

Plan for today:

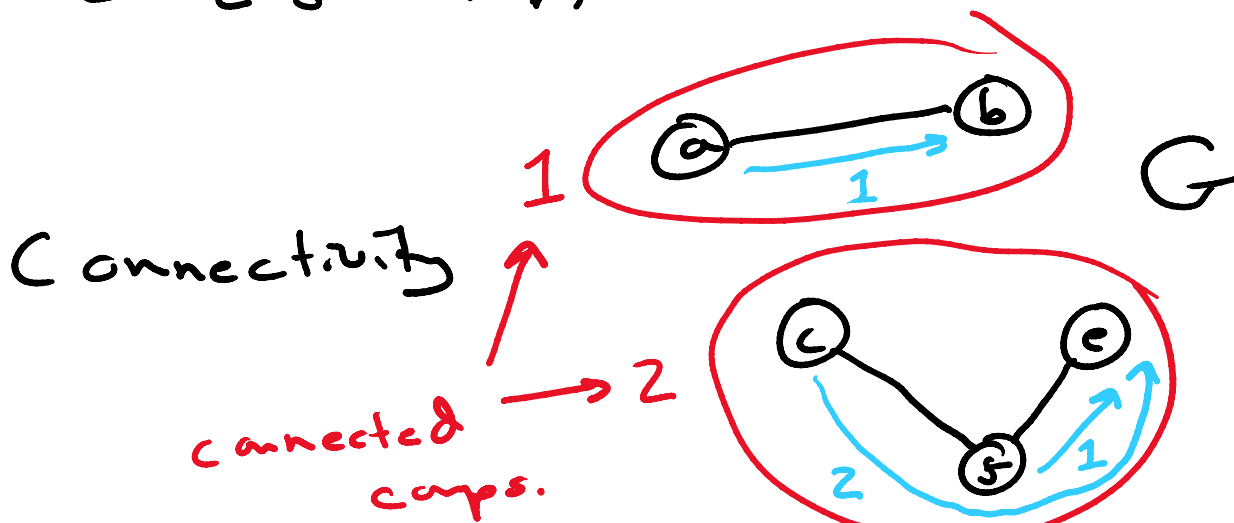
- Review last class
- Biconnectivity and k-connectivity
- Directed graphs, strong and weak connectivity
- The web graph
- Connectivity with networkx
  - o Connectivity and weak connectivity
  - o Will look at strong next class

Review last class

Graph  $G = (V, E)$

$V = \{a, b, c, e, f\}$

$E = \{g = (a, b), h = (c, f), i = (e, f) \dots\}$



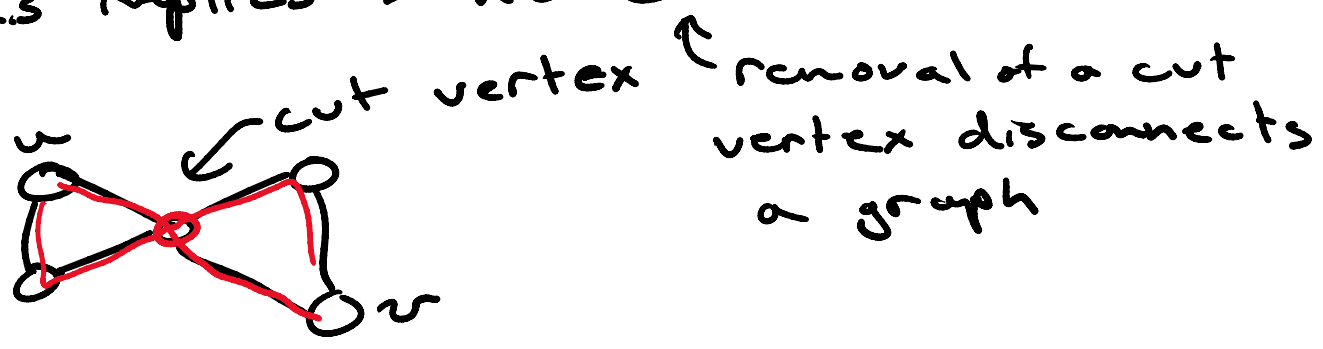
Graph processing

- can be done using "vertex state"
- we update states for some # iters.

