

# CSCB63 – Design and Analysis of Data Structures

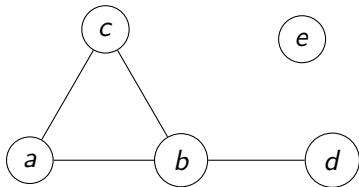
Anya Tafliovich<sup>1</sup>

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<sup>1</sup>based on notes by Anna Bretscher and Albert Lai

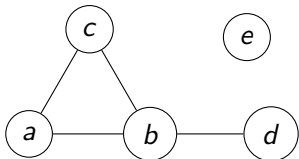
## introduction

- cities and highways between them
- computers and network cables between them
- people and relationships
- in a board game: a state and legal moves to other states



a graph

## undirected graph



An undirected graph is a pair  $(V, E)$  of:

- $V$ : a set of vertices (above:
- $E$ : a set of edges, where an edge is a pair of vertices (above:  
(usually, no edge from a vertex to itself)  
undirected graph — no direction specified, bidirectional

## graph terminology: incident, endpoint, degree

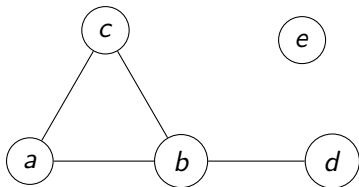
Edge incident on vertex, vertex is an endpoint of edge: e.g.,

$\{a, c\}$  is incident on  $a$ ;  $a$  is an endpoint of  $\{a, c\}$

$\{a, c\}$  is incident on  $c$ ;  $c$  is an endpoint of  $\{a, c\}$

$\{a, c\}$  is not incident on  $b$ ;  $b$  is not an endpoint of  $\{a, c\}$

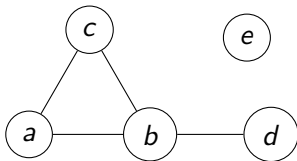
Degree of vertex: how many edges are incident on it.



vertex	$a$	$b$	$c$	$d$	$e$
degree	2	3	2	1	0

## graph terminology: adjacent

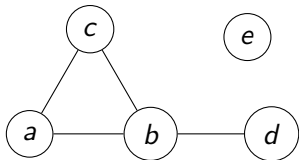
Two vertices are adjacent iff there is an edge between them.



	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>
<i>a</i>		✓	✓		
<i>b</i>	✓		✓	✓	
<i>c</i>	✓	✓			
<i>d</i>		✓			
<i>e</i>					

	is adjacent to
<i>a</i>	<i>b, c</i>
<i>b</i>	<i>a, c, d</i>
<i>c</i>	<i>a, b</i>
<i>d</i>	<i>b</i>
<i>e</i>	

## storing a graph: adjacency matrix



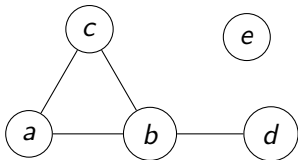
	<i>a</i>	<i>b</i>	<i>c</i>	<i>d</i>	<i>e</i>
<i>a</i>		✓	✓		
<i>b</i>	✓		✓	✓	
<i>c</i>	✓	✓			
<i>d</i>		✓			
<i>e</i>					

Adjacency matrix = store this in a \_\_\_\_\_

Let  $n = |V|$  and  $m = |E|$ . Then in terms of  $n$  and  $m$ :

- space:
- “who are adjacent to  $v$ ?” time:
- “are  $v$  and  $w$  adjacent?” time:

## storing a graph: adjacency lists



	is adjacent to
<i>a</i>	<i>b, c</i>
<i>b</i>	<i>a, c, d</i>
<i>c</i>	<i>a, b</i>
<i>d</i>	<i>b</i>
<i>e</i>	

Adjacency lists = store this in a \_\_\_\_\_

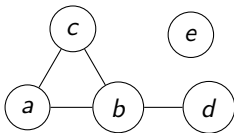
Let  $n = |V|$  and  $m = |E|$ . Then in terms of  $n$ ,  $m$ , and  $degree(v)$ :

- space:
- “who are adjacent to  $v$ ?” time:
- “are  $v$  and  $w$  adjacent?” time:
- optimal for graph searches

## graph terminology: (simple) path, reachable

A (simple) path is a non-empty sequence of vertices in which

- consecutive vertices are adjacent
- vertices are distinct



$\langle d \rangle$  is a path, length 0.

