

# Directed Graph Algorithms

CSE 373

## Readings

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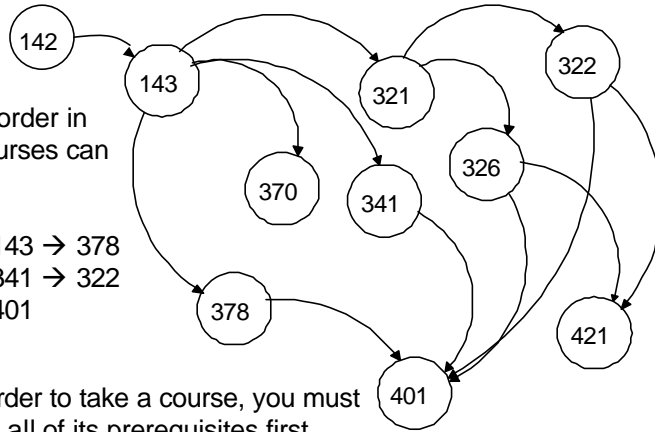
- Reading
  - › Goodrich and Tamassia, chapter 12

# Topological Sort

**Problem:** Find an order in which all these courses can be taken.

Example: 142 → 143 → 378  
→ 370 → 321 → 341 → 322  
→ 326 → 421 → 401

In order to take a course, you must take all of its prerequisites first



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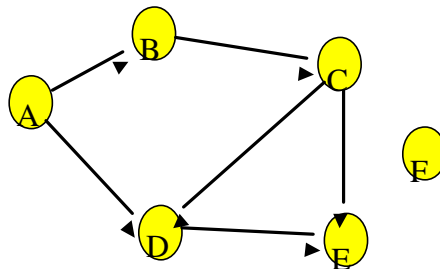
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# Topological Sort

Given a digraph  $G = (V, E)$ , find a linear ordering of its vertices such that:

for any edge  $(v, w)$  in  $E$ ,  $v$  precedes  $w$  in the ordering

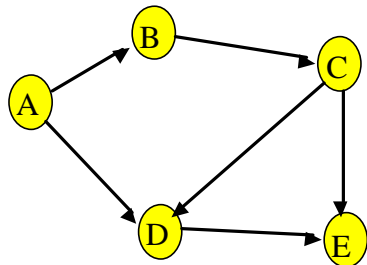


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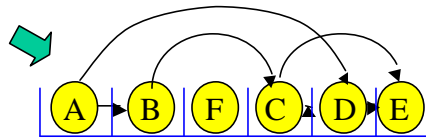
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## Topo sort - good example



Any linear ordering in which all the arrows go to the right is a valid solution



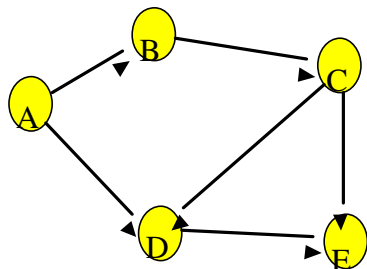
Note that F can go anywhere in this list because it is not connected.  
Also the solution is not unique.

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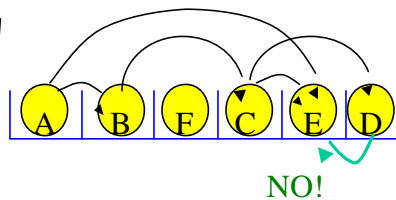
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## Topo sort - bad example



Any linear ordering in which an arrow goes to the left is not a valid solution



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## Paths and Cycles

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- Given a digraph  $G = (V, E)$ , a **path** is a sequence of vertices  $v_1, v_2, \dots, v_k$  such that:
  - ›  $(v_i, v_{i+1})$  in  $E$  for  $1 \leq i < k$
  - › path **length** = number of edges in the path
  - › path **cost** = sum of costs of each edge
- A path is a **cycle** if :
  - ›  $k > 1$ ;  $v_1 = v_k$
- $G$  is **acyclic** if it has no cycles.

