# Lecture 27: Graph Algorithms

# Agenda:

- DFS application: finding biconnected components
- Greedy algorithms: elements & properties
- Minimum spanning tree

## Reading:

• Textbook pages 379 - 384, 558 - 579

#### Biconnected component:

- Definition every pair of vertices are connected by two vertex-disjoint paths
- Cut vertex its removal increases the number of connected components
- Fact: biconnected ←⇒ no cut vertices
- In a DFS tree:
  - root is a cut vertex iff it has ≥ 2 child vertices (Why ???)
     → One simplest implementation (assuming connected):
    - 1. try every vertex v as the start vertex and do the DFS
    - 2. in the DFS tree, if  $degree_{DFS}(v) > 1$ , decompose the graph accordingly into  $degree_{DFS}(v)$  subgraphs sharing one common vertex v
    - 3. repeat on subgraphs until for every subgraph the DFS tree with every possible start vertex has root degree 1

Problem: too time consuming  $\Theta(n(n+m))$  ...

- any other vertex is a cut vertex iff vertices in the child subtrees have no back edges to its proper ancestors
  - $\longrightarrow$  Idea in the improved implementation  $\longrightarrow$   $(\Theta(n+m))$ : for each vertex v, and each of its child w, keep track of furthest back edge from the w-subtree

### DFS application: finding biconnected components

• Idea in the improved implementation —  $(\Theta(n+m))$ : for each vertex v, and each of its child w, keep track of furthest back edge from the w-subtree

#### • Details:

- for every vertex v, 1<sup>st</sup> encounter child w, recur from w
- last encounter w (just before backing up to v), check whether v cuts off the w-subtree (rooted at w)
- maintain dtime[v], b[v], p[v] for v:
  - 1. dtime[v] discovery time
  - 2. b[v] dtime of the furthest ancestor of v to which there is back edge from a descendant w of v
  - (a) updated when the first back edge is encountered
  - (b) updated when last time encounter of v (backing up)
  - 3. p[v] parent of v in the DFS tree
- Reporting biconnected components:
  - recall that biconnected components form a partition of edge set  ${\cal E}$
  - when edge e first encountered, push into edge stack
  - when a cut vertex discovered, pop necessary edges

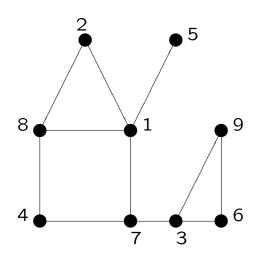
### Finding biconnected components — pseudocode:

```
procedure bicomponents(G)
                                         **G = (V, E)
S = \emptyset
                                         **S is the edge stack
time \leftarrow 0
for each v \in V do
    p[v] \leftarrow 0
                                         **unknown yet:
                                                              \mathtt{NIL}
    dtime[v] \leftarrow time
    b[v] \leftarrow n + 1
\quad \text{for each } v \in V \text{ do}
    if dtime[v] = 0 then
         biDFS(v)
procedure biDFS(v)
                                         **discover v
time \leftarrow time +1
dtime[v] \leftarrow time
b[v] \leftarrow \mathtt{dtime}[v]
                                         **no back edge from descendant yet
for each neighbor w of v do **first time encounter w
    if dtime[w] = 0 then
                                         **unknown yet
         push(v, w)
         p[w] \leftarrow v
         biDFS(w)
                                         **recursive call
         if b[w] \geq \text{dtime}[v] then
             print "new biconnected component",
             repeat
                  pop & print
             until (popped edge is (v, w))
         else
             b[v] \leftarrow \min\{b[v], b[w]\}
    else if (\text{dtime}[w] < \text{dtime}[v] and w \neq p[v]) then
                                         **(v,w) is a back edge from v
         push(v, w)
         b[v] \leftarrow \min\{b[v], \text{dtime}[w]\}
```

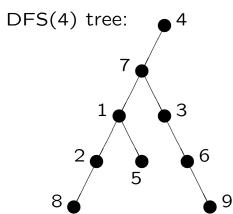
### Lecture 27: Graph Algorithms

# Finding biconnected components — example:

Execute biDFS(4) on the following graph, assuming no previous biDFS() calls:



- 1: 2 5 7 8
- 2: 1 8
- 3: 6 7 9
- 4: 7 8
- 5: 1
- 6: 3 9
- 7: 1 3 4
- 8: 1 2 4
- 9: 3 6