$\langle d, b, c \rangle$  is a path, length 2.

$\langle d, b, c, b \rangle$  is not a (simple) path.

$\langle d, a, b \rangle$  is not a path.

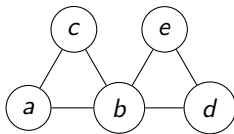
$v$  is reachable from  $u$  iff there is a path from  $u$  to  $v$ .



## graph terminology: (simple) cycle

A (simple) cycle is a non-empty sequence of vertices in which

- consecutive vertices are adjacent
- first vertex = last vertex
- vertices are distinct except first=last; edges used are distinct
- $\langle v \rangle$  is not a cycle



$\langle b, c, a, b \rangle$  is a simple cycle, length 3. ( $\langle b, c, a \rangle$  in some books.)

$\langle b, c, a, b, d, e, b \rangle$  is not a (simple) cycle:

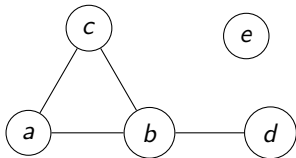
$\langle b, d, b \rangle$  is not a cycle:

## graph terminology: (dis)connected, component

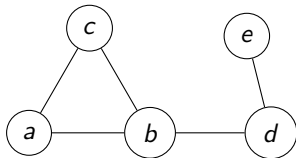
A graph is connected iff between every two distinct vertices there is a path.

A graph is disconnected iff it is not connected.

Disconnected:



Connected:



Component: maximal subset of vertices reachable from each other.  
(Sometimes also include their edges.)

E.g., the graph on the left has two components:

## tree: definition and results

A tree is a graph that is connected and has no cycles.

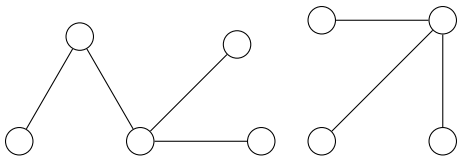
Equivalently:

- between every two vertices, a unique simple path
- connected, but disconnected if any edge removed
- connected, and  $|E| = |V| - 1$
- no cycles, but has a cycle if any edge added
- no cycles, and  $|E| = |V| - 1$

Exercise: convince yourself that these are equivalent!

## graph terminology: forest

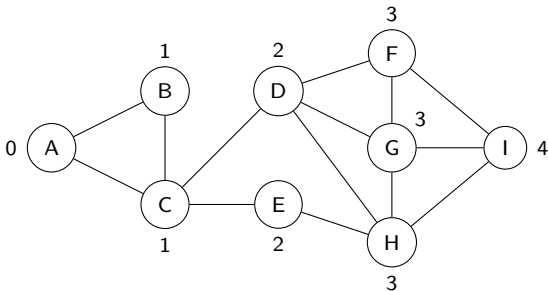
A forest is a collection of trees (may be disconnected). A forest has no cycles.



# Breadth-First Search

Specify or arbitrarily pick a start vertex.

0. visit the start vertex
1. visit vertices 1 edge away from the above
2. visit unvisited vertices 1 edge away from the above
3. visit unvisited vertices 1 edge away from the above
4. ...

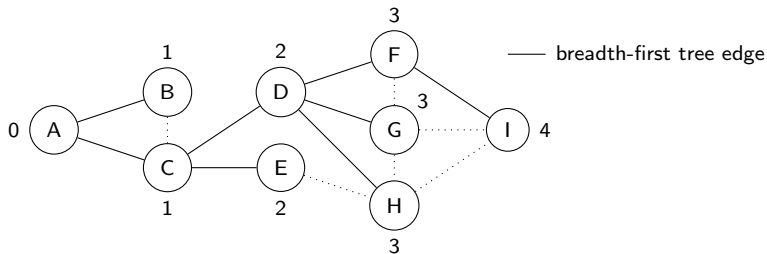


## Breadth-First Search

```
0. start := pick a vertex
1. queue := new Queue()
2. queue.enqueue(start)
3. mark start as seen
   // distance(start) = 0

4. while not queue.is_empty():
5.   u := queue.dequeue()
6.   for each v in u's adjacency list:
7.     if v is not seen:
8.       queue.enqueue(v)
9.       mark v as seen
       // edge {u,v} is a "breadth-first tree edge"
       // u is v's "predecessor"
       // distance(v) = distance(u) + 1
```

