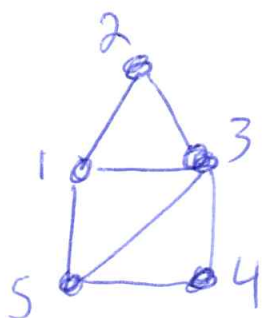


Graphs



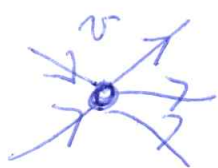
$$V = \{1, 2, 3, 4, 5\}$$

$$E = \{(1, 2), (1, 3), (1, 5), \dots\}$$

Directed
Graph

$$V = \{1, 2, 3\}$$

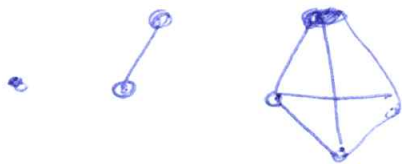
$$E = \{(1, 3), (1, 2), (2, 3), (3, 1)\}$$



$$\text{indegree}(v) = 2$$

$$\text{outdegree}(v) = 3$$

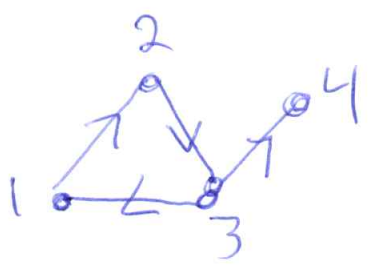
3 connected components



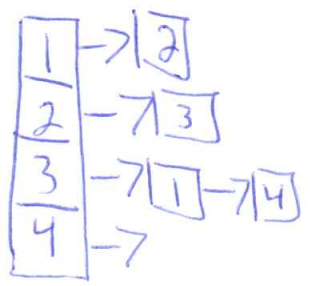
Adjacency Matrix

• if $(i, j) \in E \Rightarrow A[i, j] = A[j, i] = 1$

• undirected graph



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



Adj Matrix vs Adj Lists

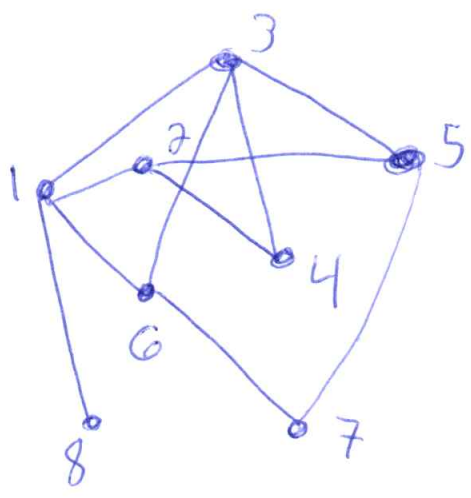
Space:	$O(n^2)$	$O(n+m)$
$(u,v) \in E?$	$O(1)$	$O(1 + \deg(u))$ <small>or $O(1 + \min\{d(u), d(v)\})$</small>
$A[u,v] = 1?$		

List v 's neighbours $\Theta(n)$ $\Theta(1 + \deg(v))$ *

List all edges $\Theta(n^2)$ $\Theta(n+m)$ *

* The algs we focus on will typically require * so we'll use adj lists.

