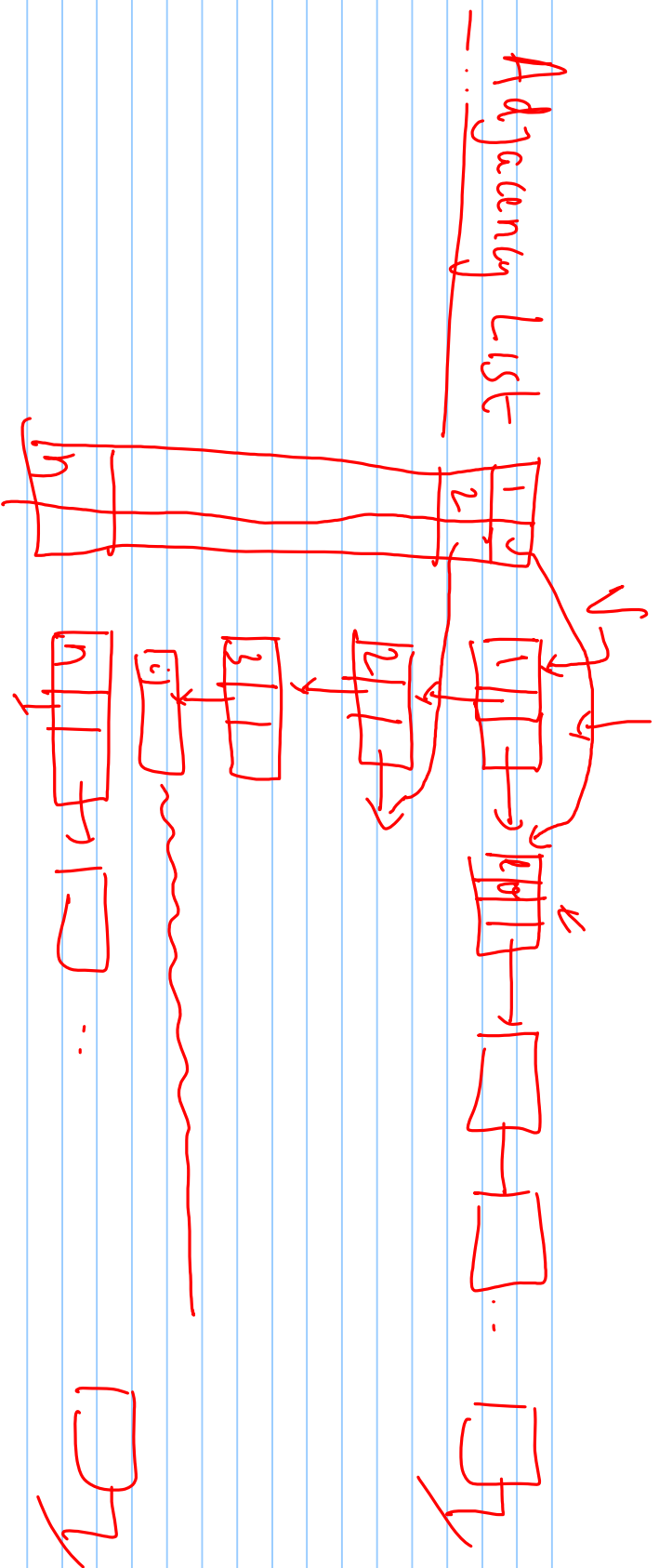
$$A[i, j]$$

$$\text{EX}$$
 Write a formula for the address of $A[i, j]$.

Incidence matrix - $|V| \times |E|$

can be computed in $O(1)$ time.

- 1) Adj. queries in $O(1)$ time.
 - or Incidence $IsAdj(i, j)$ $IsInc(i, e)$
 - 2) $IsConn(i, j)$??



$$I_{\text{array}}(i, j) = O(d_i) \text{ units of time}$$

↘ degree of i

$$I_{\text{sum}}(i, e)$$

Graph Search \rightarrow Transitive Closure of the edge relation.