# Breadth-First Search



BFS finds:

- whether a vertex is reachable from *start*
- if yes, a shortest path and distance
- a tree consisting of the reachable vertices from *start*
- the component containing *start*

Shortest paths and the tree are non-unique:

## Breadth-First Search

BFS running time:

1. we enqueue and dequeue each vertex once:
  -
2. we consider each edge twice:
  -
3. we find each vertex's adjacency list once:
  -
4. check  $v$ 's "seen" status  $deg(v)$  times:
  -

Assume  $\Theta(1)$  time for

- marking/checking a vertex's "seen" status
- finding a vertex's adjacency list

Then BFS total time:

Exercise: What if the assumption doesn't hold?

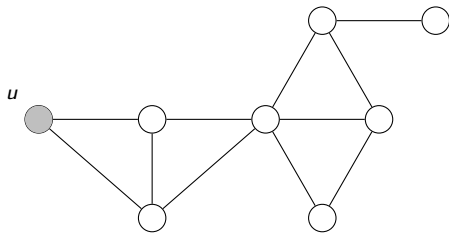


## Depth-First Search

Specify or arbitrarily pick a start vertex.

0. visit the start vertex
1. choose one adjacent, unvisited vertex of the previous; visit it
2. choose one adjacent, unvisited vertex of the previous; visit it
3. ...
4. whenever you have no choice, backtrack to the last time you had a choice, choose another one

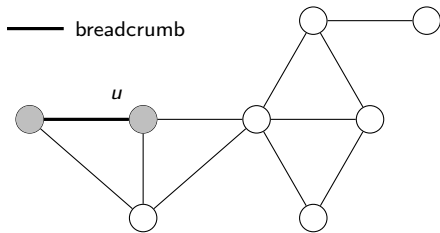
## Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

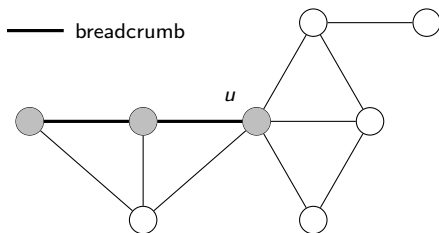
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

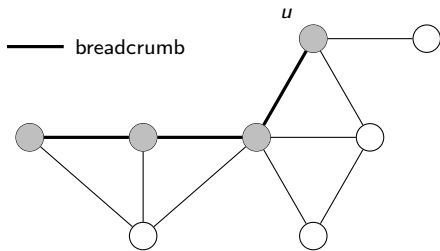
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

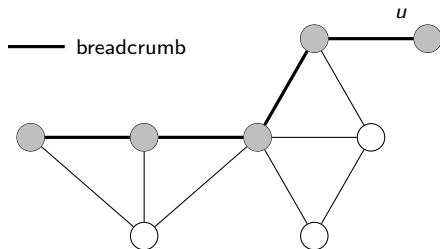
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

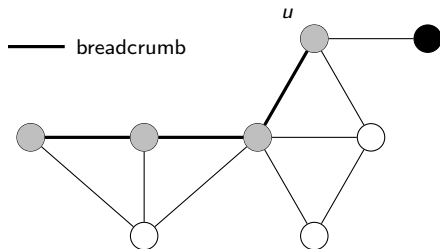
## Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

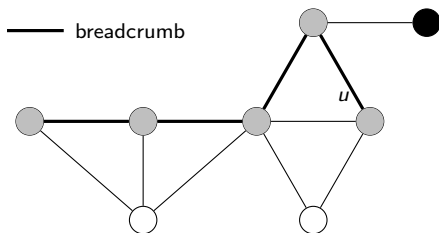
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