BFS

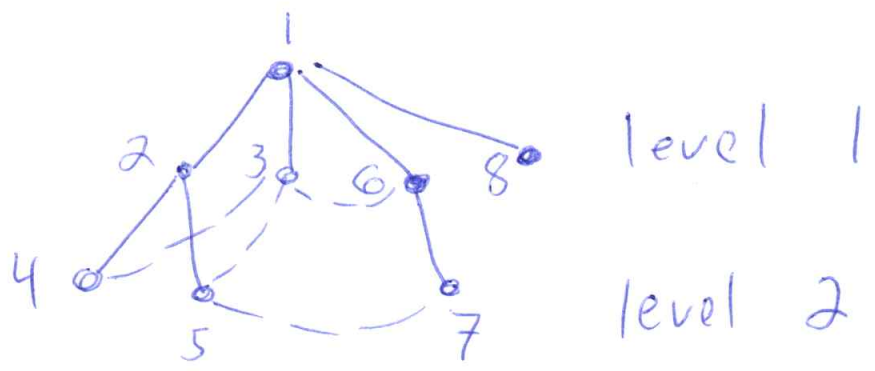


Order of discovery

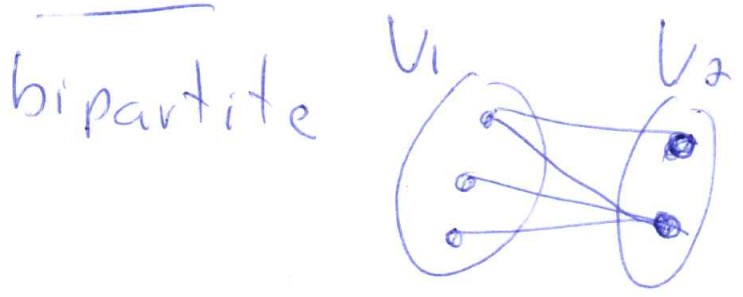
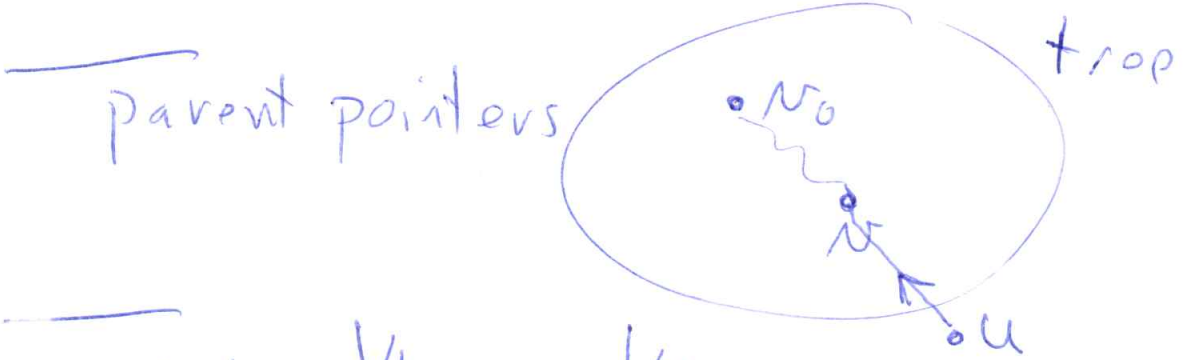
1, 2, 3, 6, 8, 4, 5, 7