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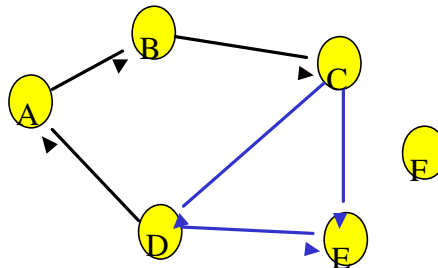
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## Only acyclic graphs can be topo. sorted

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- A directed graph with a cycle cannot be topologically sorted.



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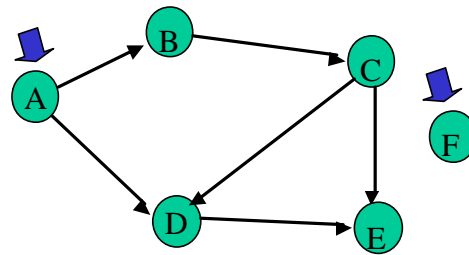
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## Topo sort algorithm - 1

Step 1: Identify vertices that have no incoming edges

- The “in-degree” of these vertices is zero



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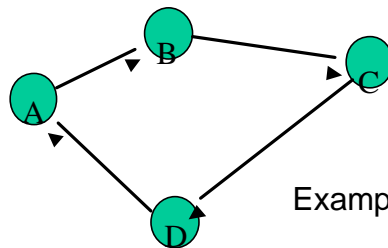
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## Topo sort algorithm - 1a

Step 1: Identify vertices that have no incoming edges

- If *no such vertices*, graph has only cycle(s) (cyclic graph)
- Topological sort not possible – Halt.



Example of a cyclic graph

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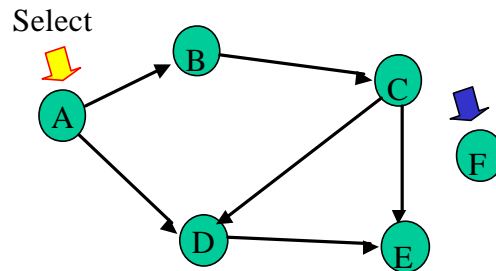
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## Topo sort algorithm - 1b

Step 1: Identify vertices that have no incoming edges

- Select one such vertex



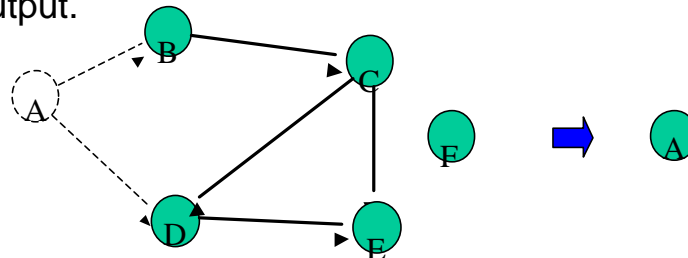
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## Topo sort algorithm - 2

Step 2: Delete this vertex of in-degree 0 and all its outgoing edges from the graph. Place it in the output.



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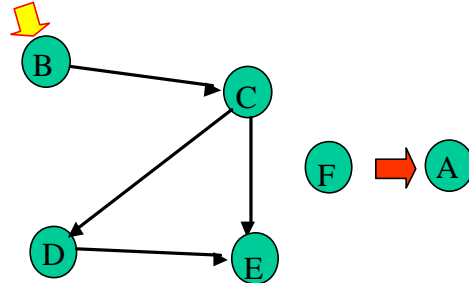
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## Continue until done

Repeat Step 1 and Step 2 until graph is empty

Select



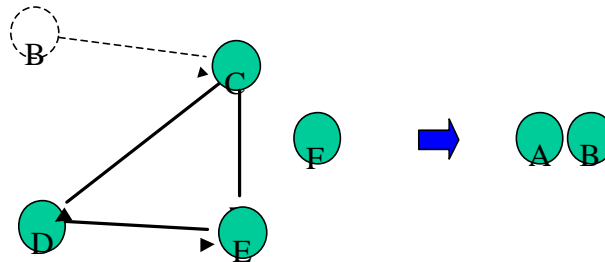
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## B

Select B. Copy to sorted list. Delete B and its edges.