# Depth-First Search

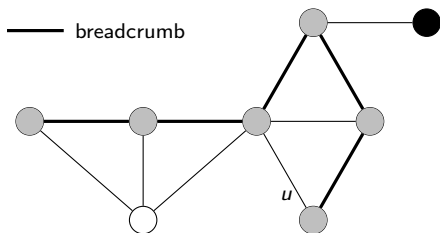


(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit



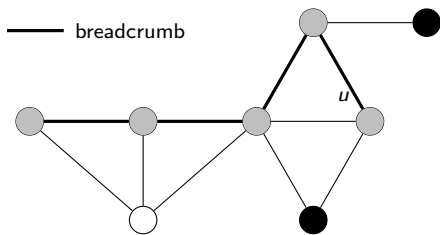
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

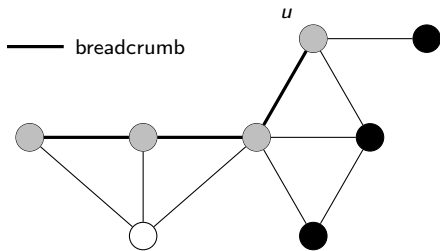
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

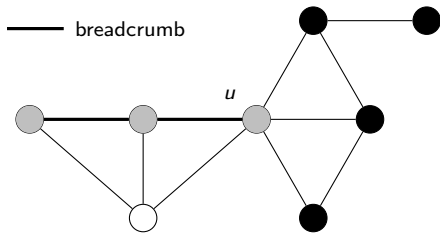
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

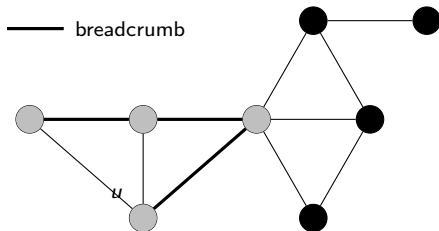
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

choose an adjacent, unvisited vertex to visit

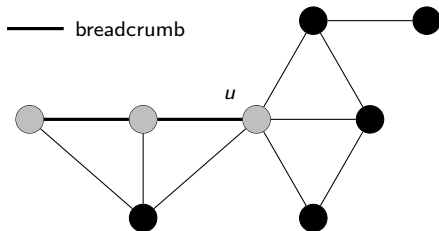
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

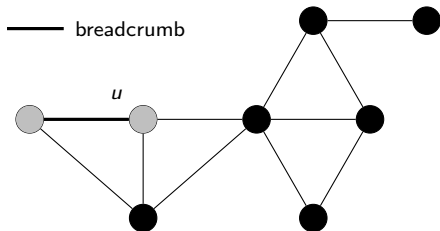
# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

# Depth-First Search



(White: unvisited. Gray: in progress. Black: done.)

no adjacent, unvisited vertex; backtrack

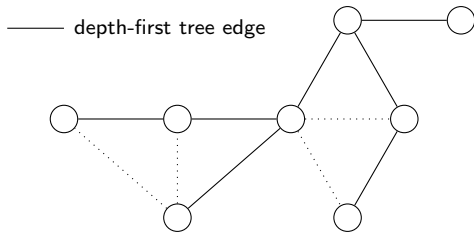




## Depth-First Search

0. mark all vertices white
1. time := 0
2. start := pick a vertex
3. DFS-visit(start)
4. DFS-visit(u):
  5. discovery-time(u) := ++time
  6. mark u gray
  7. for each v in u's adjacency list:
    8. if v is white:
      - // edge {u,v} is a depth-first tree edge
      - // predecessor(v) = u
    9. DFS-visit(v)
  10. mark u black
  11. finish-time(u) := ++time

# Depth-First Search



DFS finds:

- whether a vertex is reachable from *start*
- a tree consisting of the reachable vertices from *start*
- the component containing *start*
- (with a small modification) whether a cycle exists

# Depth-First Search

DFS running time:

1. we visit each vertex once:
  -
2. we consider each edge twice:
  -
3. we find each vertex's adjacency list once:
  -
4. check  $v$ 's colour  $deg(v)$  times:
  -

Assume  $\Theta(1)$  time for

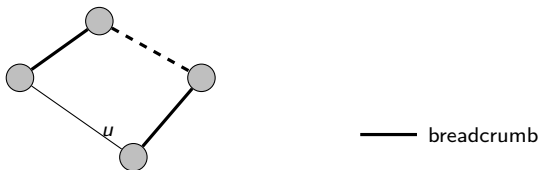
- marking/checking a vertex's colour
- finding a vertex's adjacency list

Then DFS total time:

Exercise: What if the assumption doesn't hold?