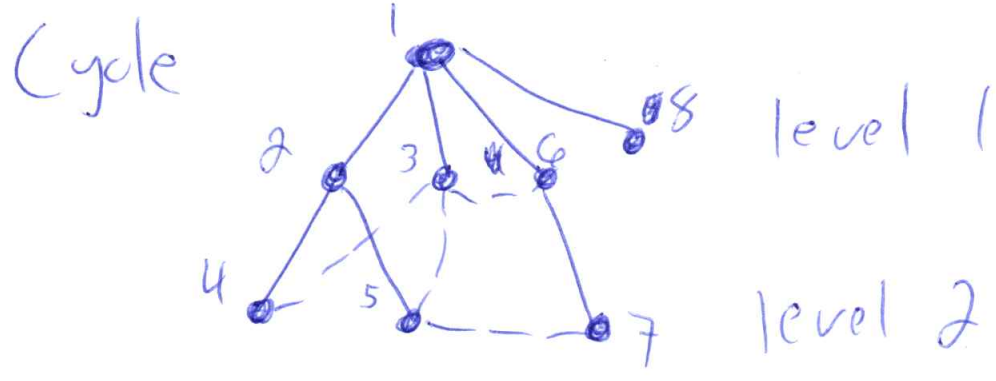
1's neighbours 2's 6's

BFS tree



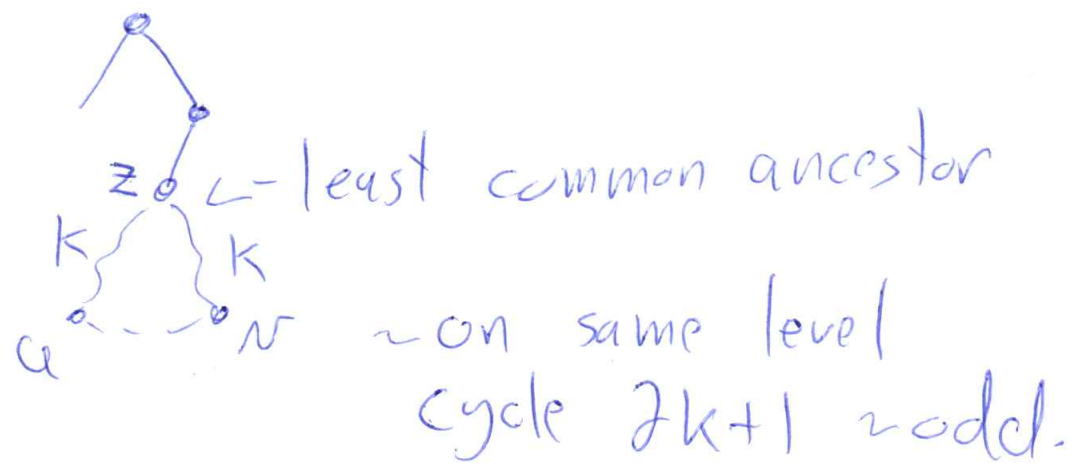
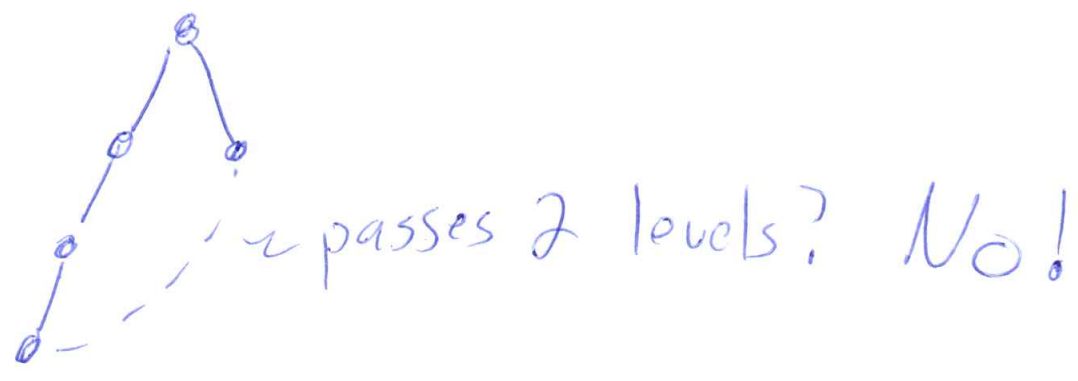
Use a queue to store vertices that have been discovered but must still be explored.



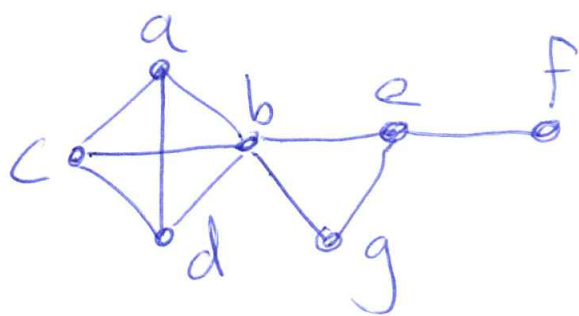


Discover 1 2 3 6 8 4 5
 from 3 check 4, 5, 6
 already discovered
 => cycles.

can we have



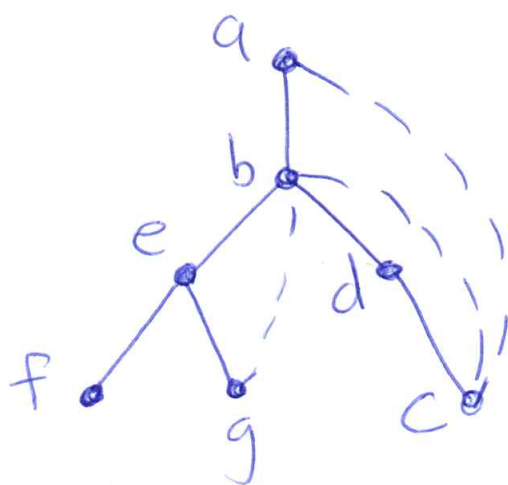
DFS



Adj Lists

- a: b, c, d
- b: e, g, d, c, a
- c: a, b, d
- d: a, b, c
- e: b, f, g
- f: e
- g: b, e