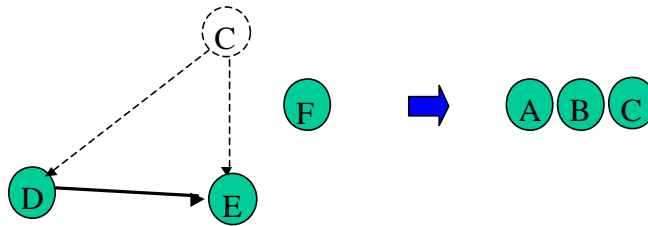
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C

Select C. Copy to sorted list. Delete C and its edges.



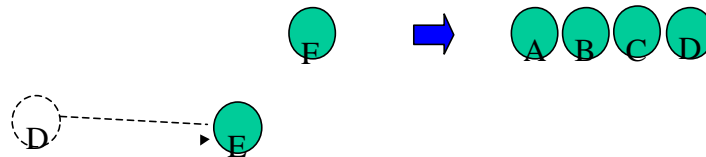
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D

Select D. Copy to sorted list. Delete D and its edges.



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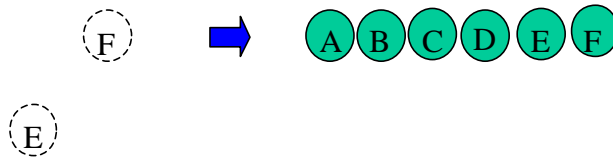
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# E, F

Select E. Copy to sorted list. Delete E and its edges.  
Select F. Copy to sorted list. Delete F and its edges.

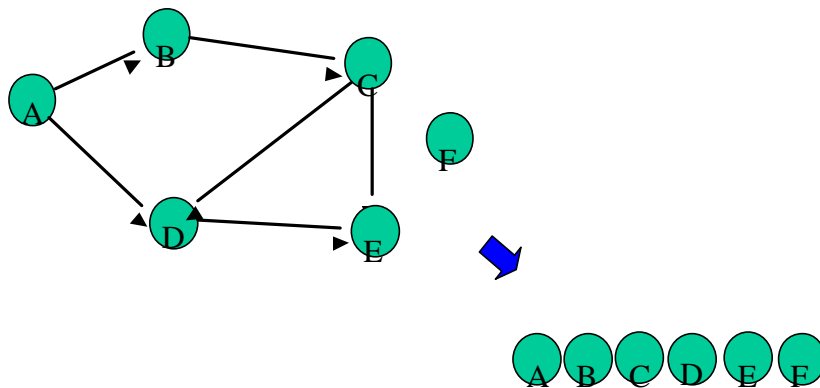


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# Done

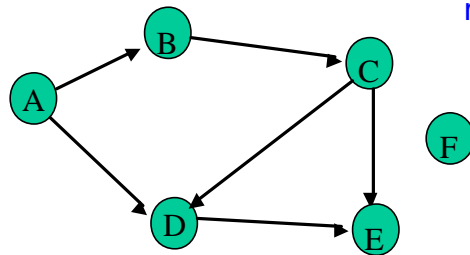


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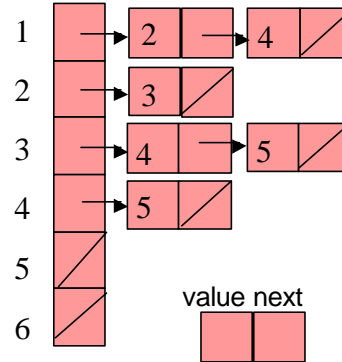
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# Implementation