## cycle detection

During DFS, if something like this happens:



When  $u$  has an edge to a gray vertex that is not its predecessor.

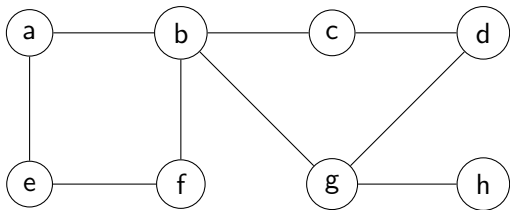
Then it must be because... you have found a cycle.

Conversely, if this never happens, there is no cycle. (Harder to prove.)

## cycle detection

0. mark all vertices white
1. for each vertex  $s$ :
2.   if  $s$  is white:
3.     if `has-cycle( $s$ )`: return True
4. return False
  
5. `has-cycle( $u$ )`:
6.   mark  $u$  gray
7.   for each  $v$  in  $u$ 's adjacency list:
8.     if  $v$  is white:
9.       `predecessor( $v$ ) =  $u$`
10.       if `has-cycle( $v$ )`: return True
11.     elif  $v$  is gray and  $v$  is not `predecessor( $u$ )`:
12.       return True
13.   mark  $u$  black
14.   return False

## cycle detection: example



## directed graph

A directed graph  $G$  is a pair  $(V, E)$  of:

- $V$  — a set of vertices
- $E$  — a set of edges, where an edge is a pair of vertices (usually, we disallow edges from a vertex to itself)

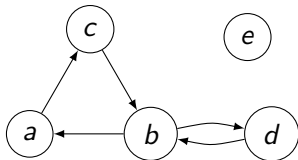
Each edge specifies one direction.

$(a, b)$  lets you go from  $a$  to  $b$ , if present.

$(b, a)$  lets you go from  $b$  to  $a$ , if present.

Many definitions need small modifications.

## storing a directed graph: adjacency lists



	adjacency list
<i>a</i>	<i>c</i>
<i>b</i>	<i>a, d</i>
<i>c</i>	<i>b</i>
<i>d</i>	<i>b</i>
<i>e</i>	

“*c* is adjacent to *a*”, but not “*a* is adjacent to *c*”.

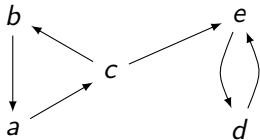


## directed graph: modified definitions

- out-degree: how many edges go out of a vertex  
in-degree: how many edges go into a vertex  
degree: out-degree + in-degree
- path, reachable: must comply with edge directions  
path  $\langle v_0, \dots, v_k \rangle$  requires  $(v_0, v_1) \in E, \dots, (v_{k-1}, v_k) \in E$
- cycle: must comply with edge directions  
cycle  $\langle v_0, \dots, v_{k-1}, v_0 \rangle$  requires  $(v_0, v_1) \in E, \dots,$   
 $(v_{k-1}, v_0) \in E$   
Note:  $\langle b, d, b \rangle$  is a simple cycle this time:  $(b, d)$  and  $(d, b)$   
are two different edges.
- BFS, DFS: no change needed because:
  -

## directed graph: BFS/DFS

BFS/DFS depend on the choice of the start vertex:

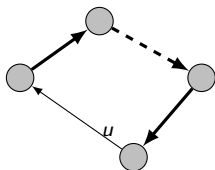


- will visit every vertex if start at:
- will not visit every vertex if start at:

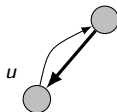
(Unlike in undirected graphs.)

## directed graph: cycle detection

If something like this happens:



OR



→ breadcrumb

- if we encounter an edge to a gray vertex, then
- 

Different from undirected graphs.

## directed graph: cycle detection

0. mark all vertices white
1. for each vertex s:
  2. if s is white:
    3. if has-cycle(s): return True
4. return False
  
5. has-cycle(u):
  6. mark u gray
  7. for each v in u's adjacency list:
    8. if v is white:
      9. if has-cycle(v): return True
    10. elif v is gray:
      11. return True
  12. mark u black
  13. return False