K-call $G = (V, E)$ $\xrightarrow{\text{or}} \underline{E} \subseteq V \times V \leftarrow$ Directed graph, Self Loops, no parallel edges

Undirected, no self-loops,
no parallel edges

Symmetric

$E, E^* = \{ (i, j) \mid \text{there is a } k \text{ for which } (i, k) \text{ is in } \underline{E} \text{ and } (k, j) \text{ is in } E^* \}$

$\cup \{ (i, i) \mid i \text{ is in } V \}$ Reflexive Transitive Closure



Input $n, i, j \in V$ ✓

Question Does there exist a path from i to j in G ?
Is i connected to j in V ?

Connectivity Problem

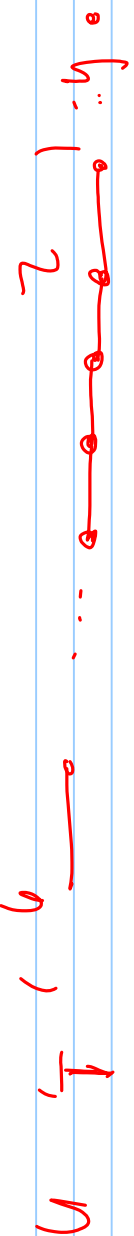
Compute from Adj matrix A , A^n using
boolean \wedge for $*$, boolean \vee for $+$
Check $(A^n)_{ij}$.

Thm There is a i - j path $\iff (A^n)_{ij} = 1$

Running Time
 n^2 inner products ✓
 n^3 multiplication ✓
 n matrix products A^2, A^3, \dots, A^n
Total n^4 multiplications $n^3 \cdot n$
 $O(n^4)$ time
 $A, A^2, A^4, A^8, A^{16}, \dots, A^{2^r}$
 $\underbrace{O(n^{2^r})}_{O(n^{2 \log n})}$

• Can we do better?

• Computing connectivity between all pairs?



Starting with Adjacency matrix - A^n is unavoidable

• Research Issues: How fast can matrix multiplication be done? n^3

Strassen's Algorithm: $n^{2.81}$ multiplications

$$\underline{n^{2.37}} \quad O(\underline{n^2})$$

Adjacency List Representation

Breadth-First Search (n, i, j) $i \rightarrow j$

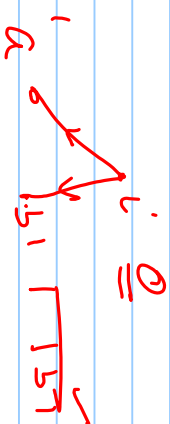
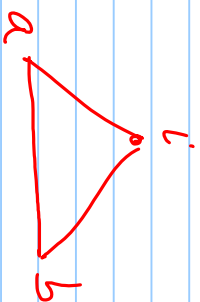
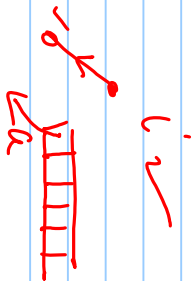
1) Level(i) \rightarrow Initialize all level values to -1 $O(n)$

2) Parent(i) \rightarrow Initialize all parents to undef $O(n)$

a) Level(i) = 0 ; Parent(i) = undef

b) Insert $N(i)$ into a queue. Q .

Iterate: Dequeue: Give Parents of undef, update level info
 Enqueue Neighbors which are not in the queue.



$$\text{Level}(\text{vertex}) = \text{Level}(\text{parent}) + 1$$

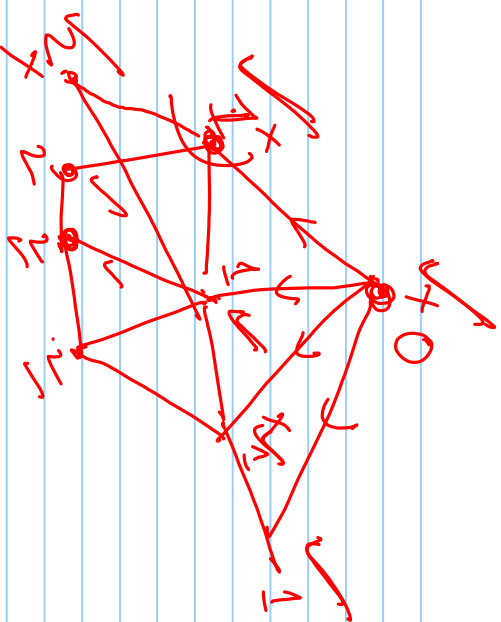
Parent of a vertex = (First time) it is the neighbour of a "visited" vertex.