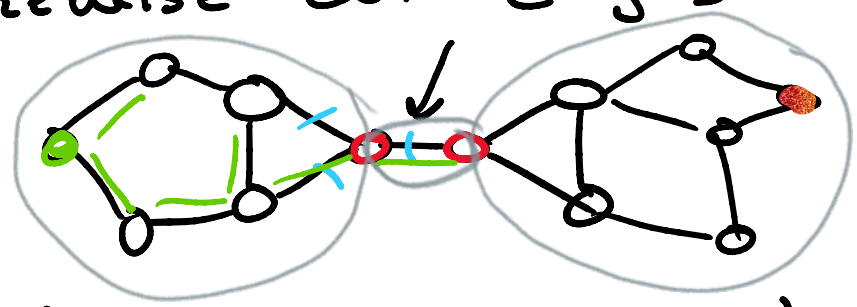
$n \quad \dots \quad 1 \quad \dots \quad 1 \quad \dots \quad 1$



This implies  $\Rightarrow$  no cut vertices



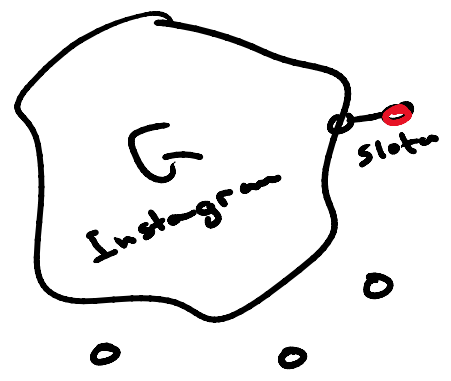
Likewise: cut edges



Why do we care in graph mining?

- $\rightarrow$  Cut vertices, edges are weak or possible failure points in a network
- $\rightarrow$  Information diffusion gets concentrated at these points

Note: most real-world networks are not biconnected (or even connected)



Reason: trivial components are quite common

Trivial component: single disconnected vertex (connectivity)



disconnected vertex (connectivity)  
degree-one vertex (biconnectivity)

↳ the neighbor will be a cut vertex

BUT: we might still care about  
\*how\* connected a graph is

Generalize all this:  $k$ -connectivity

-  $k$ : how many vertices we must delete to disconnect a graph

- 1-connected: connectivity  
algorithms: BFS/DFS/label prop.

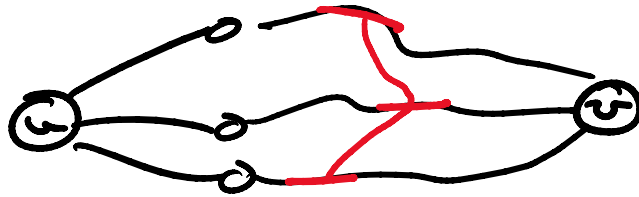
- 2-connected: biconnectivity  
algorithms: Hopcroft-Tarjan (DFS)  
Sota-Madduri (BFS/label prop)

- 3-connected: triconnectivity  
algorithms: Hopcroft-Tarjan (DFS)

( $k$ -edge-connectivity)  
-  $k$ -connected:  $k$ -connectivity



- $k$ -connected:  $k$ -connectivity algorithms: network flow



max flow = min cut

Really: this is all relevant to network "robustness"

Usually: we're either asking the question "how many vertices/edges" to remove to disconnect  $G$

OR how many vertices/edges to remove to disconnect  $v$  from  $G$   
 subgraph  $H$  from  $G$

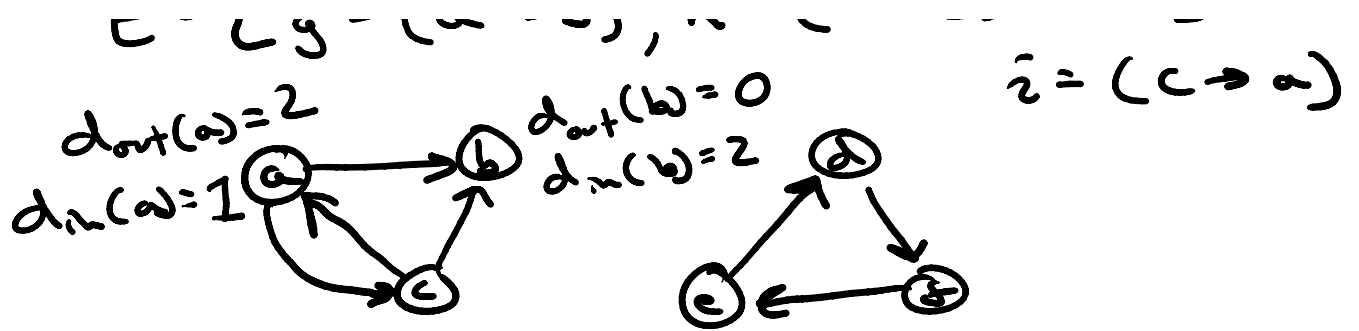
## Directed graphs

Directed graph  $D = (V, E)$

$$V = \{a, b, c, e, f\}$$

$$E = \{g = (a \rightarrow b), h = (a \rightarrow c), \dots\}$$

$\dots - 2$                        $\dots (b \rightarrow 0)$                        $\dots i = (c \rightarrow a)$



