

# Graph Algorithms

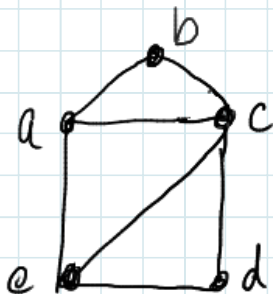
Graph  $G = (V, E)$

$V$  - vertices (nodes)  $|V| = n$

$E \subseteq V \times V$  - edges  $|E| = m$

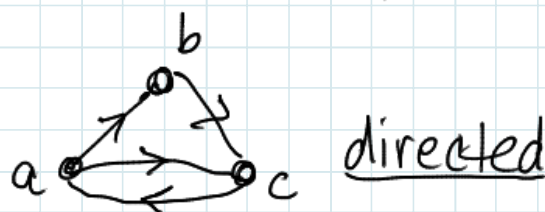
edges can be undirected (unordered pairs)  
or directed (ordered pairs).

Examples



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

$E = \{(a, b), (a, c), (a, e), \dots\}$

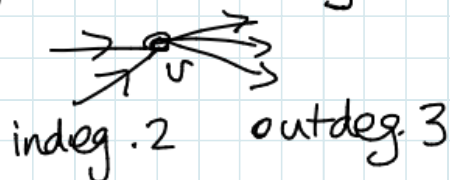


$V = \{a, b, c\}$

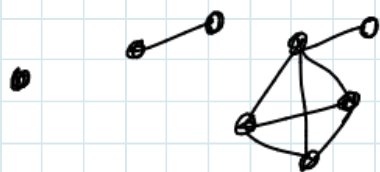
$E = \{(a, b), (b, c), (a, c), (c, a)\}$

## Basic Notions

- $u, v \in V$  are adjacent or neighbours if  $(u, v) \in E$
- $u \in V$  is incident to  $e \in E$  if  $v \xrightarrow{e} u$   $e = (v, u)$
- $\deg(v) = \#$  incident edges
- for directed graph indegree( $v$ ), outdegree( $v$ )



- a path is a sequence of vertices  
 $v_1, v_2, \dots, v_k$  s.t.  $(v_i, v_{i+1}) \in E \quad i=1 \dots k-1$   
 a simple path does not repeat vertices.
- a cycle is a path that starts and ends at the same vertex.
- a tree is a connected <sup>undirected</sup> graph without cycles
- a <sup>undirected</sup> graph is connected if every  $u, v \in V$  are joined by a path
- connected component of a graph  
 = maximal connected subgraph



3 connected components.

History: Euler, Königsberg bridge problem 1735

Applications - many!

- networks : wireless, transportation, social
- web pages, game configurations etc

## Storing Graphs

- adjacency matrix  $A[i, j] = \begin{cases} 1 & \text{if } (i, j) \in E \\ 0 & \text{otherwise} \end{cases}$   
 $O(n^2)$  space, even

if the graph is sparse,  $|E| \ll n^2$

But a query "is  $(i, j)$  an edge" can be answered in  $O(1)$

- adjacency lists

For each vertex  $v$ , store linked list of  $v$ 's neighbours



$a: b, c$

$b: c$

$c: a$

For  $G$  directed, every edge appears in 1 list.

For  $G$  undirected, every edge appears in 2 lists.

$O(n+m)$  space

A query "is  $(i, j)$  an edge?" requires traversing  $i$ 's adjacency list.  $O(n)$  worst case

Sometimes graphs are stored implicitly, e.g.

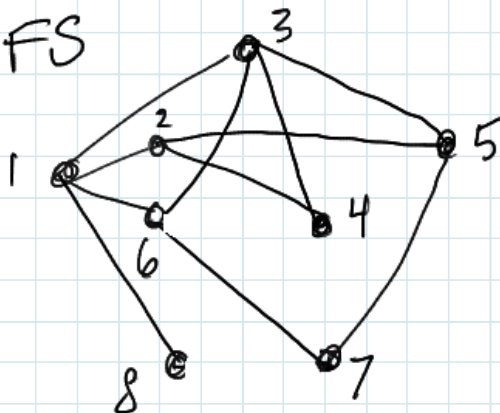
nodes may represent configurations in a chess game.  
 Generate nodes as you search configuration space.

Can use hash-table of adjacency lists to  
 get space  $O(n+m)$  and  $O(1)$  test for edge.

Exploring Graphs - visit all nodes, or all nodes reachable from some "source"  
 further - find shortest paths, connected components.

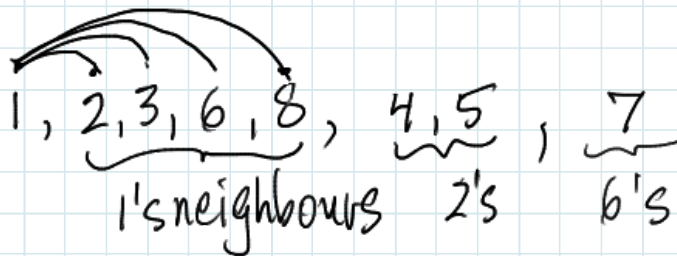
Breadth First / Depth First Search

BFS

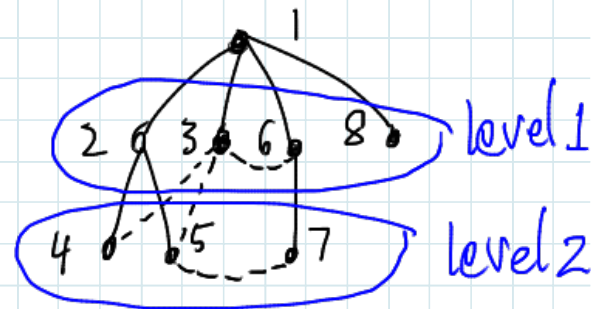


Cautious search:  
 check everything one edge away, then two...