DFS tree



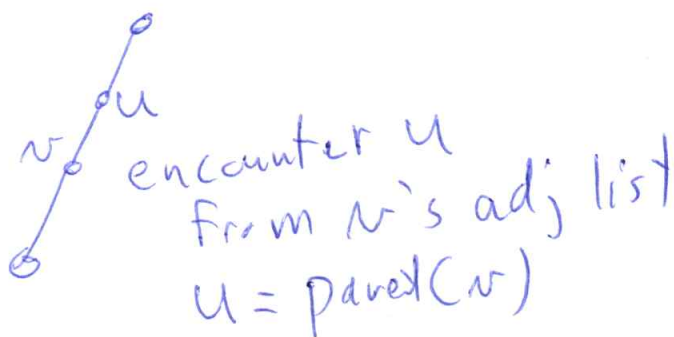
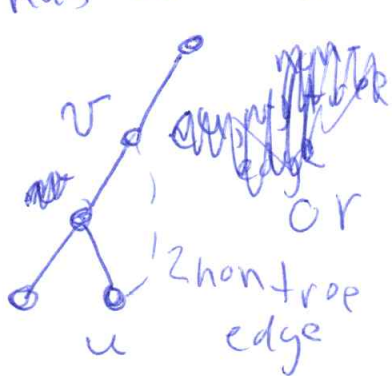
Order of

Discovery: a b e f g d c

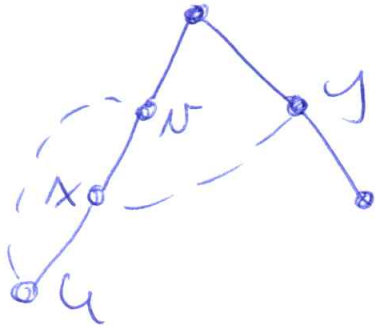
Finishing: f g e c d b a

- f, g are explored & finished before e is finished.

y has already been discovered



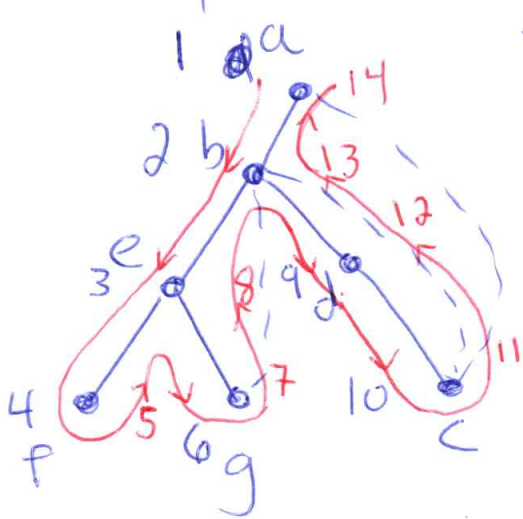
Lemma: All non-tree edges join an ancestor and a descendant.



n is an ancestor of u
 u is a descendant of n ✓

$(x, y) \notin E$

Compute discover & finish times



times

Discovery: a b e f g d c
 1 2 3 4 6 9 10

Finish: f g e c d b a
 5 7 8 11 12 13 14

$d(n) < d(u), f(u) < f(n)$

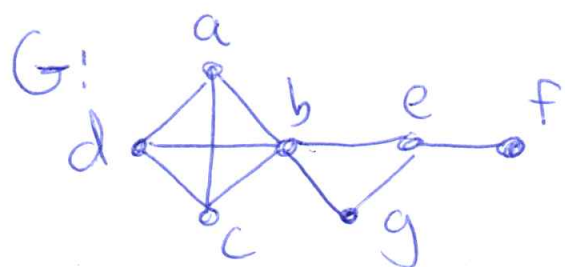
Discovery & finish times form a parenthesis system