- Level is given to a vertex when it is visited for the first time. (When they are inserted into Q)

- The vertex from which it is visited is called the parent.

- A vertex discovered never gets considered again. [crucial for termination/Hzkly]

- Each edge is inspected exactly 2 times [2. # of edges + # of vertices]



Linear in Input rep.

$n+m$

Breadth First Search

main()

{ Visited[1..n] ← 0 ✓ Queue Q ← Empty.

Parent[1..n] ← 0

Level[1..n] ← -1

BFS(v) { Insert * v }

{ Visited(v) = 1, Level(v) = 0, Enqueue(Q, v).

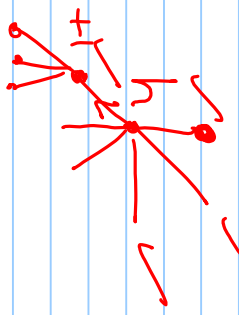
While (Q is not Empty)

{ h = dequeue(Q) ✓

For each u in Adj[h] ✓

{ if (Visited[u] = 0) { Visited(u) = 1, Level(u) = Level(h) + 1, Parent(u) = h, Enqueue(Q, u) }

/* At the end of this loop, h & all its Nbrs are visited, have a level, and a parent, & h has 1st the Q */.

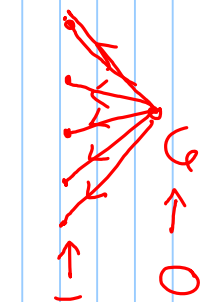


1) If BFS(u) is invoked and if u has a path from U , then on termination

a) $\text{Level}(u) = \text{length of shortest Path (Min \# of edges) from } U$

b) $\text{Visited}(u) = 1$.

c) $\text{Parent}(u)$ is the penultimate vertex on the shortest path from U .
maintains by the algorithm



Each of these has been inserted into the Q , after level, visited, & parent were assigned



• On termination Q is empty.
• These values do not change.

2) Termination: The Queue Q has vertices inserted in non-decreasing order of level number.

Each vertex is inserted into the Q exactly 1
At the beginning a vertex is removed. . . After $\leq \text{max level \# of vertices}$ $Q = \emptyset$.

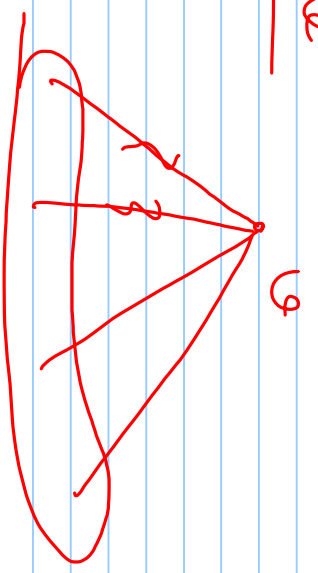
Time: Each vertex, visited, parent, level is updated ≈ 2 times (initialization, one in the while loop)

These are in arrays \rightarrow imple is accessed in $O(1)$ time

Total time is $O(\# \text{ of vertices reachable from } v)$

Each edge in the adj. list is accessed either 0 times or 2 times.

2. # of edges incident on vertices reachable from v



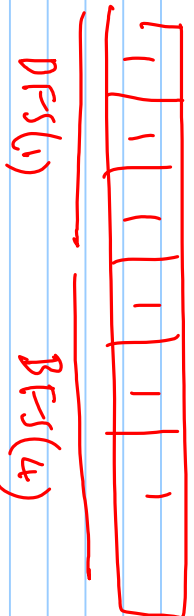
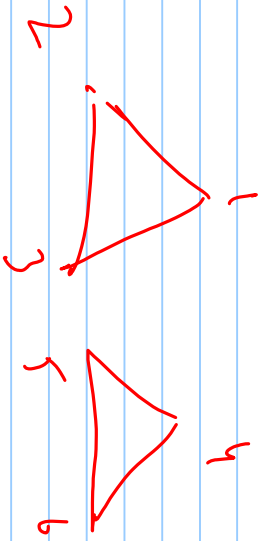
(# of vertices $\times n$ +

2. total # of edges)

```

- Main code
  * For (each vertex)  $v$ 
    { If (visited  $[v] = 0$ ) BFS ( $v$ )
    }
  This also terminates
  
```

- If each vertex is reachable from v , there is exactly 1 BFS call
- # of BFS = # of connected components for undirected graphs.