Lecture 27: Graph Algorithms Finding biconnected components — answer:

| 1: 2 5 7 8 D 2: 1 8 3: 6 7 9 4: 7 8 5: 1 6: 3 9 7: 1 3 4 8: 1 2 4 9: 3 6 | FS(4) t | ree:   | 3            |              |              |          |              |        |              |  |  |
|--|---------|--|--------------|--------------|--------------|----------|--------------|--------|--------------|--|--|
| 9: 3 6   | 84      |  | <b>)</b>     | 9            |              |          |              |        |              |  |  |
| dtime  | 3       | 4  | 7            | 1            | 6            | 8        | 2            | 5      | 9            |  |  |
|  | b[1     |  | <i>b</i> [3] | <i>b</i> [4] | <i>b</i> [5] |          | <i>b</i> [7] | b[8]   | <i>b</i> [9] |  |  |
| biDFS(4)   | 10      | 10   | 10           | 1            | 10           | 10       | 10           | 10     | 10           |  |  |
| 4} biDFS(7)  | 10      | 10   | 10           | 1            | 10           | 10       | 2            | 10     | 10           |  |  |
| 4, 7) biDFS(1)   | 3       | 10   | 10           | 1            | 10           | 10       | 2            | 10     | 10           |  |  |
| 4, 7, 1} biDFS(2)  |         | 4  | 10           | 1            | 10           | 10       | 2            | 10     | 10           |  |  |
| 4, 7, 1, 2 $(2,1)$   |         | 1  | 10           | 1            | 10           | 10       | 2            | _      | 10           |  |  |
| 4, 7, 1, 2} biDFS(8)   | 3       | 4<br>4   | 10<br>10     | 1<br>1       | 10<br>10     | 10<br>10 | 2<br>2       | 5<br>3 | 10<br>10     |  |  |
| 4, 7, 1, 2, 8} (8,1)<br>4, 7, 1, 2, 8} (8,2)                             |         | 4  | 10           | 1            | 10           | 10       | 2            | 3      | 10           |  |  |
| 4, 7, 1, 2, 8} (8,2)<br>4, 7, 1, 2, 8} (8,4)                             |         | 4  | 10           | 1            | 10           | 10       | 2            | 1      | 10           |  |  |
| 4, 7, 1, 2, 6, (0,4)<br>4, 7, 1, 2} biDFS(8)                             | done 3  | 1  | 10           | 1            | 10           | 10       | 2<br>2       | 1      | 10           |  |  |
| $\{4, 7, 1\}$ biDFS(2) don   |         | 1  | 10           | 1            | 10           | 10       | 2            | 1      | 10           |  |  |
| $\{4, 7, 1\}$ biDFS(2) doi:  |         | 1  | 10           | 1            | 6            | 10       | 2            | 1      | 10           |  |  |
| 4, 7, 1, 5} (5,1)  | -       | _  | 10           | -            | Ü            | 10       | _            | -      | 10           |  |  |
| $\{4, 7, 1, 5\} (5, 1)$<br>4, 7, 1} biDFS(5) done                        |         | new biconnected component: (1, 5)                  |              |              |              |          |              |        |              |  |  |
| 4, 7, 1} (1,7)   |         | new breenheeved component. (1, 0)                  |              |              |              |          |              |        |              |  |  |
| 4, 7, 1 (1,8)  |         |  |              |              |              |          |              |        |              |  |  |
| 4, 7 $\stackrel{\text{biDFS}(1)}{}$ done                                 | 1       | 1  | 10           | 1            | 6            | 10       | 1            | 1      | 10           |  |  |
| 4, 7 biDFS(3)  | 1       | 1  | 7            | 1            | 6            | 10       | 1            | 1      | 10           |  |  |
| 4, 7, 3} biDFS(6)  | 1       | 1  | 7            | 1            | 6            | 8        | 1            | 1      | 10           |  |  |
| $4, 7, 3, 6$ $\{6,3\}$   |         |  |              |              |              |          |              |        |              |  |  |
| 4, 7, 3, 6 biDFS(9)  | 1       | 1  | 7            | 1            | 6            | 8        | 1            | 1      | 9            |  |  |
| 4, 7, 3, 6, 9} (9,3)   | 1       | 1  | 7            | 1            | 6            | 8        | 1            | 1      | 7            |  |  |
| 4, 7, 3, 6, 9} (9,6)   |         |  |              |              |              |          |              |        |              |  |  |
| 4, 7, 3, 6} biDFS(9)   |         | 1  | 7            | 1            | 6            | 7        | 1            | . 1    | 7            |  |  |
| $\{4, 7, 3\}$ biDFS(6) don   | .e new  | biconn   | ected        | compon       | ent:         | (9, 3),  | (6, 9        | ), (3, | 6)           |  |  |
| 4, 7, 3 (3,7)  |         |  |              |              |              |          |              |        |              |  |  |
| 4, 7, 3) (3,9)<br>4, 7) biDFS(3) done                                    | 200     | . hiconn   | -a+ad        |              | on+.         | (7 2)    |              |        |              |  |  |
| 4, $7$ bibrs(3) done 4, $7$ (7,4)  | l new   | new biconnected component: (7, 3)                  |              |              |              |          |              |        |              |  |  |
| 4, 7; (7,4)<br>4} biDFS(7) done  |         | new biconnected component: (8, 4), (8, 1), (2, 8), |              |              |              |          |              | 8)     |              |  |  |
| i, bibib(i) done   | l new   | DICOM  | 0110.        | (1, 2),      |              |          |              |        |              |  |  |
| biDFS(4) done  | 1       | 1  | 7            | 1            | 6            | 7        | 1            | 1      | 7            |  |  |