If $d(n) < d(u)$ then

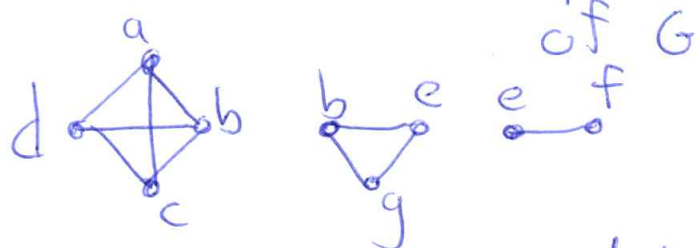
[[]]
 $d(n)$ $d(u)$ $f(u)$ $f(n)$
 nested

OR [] []
 $d(n)$ $f(n)$ $d(u)$ $f(u)$
 disjoint

DFS to find 2-connected components



Biconnected components



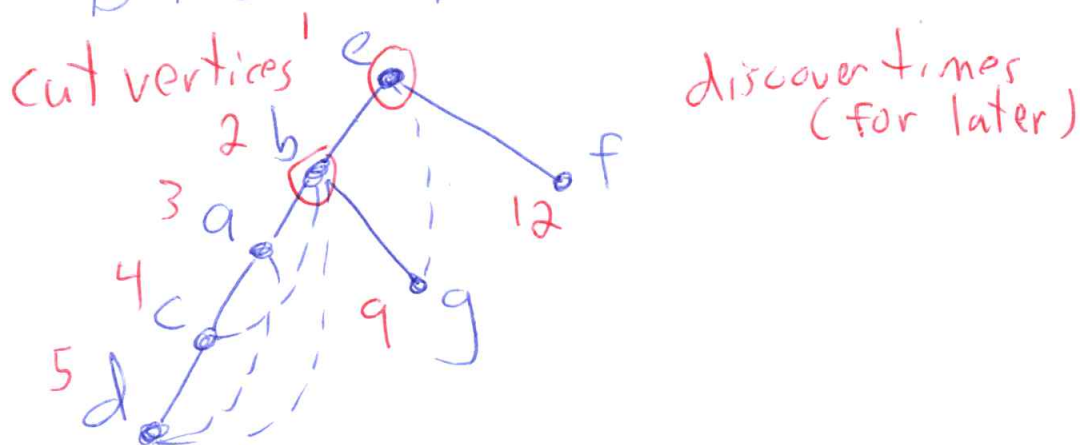
Look at how these components are connected.

- vertices in common

G is connected but removing either b or e would disconnect it.

~~DFS~~

DFS from e



Cut Vertex Lemma



- if we cut v , T becomes disconnected.

eg $v=b$ above
consider discovery times

Algorithm to find Cut Vertices



• check if $discovery(w) < discovery(u)$

Let u be the root of a subtree T of \mathcal{N}
 x a descendant of u

(x, w) is a non-tree edge
 *could check all edges

Define: $low(u) = \min \{ d(w) : \uparrow \}$, use *

A non-root vertex v is a cut vertex
 iff v has a child u with $low(u) \geq d(v)$



compute $low()$ recursively

$$(1) \quad low(u) = \min \left\{ \begin{array}{l} \min \{ d(w) : (u, w) \in E \} \\ \min \{ low(x) : x \text{ a child of } u \} \end{array} \right\}$$