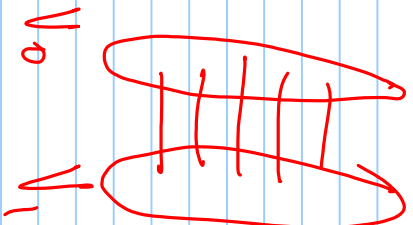
Proposition: Consider the edges E^k of $(\text{parent}(u), u)$ / u in V^k . has $n-k$ edges
 k is the # of connected components

- F is an acyclic set of edges Level $(u) = \text{level}(\text{parent}(u)) + 1$
- If $k=1$, F is called a BFS spanning tree / Forest ($k > 1$) has all "distance" info from the root v .

Colouring the Vertices with 2 colours O & 1

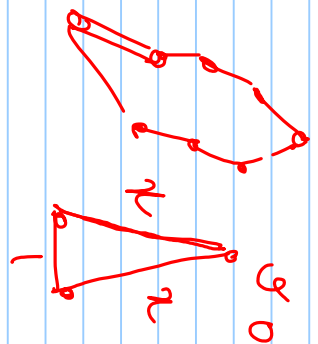
Inroduction
k
Algorithms
CLRS

- Possible If & only If
NO Odd cycle.



- Design an efficient Algorithm

BFS - colour (v) = 0 If level(v) is even
= 1 If level(v) is odd.



Repeat yes: If each edge is properly coloured ✓
No: otherwise.

$O(\# Edges + \# Vertices)$

Depth First Search

• Recursive specification, implementation.

• Visited [1...n] \leftarrow 0

Parent [1...n] \leftarrow -1

First [1...n] } Timestamps \leftarrow -1

Last [1...n] } \leftarrow -1

Depth [1...n] \leftarrow -1

Time = 0

For (each u)

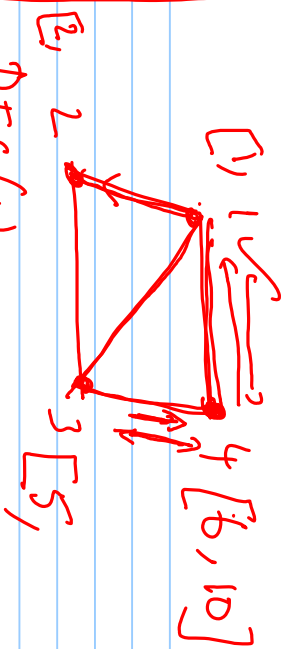
\rightarrow if (Visited [u] = 0) dfs(u)

✓

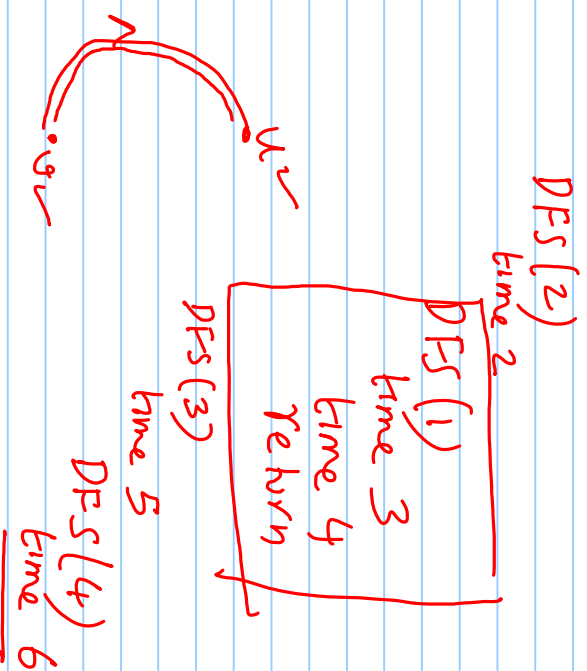
```

DFS (v)
{
  if (visited (v) = 0)
  {
    visited (v) = 1
    First (v) = time
    For (u in Adj (v))
      DFS (u)
    Last (v) = time; return;
  }
  else /* v is already visited */
  {
    time = time + 1;
    return;
  }
}

