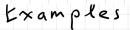
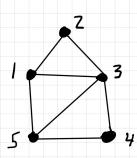
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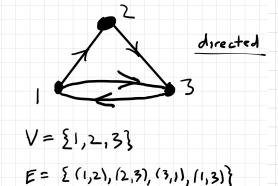
## Graph Algorithms

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)





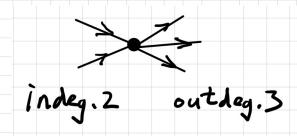


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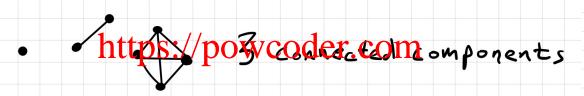
#### Basic Notions

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



- a path is a sequence of vertices  $v_1, v_2, \ldots, v_k$  s.t.  $(v_i, v_{i+1}) \in E, i = 1, \ldots, k-1$  a <u>simple</u> path does not repeat vertices
- a <u>cycle</u> is a path that starts and ends at the same vertex. <u>simple cycle</u> no repeats CAUTION: Some sources use "path" to mean a simple path
- a <u>tree</u> is a connected (undirected) graph without cycles
- an undirected graph is connected if every  $u, v \in V$  are joined by a path
- connected component of a graphent project exam Herph



History: Euler, Königsberg bragdor bra

Applications — many!

- networks: wireless, transportation, social
- web pages, game configurations etc.
- W Graph Theory

### Storing Graphs

In practice, vertices and edges may have names or other associated information, but our algorithms will be for abstract graphs.

Assume vertices are  $\{1, 2, \ldots, n\}$  (sometimes write  $v_1, \ldots, v_n$  or use letters)

Two basic ways to store a graph:

Adjacency matrix  $n \times n$  matrix space  $O(n^2)$ 

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$$A[i,j] = \begin{cases} 1 & \text{if } (i,j) \in E \\ 0 & \text{otherwise} \end{cases}$$

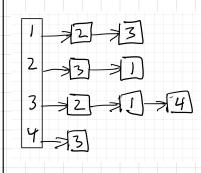
Adjacency lists for every vertex u, store a linked list of its (forward) neighbours, i.e., vertices v such that  $(u,v) \in E$  powcoder.com

space O(n+m)

Examples

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for an undirected graph A[i,j] = A[j,i]



For an undirected graph, every edge "appears" twice, e.g., (2,3) is in 2's list and 3's list.

More examples in CLRS or http://jeffe.cs.illinois.edu/teaching/algorithms/book/05-graphs.pdf Ex. Do an example of a directed graph.

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Basic operations:	adjacency matrix	adjacency lists	
list $v$ 's neighbours	$\Theta(n)$	$\Theta(1 + \deg(v))$	our algorithms will only need these
list all edges	$\Theta(n^2)$	$\Theta(n+m)$	these
is $(u, v) \in E$	Θ(1) <b>Assignmen</b>	$O(1 + \deg(u))$ It Project Example 1	m Help

For algorithms in this course, We'll use adjacency lists.

space

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

Breadth First / Depth First Search

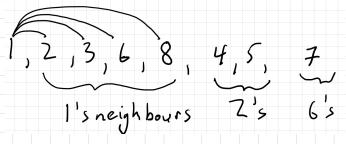


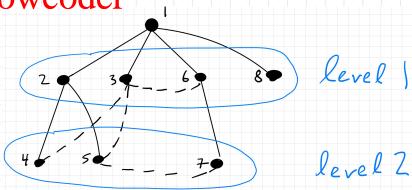


Cautious search: check everything one edge away, then two, etc.

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order in which vertices are discovered Add WeChat powcoder





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 do
     if mark(u) = undiscovered then
       \max(u) := \operatorname{discovered} \quad \text{pareat(u):=v}; \quad \text{level(u):=level(v)+1}
       add u to Queue
     fi
   od
BFS
   initialize: mark all vertices undiscovered Droject Exam Help
   pick initial vertex v_0 parent (v_0):=0 https://powcoder.com
   add v_0 to Queue
   mark(v_0) := discovered
   while Queue not empty dodd WeChat powcoder
     v := \text{remove from Queue}
     Explore(v)
   od
```

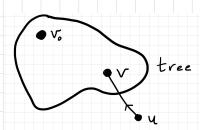
Also useful to store parent and level. See blue additions above.

BFS takes O(n+m) time — we explore each vertex once and check all incident edges. Time is  $O(n+\sum_{v} \deg(v)) = O(n+m)$ 

Note:  $\sum_{v} \deg(v) = 2m$  because we count each edge twice.

#### Properties of BFS

the parent pointers create a directed tree (because each addition adds a new vertex u, with parent v in the tree)



• u is connected to  $v_0$  if and only if BFS from  $v_0$  reaches u.

Stronger: Lemma: The level of a vertex  $v = \text{length of shorted path from } v_0 \text{ to } v$ .

Proved via 2 claims:

Proved via 2 claims: Assignment Project Exam Help Claim 1 v in level  $i \Rightarrow$  there is a path  $v_0$  to v of i edges.

Claim 2 v in level  $i \Rightarrow$  every path  $v_0$  to v has > i edges. The contract of the contr

Induction step: v in level  $i \Rightarrow parent(v)$  in level i-1  $\Longrightarrow$  there is a path  $v_0$  to parent(v)of i-1 edges. Adding edge (parent(v), v) gives path  $v_0$  to v of i edges

Proof of claim 1 by induction on i, the level i to prove claim 2 we will prove: if there is a Basis i = 0:  $v = v_0$ , the root of the tree. Path  $v_0$  to v of j edges then v is in level  $\leq j$ . Proof by induction on j. Basis j = 0: must have  $v = v_0$ , which is in level 0. Induction step. Let u be vertex before v in path. There is a path  $v_0$  to u of j-1 edges. By induction u is in level  $\leq j-1$ . So one edge (u,v) goes to level  $\leq j$ .

#### Consequences:

- 1. BFS from  $v_0$  finds the connected component of  $v_0$ .
- 2. BFS finds shorted paths (# edges) from  $v_0$

#### Exercises:

- Enhance BFS to find all connected components in time  $\mathbf{P}(n+m)$ .
- Use BFS to find if a connected graph has a cycle.
- Prove that if  $(u, v) \in E$  then pevel(v), level(v) differ by 0 or 1.

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