Alg to compute all cut vertices

- Enhance DFS to compute low

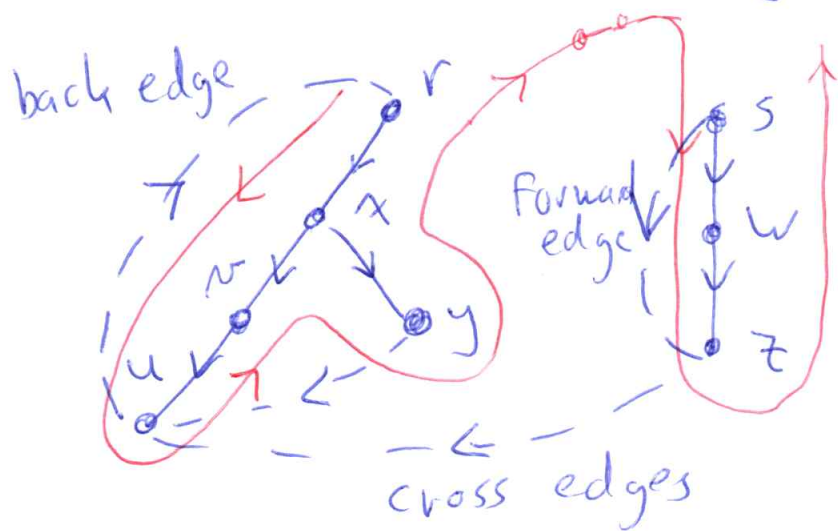
OR • Run DFS to compute discover times, $d(u)$

Then, for every vertex ~~u~~ u in finish time order, use (1) to compute $low(u)$

For every non-root w : if w has a child u with $low(u) \geq d(w)$ then w is a cut vertex.

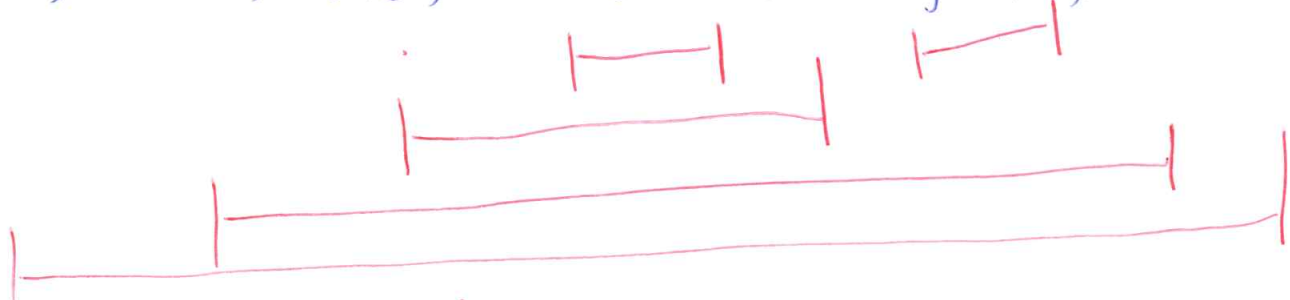
- also handle root.
-

DFS on directed graphs



order of exploration

$d(r)$ $d(x)$ $d(w)$ $d(u)$ $f(u)$ $f(w)$ $f(y)$ $f(x)$ $f(r)$ $d(s)$



parenthesis system

Detecting cycles in directed graphs

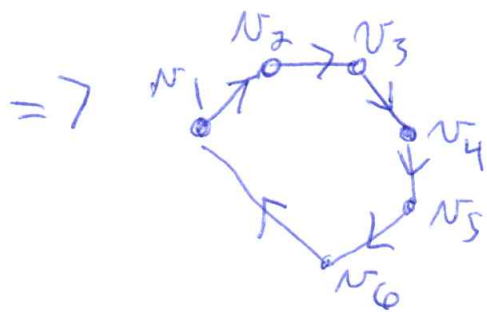
Lemma: A directed graph has a (directed) cycle
iff DFS has a back edge

Proof

\Leftarrow



Back edge gives a directed cycle



Suppose there is a directed cycle.

Let v_1 be the first vertex discovered in DFS.

Number vertices of cycle v_1, \dots, v_k

Claim (v_k, v_1) is a back edge.

Proof! Because we must discover & explore all v_i before we finish v_1 , when we test edge (v_k, v_1) we label it a back edge

- v_1 is an ancestor of v_k

Topological Sort



a must be done before b



topological sort: $b c a d$

or $c d b a$ or ...