In undirected graph:  $d(v) =$  degree of  $v$   
(number of attached edges)

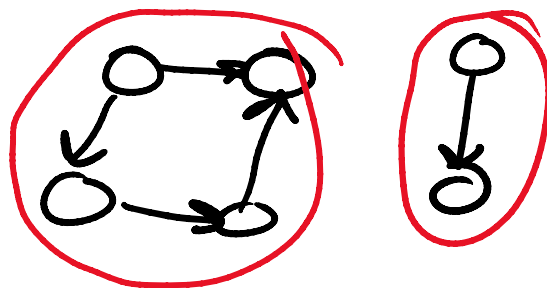
In directed graph:

$d_{in}(v) = \#$  incoming edges

$d_{out}(v) = \#$  outgoing edges

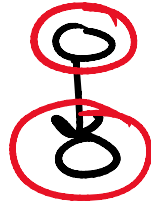
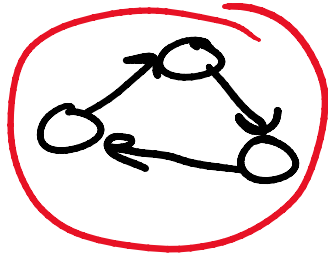
↑ also simply "degree"

Weak connectivity: a graph is weakly connected if there exists a  $u, v$ -path for all  $u, v$  ignoring directionality



Strong connectivity: a graph is strongly

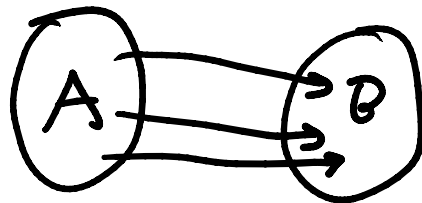
Strong connectivity: a graph is strongly connected if for all  $u, v$  pairs there exists a  $u, v$ -path



Algorithms: Tarjan  
(DFS)

Multistep (Sota et al.)  
(DFS, color prop.)

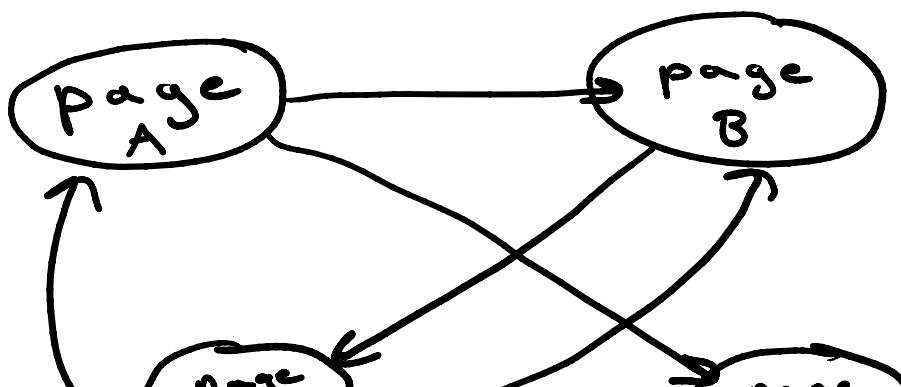
Note: the concept of  $k$ -connectivity can also be extrapolated to directed graphs

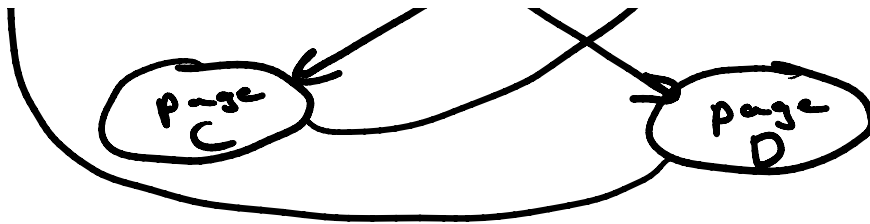


3-connected

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The web graph





Defined on vertices = { web pages }  
 edges = { hyperlinks }

Structure of the web:

- Not weakly connected
- One "massive" strong component (SCC)
- INs, OUTs, tendrils, tubes

→ bow-tie structure