```



time 7
 time 8
 time 9
 time 10
 return



For $(u, \text{in } A, g(u))$

{ If $(\text{Visited}[u] = 0)$

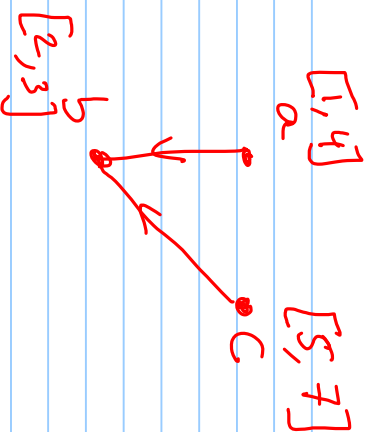
{ Parent[u] = 0

depth[u] = depth[v] + 1

DFS(u);

- 1) At the end of DFS, each vertex has at most one parent. If a vertex u does not have a parent, then $\text{depth}[u] = 0$.
- 2) The intervals $[F(u), L(u)]$ form a LAMINAR FAMILY.
 $u \neq v$, then either $[F(u), L(u)] \supset [F(v), L(v)]$ or $[F(v), L(v)] \supset [F(u), L(u)]$ or they are (i) Disjoint or (ii) strictly contained in the other.
- 3) If $[F(u), L(u)] \subset [F(v), L(v)]$ then v is an ancestor of u $\approx v, v_1, \dots, v_n, u$ is a path such that $P[u] = v$ or $P[v] = v_1, \dots, P[v_1] = v_2, \dots, P[v_2] = v_3, \dots, P[v_{n-1}] = v_n, P[v_n] = u$.

4) If $[l(u), r(u)], [l(v), r(v)]$ are disjoint then
they do not have a common ancestor X



- a) they have a common ancestor and there is no path from u to v
 or: the possible path
 or: u to ancestor (u) to v
 b) They don't have a common ancestor

5) Consider $Z = \{v \mid d[v] = 0\}$ ✓

Consider $C(v) = \{u \mid u \text{ is a descendant of } v\}$.

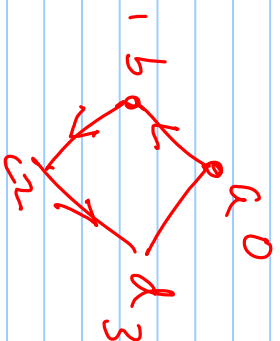
For each $v \in Z$

a) $C(u) \cap C(v) = \underline{\phi}$ for $u \neq v \in Z$.

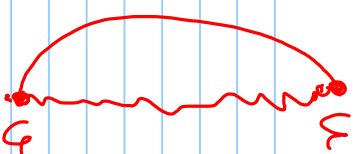
b) $[f[u], r[u]] \cap [f[v], r[v]] = \phi$ for $u \neq v \in Z$.

Classification of edges

a) (u, v) where $d[v] = d[u] + 1$ are called TREE ARCS
 $\forall p[v] = u$



b) If u, v are in the same $C(w)$ for $w \in Z$,
 \rightarrow ; v is a descendant of u and (v, u) is an edge Back Arc