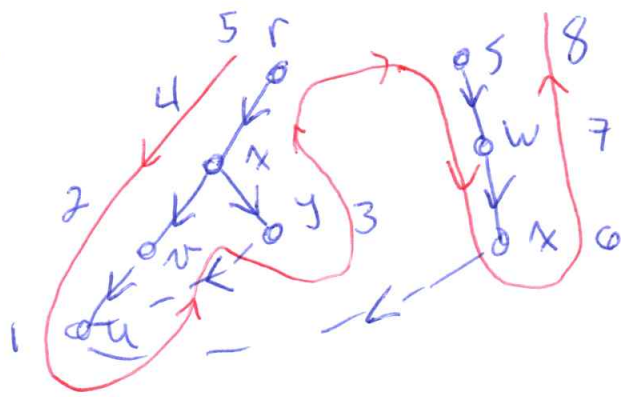
eg job scheduling

One solution: find vertex v with no in-edge
Remove v and repeat.

DFS Solution $O(n+m)$

• use reverse finish order

Ex



• no back edge

finish order 1...8

reverse finish orders:

s w x r x y v u

This is topological order

Proof

Claim: For every directed edge (u, v) ,
 $finish(u) > finish(v)$

Case 1: u discovered before v

Then because of edge (u, v) ,

v is discovered and finished before u is finished

Case 2: v discovered before u



• G has no directed cycles, we can't reach u in $DFS(v)$

So v finished before u is discovered and finished

Finding Strongly connected components in a directed graph

- Don't need to test all pairs u, v

Let s be a vertex

Claim: G is strongly connected

iff for all vertices v , there is a path $s \rightarrow v$ and a path $v \rightarrow s$

Proof \Rightarrow obvious! It really is this time.

\Leftarrow to get from $u \rightarrow v$: $u \rightarrow s \rightarrow v$

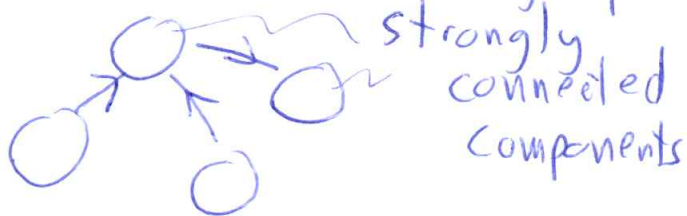


To Test for path $s \rightarrow v, \forall v$, use DFS(s)

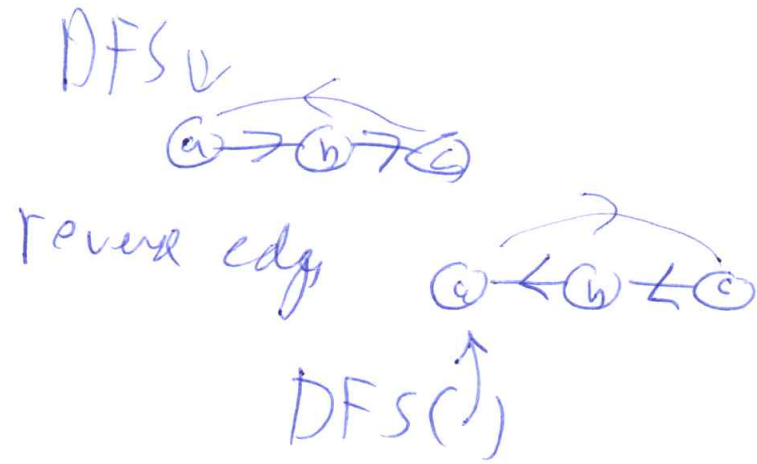
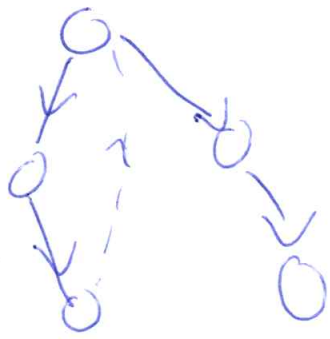
Test for path $v \rightarrow s$?

- Reverse edge directions and do DFS(s)

Structure of a digraph



- Contracting S.C.C. gives an acyclic graph
- think about it!



History Tarjan 1972

Kosaraju 78/81

Gabow 99

all linear time, all simple but different

Kosaraju: Vertices $1..n$

Run DFS \Rightarrow finish order f_1, f_2, \dots, f_n

reverse edges of G , call it M

run DFS again with vertex order f_n, \dots, f_1

Lemma Trees in 2nd DFS are exactly
the strongly connected components

Runtime $O(n+m)$