order in which vertices are discovered



BFS tree



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

Vertices are marked:

undiscovered  $\rightarrow$  discovered

Explore ( $v$ )

for each neighbour  $u$  of  $v$

- if  $\text{mark}(u) = \text{undiscovered}$

$\text{mark}(u) \leftarrow \text{discovered}$

$\text{parent}(u) \leftarrow v$   
 $\text{level}(u) \leftarrow \text{level}(v) + 1$

add  $u$  to Queue

end

BFS

initialize: mark all vertices undiscovered

pick initial vertex  $v_0$   $\text{parent}(v_0) \leftarrow \emptyset$   $\text{level}(v_0) = 0$

add  $v_0$  to Queue;  $\text{mark}(v_0) \leftarrow \text{discovered}$

while Queue not empty

$v \leftarrow \text{remove from Queue}$

Explore( $v$ )

end

Also useful to store parent and level (see previous example) See blue additions above.

BFS takes  $O(n+m)$  time. - we explore each vertex once and check all incident edges.

time is  $O\left(n + \sum_v \deg(v)\right) = O(n+m)$ .

Note:  $\sum_v \deg(v) = 2m$

because we count each edge twice.



# Properties of BFS

the "BFS tree"

- the parent pointers create a directed tree<sup>v</sup>  
(because each addition adds a new vertex  $u$  with parent  $v$  in the tree.)



- $u$  is connected to  $v_0$  iff BFS from  $v_0$  reaches  $u$ . Stronger:
- Lemma. the shortest path from  $v_0$  to  $u$  has length (#edges)  $k$  iff BFS from  $v_0$  puts  $u$  in level  $k$ .

Proof by induction with basis  $k=0$

$\Leftarrow$  Suppose  $u$  in level  $k$ . Then  $\text{parent}(u) = v$  is in level  $k-1$ . So shortest path  $v_0$  to  $v$  has length  $k-1$  by induction. There is a path  $v_0$  to  $u$  of length  $k$ . Is it shortest? Yes, otherwise (by induction)  $u$  would be in a level  $< k$ .

$\Rightarrow$  suppose shortest path is  $v_0, v_1, \dots, v_k = u$   
then  $v_0 \dots v_{k-1}$  is a shortest path of length  $k-1$ . So  $v_{k-1}$  goes in level  $k-1$ . Then  $u$  (a neighbour of  $v_{k-1}$ ) goes in level  $\leq k$ .  
Could  $u$  go in level  $< k$ ? No, otherwise (by ind.) there would be a shorter path to  $u$ .

Consequences:

1. BFS from  $v_0$  finds the connected component of  $v_0$ .

EX. Enhance BFS to find all connected components in time  $O(n+m)$

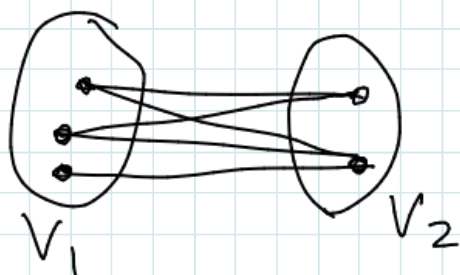
2. BFS finds shortest paths (#edges) from  $v_0$ .

EX. Use BFS to find if a connected graph has a cycle.

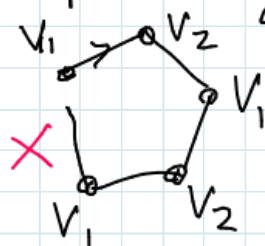
EX. prove that if  $(u,v) \in E$  then  $\text{level}(u)$ ,  $\text{level}(v)$  differ by 0 or 1.

BFS to test bipartiteness

$G$  is bipartite if  $V$  can be partitioned into  $V_1 \cup V_2$  ( $V_1 \cap V_2 = \emptyset$ ) s.t. every edge has one end in  $V_1$  and one end in  $V_2$



Note that a bipartite graph cannot have an odd cycle.



Run BFS.  $V_1 = \text{odd levels}$   $V_2 = \text{even levels}$ .

Test if this works (check edges)

- if YES  $\rightarrow G$  is bipartite

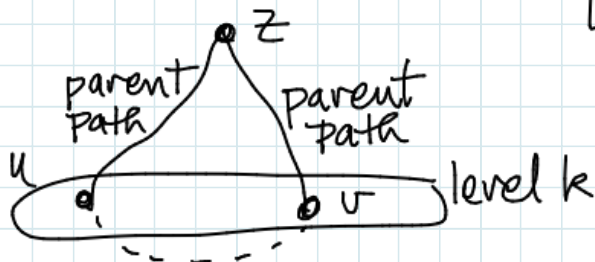
- if NO then there is an edge  $(u, v)$  with  $u, v$  both in  $V_i$  ( $i=1$  or  $2$ )

By Ex.  $\text{level}(u)$  and  $\text{level}(v)$  differ by 1 or 0.

If 1, then one in  $V_1$ , one in  $V_2$ .

So  $u, v$  are in same level, say  $k$ .

Let  $z = \text{least common ancestor of } u, v$ .



Cycle formed by  $\text{path}(u, z)$   $\text{path}(z, v)$   $(u, v)$   
has length  $2t + 1$  — odd

Then  $G$  is not bipartite.

This proves:

Lemma  $G$  is bipartite iff it has no odd cycle.

the proof is via an algorithm that finds  
a bipartition OR an odd cycle.