(u, v) Back arc $\Rightarrow v$ is a descendant of u AND (u, v) is an edge

$v \rightarrow v_1 \rightarrow v_2 \dots v_r \rightarrow u \rightarrow v$

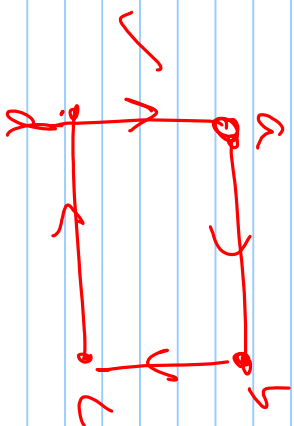
A CYCLE

If C is a cycle \Rightarrow one of the edges is a back arc

If u is a descendant of v

$\exists (v, u)$ is an edge, then

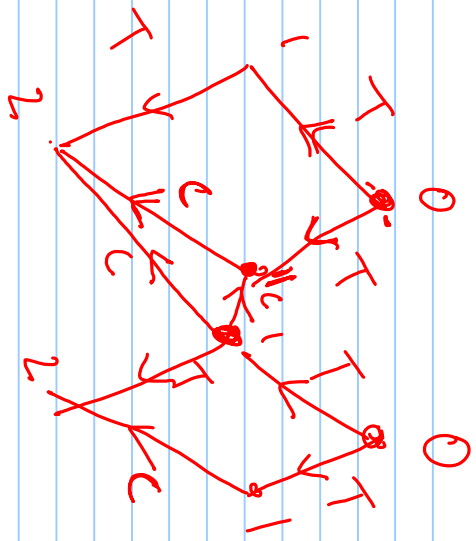
(v, u) is called a FORWARD ARC



Consider x in $C(u)$
an arc y in $C(v)$
 (x, y) is

Called a CROSS ARC

actually An edge which is not a
TA, BA, FA is called a CA



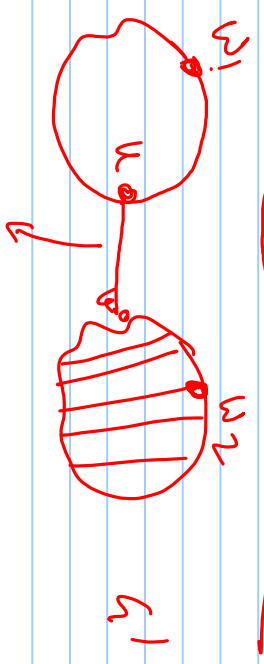
Undirected Graphs \rightarrow Only

- Does G have a bridge (removal disconnects)

(u, v) is a bridge \Leftrightarrow the graph $G_1 = (V, E \setminus \{(u, v)\})$ is

such that u and v

are in $C(w_1), C(w_2)$. $w_1 \neq w_2$



BRIDGE

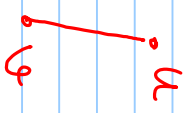
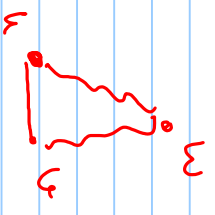
Tree arcs, Back Arcs
 Either the edge is visited from parent to child



(u, v) is a Back Arc

- When the edge is considered

the end point v is not a child of $u \Rightarrow v$ is an ancestor of u



are in $C(w)$ for some w
 $\therefore d(u) = 0$

Repeat for each edge $e = (u, v)$.

DFS (G after removing e , from u)

Check $[f(u), L(u)], [f(v), L(v)]$

If Disjoint e is a bridge.

Inefficient We do too many

DFS, 11 per edge.

So running time is

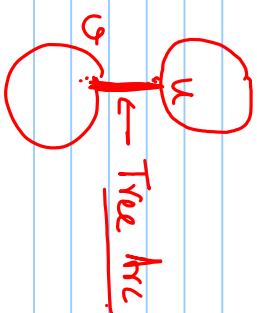
$\mathcal{O}(n^2)$ Time (DFS)



I don't know how to find all bridges using DFS on G .

If an edge is a bridge then

it is a tree edge



In any DFS

when bridge is

considered for

the first time, at u

the "other vertex"