## Finding biconnected components — analysis:

- Correctness ???
- Complexity running time and space requirement:
  - running time:

constant for each vertex encounter and each edge encounter  $\longrightarrow$ 

$$\Theta(c_1 n + c_2 \sum_{v \in V} \text{degree}(v)) = \Theta(n+m)$$

- space:

assume adjacency list representation: space for graph, arrays of size n, edge stack, and runtime stack

- 1. space for graph and arrays  $\Theta(m+n)$
- 2. edge stack requires O(m) since every edge pushed
- 3. runtime stack O(n) since at most n biDFS activations each is of constant size
- 4. therefore,  $\Theta(n+m)$  in total

## Minimum spanning tree (MST) problem:

• Input: edge-weighted (simple, undirected) connected graphs (positive weights)

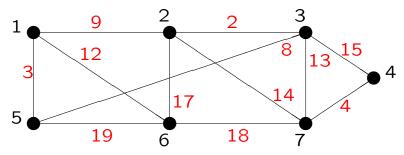
#### Notions:

- subgraph, acyclic, tree
- spanning subgraph: subgraph including all the vertices
- spanning tree: spanning subgraph which is a tree acyclic connected subgraph T=(V,E'), where  $E'\subset E$ 
  - e.g., BFS/DFS (on a connected input graph) tree is a spanning tree of the graph
- minimum spanning tree: minimum weight

#### • The MST Problem:

Find a minimum spanning tree for the input graph.

For example:



• The minimum spanning forest problem:

The given graph is not necessarily connected.

Find an MST for each connected component.

## Greedy algorithms and MST problem:

- Greedy algorithms:
  - greedy each step makes the best choice (locally maximum)
  - iterative algorithms
  - optimal substructure
     an optimal solution to the original problem contains within it optimal solutions to subproblems
- Greedy solution may NOT be globally optimum e.g., matrix-chain multiplication:  $A_{6\times5}\times A_{5\times2}\times A_{2\times5}\times A_{5\times6}$  Greedy: 50+150+180=380 scalar multiplications Dynamic programming: 60+60+72=192 scalar multiplications
- The MST problem:

Two greedy solutions are globally optimum

- Prim's (Prim + Dijkstra + Boruvka's)
   growing the tree to include more vertices
- Kruskal's (Kruskal + Boruvka's)
   growing the forest to become a tree

Lecture 27: Graph Algorithms Have you understood the lecture contents?

| well | ok | not-at-all | topic                               |
|------|----|------------|-------------------------------------|
|      |    |            | biconnected component & cut vertex  |
|      |    |            | one simplest implementation via DFS |
|      |    |            | the improved DFS implementation     |
|      |    |            | execution and correctness           |
|      |    |            | minimum spanning tree               |
|      |    |            | greedy algorithms in general        |