



# Breadth-first Search

*Algorithmic Thinking*

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# Graph Exploration

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- ❖ Elucidating graph properties provides a powerful tool for understanding networks and their emergent properties.
- ❖ Some properties of interest include: degree distribution, community structure, node centrality, clustering coefficients,...
- ❖ When the graph is huge, exhaustive analysis of the entire graph is infeasible.
- ❖ The alternative: Explore a region (or, regions) of the graph, and report the results based on this exploration.



# Graph Exploration

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- ❖ Graph exploration can be done
  - ❖ deterministically: using, for example, breadth-first search (BFS) or depth-first search (DFS)
  - ❖ nondeterministically: using random walks.
- ❖ Here, we will focus on BFS

# Breadth-First Search (BFS)

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- ❖ The main idea behind BFS is very simple:
  - ❖ Starting from some pre-specified node, explore the node and its neighbors; then, for each neighbor, explore its neighbors; and so on until no more nodes can be explored!



# Breadth-First Search (BFS)

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- ❖ The question is: How do we ensure that all the neighbors of a given node are explored before any of their neighbors are?
- ❖ That is, suppose we are exploring node  $u$  and its neighbors  $v$ ,  $w$ , and  $x$ . How do we make sure  $v$ ,  $w$ , and  $x$  are explored before a neighbor of, say,  $w$ , is explored (because if the neighbor of  $w$  gets explored before, say,  $x$ , this would not be BFS)
- ❖ The answer: By using an appropriate data structure!



# Queues

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- ❖ A queue is a data structure that implements a first-in first-out (FIFO) data access model.
- ❖ Just think how a queue works when you go to a post office: the first person to enter the queue would be the first person served and the first person to leave the queue.
- ❖ Contrast this with a last-in first-out (LIFO) model: think of trays at a cafeteria; the last tray put on the stack of trays would be the first one picked up for use (the data structure that implements this model is called a stack).

# Queues

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Enter the queue  
(last)

Leave the queue  
(first)





# Queues

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- ❖ Two main operations are defined on queue  $Q$ :
  - ❖  $\text{enqueue}(Q, x)$ : add element  $x$  to the queue (at the end)
  - ❖  $\text{dequeue}(Q)$ : remove the first element that was enqueued into  $Q$  and return it
- ❖ Queues can be implemented so that each of the two operations takes  $O(1)$  time.



# BFS and Queues

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- ❖ When a node  $u$  is reached during the exploration of the graph, enqueue all the neighbors of  $u$ , and when done with all of  $u$ 's siblings, go to  $u$ 's neighbors (by getting them out of the queue).

# Breadth-First Search (BFS)

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- ❖ Graph exploration via BFS (or any other exploration method) is done to compute some statistic (e.g., distances) or test a property of the graph (e.g., acyclicity).
- ❖ Therefore, it is typical to see a BFS algorithm coupled with additional statements to conduct such computations and / or tests.
- ❖ Here, we will illustrate the use of BFS to compute distances (from the start node) while exploring the graph.



# Breadth-First Search (BFS)

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## Algorithm 1: BFS.

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**Input:** Undirected graph  $g = (V, E)$ ; source node  $i$ .

**Output:**  $d_j, \forall j \in V$ : the distance between nodes  $i$  and  $j$ .

```
1 Initialize  $Q$  to an empty queue;
2 foreach  $j \in V$  do
3    $d_j \leftarrow \infty$ ;
4  $d_i \leftarrow 0$ ;
5  $\text{enqueue}(Q, i)$ ;
6 while  $Q$  is not empty do
7    $j \leftarrow \text{dequeue}(Q)$ ;
8   foreach neighbor  $h$  of  $j$  do
9     if  $d_h = \infty$  then
10       $d_h \leftarrow d_j + 1$ ;
11       $\text{enqueue}(Q, h)$ ;
12 return  $d$ ;
```

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before the exploration  
begins, distances to all nodes  
are infinite

the first time  
the algorithm enters this  
loop, only node  $i$  is in the  
queue!

place all  
neighbors (that haven't been  
explored) of the currently explored  
node in the queue



# Efficiency

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- ❖ If input graph  $g$  is represented as an adjacency matrix, BFS takes  $\Theta(n^2)$ , where  $n$  is the number of nodes.
- ❖ The two key issues that you should observe to arrive at this running time are:
  - ❖ Every node gets added to the queue only once and in every iteration of the loop at Line 6, a node is removed from the queue.
  - ❖ To find the neighbors at Line 8, the algorithm has to inspect  $O(n)$  entries in the matrix.



# Efficiency

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- ❖ If input graph  $g$  is represented as an adjacency list, BFS takes  $\Theta(n+m)$ , where  $n$  is the number of nodes and  $m$  is the number of edges.
- ❖ To see this, think of two factors:
  - ❖ The loop at Line 2 takes  $O(n)$  to initialize the distances.
  - ❖ Don't think about the loop of Line 6 in terms of the number of nodes; instead, convince yourself that in that loop every edge in the graph gets traversed exactly twice; hence, the loop performs  $O(n+m)$  work.