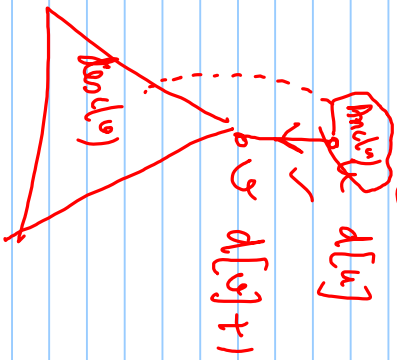
is visited for the

first time

\approx TREE EDGE

1) DFS

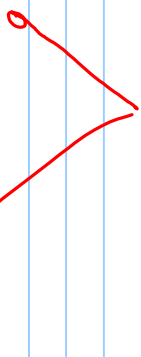
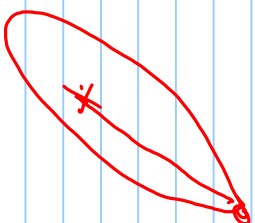
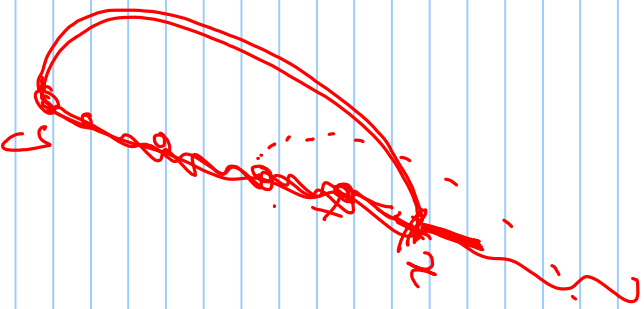
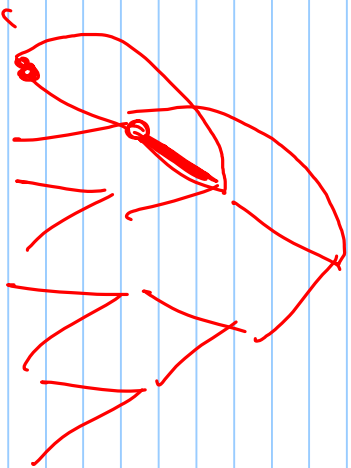
2) Consider each e as a tree Arc (u, v) e is Bridge \Leftrightarrow for



Check for an edge (u, v) where x is a descendant of v $\forall y$ an ancestor of u $\forall (y, v)$ a back Arc.

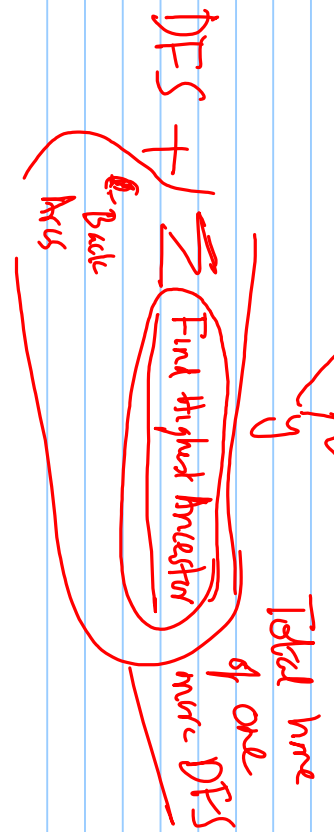
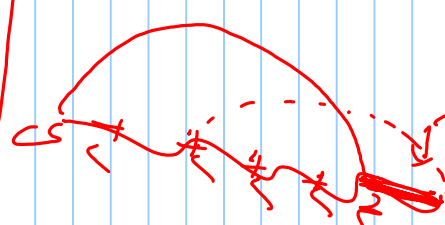
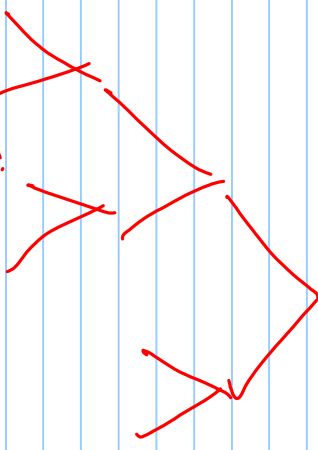
If none e is a bridge.

3) For each vertex v \rightarrow Track the back arc (v, u) : $d(v) - d(u)$ is the maximum \forall associate with $v \rightarrow d(v)$.



Track 1) For each v , the back arc to the highest ancestor / ancestor of least depth.

2) For each Back Arc - Check if one vertex has an ancestor



(y, z) is a Back Arc

consider the cycle Back Arc Tree

Compute $\min_{w} \text{Highest-ancestor}(w)$

If \overrightarrow{this} is lesser than $d[x, y]$ then

(parent(x), x) is not a bridge for any vertex in the cycle.

Because Parent (x) does not get disconnected from any vertex in the cycle by removal of (P(x), x).

DFS + $\sum_{\text{Back Arcs}} \text{Find highest ancestor}$

2 DFS

Time to update visited + $4 \cdot |E|$

$N + 4M$

CLRS



- 1) Parent info
- 2) Depth info
- 3) Interval Info

Computed by DFS

- Edge classification, TA, FA, BA, CA

under graphs TA, BA

- Addition information

- Highest back arc for each vertex ✓
- For each back arc ^(x,y) the highest ancestor for each vertex in the cycle formed by back arc.
 - If this is of lesser depth than
 - No bridge.