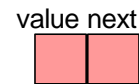


Assume adjacency list representation



Translation array

1	2	3	4	5	6
A	B	C	D	E	F

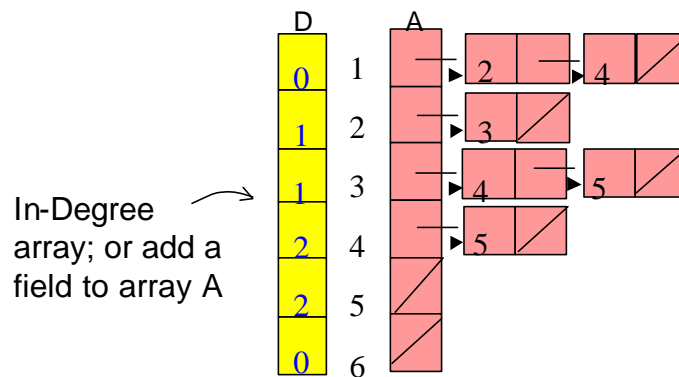


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# Calculate In-degrees



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## Calculate In-degrees

```

for i = 1 to n do D[i] := 0; endfor
for i = 1 to n do
  x := A[i];
  while x ≠ null do
    D[x.value] := D[x.value] + 1;
    x := x.next;
  endwhile
endfor

```

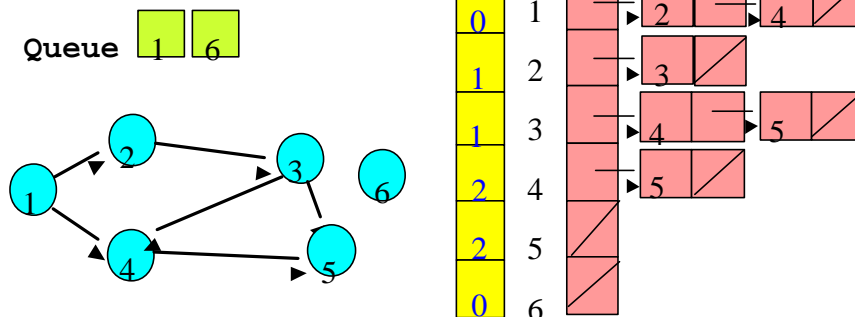
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## Maintaining Degree 0 Vertices

Key idea: Initialize and maintain a *queue* (or *stack*)  
of **vertices with In-Degree 0**



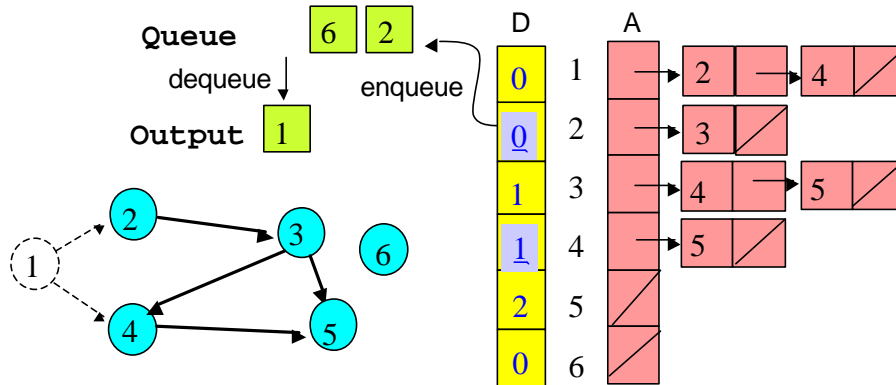
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## Topo Sort using a Queue (breadth-first)

After each vertex is output, when updating In-Degree array, enqueue any vertex whose In-Degree becomes zero



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## Topological Sort Algorithm

1. Store each vertex's In-Degree in an array D
2. Initialize queue with all "in-degree=0" vertices
3. While there are vertices remaining in the queue:
  - (a) Dequeue and output a vertex
  - (b) Reduce In-Degree of all vertices adjacent to it by 1
  - (c) Enqueue any of these vertices whose In-Degree became zero
4. If all vertices are output then success, otherwise there is a cycle.

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## Some Detail

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```
Main Loop
while notEmpty(Q) do
  x := Dequeue(Q)
  Output(x)
  y := A[x];
  while y ≠ null do
    D[y.value] := D[y.value] - 1;
    if D[y.value] = 0 then Enqueue(Q,y.value);
    y := y.next;
  endwhile
endwhile
```

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## Topological Sort Analysis

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- Initialize In-Degree array:  $O(|V| + |E|)$
- Initialize Queue with In-Degree 0 vertices:  $O(|V|)$
- Dequeue and output vertex:
  - ›  $|V|$  vertices, each takes only  $O(1)$  to dequeue and output:  $O(|V|)$
- Reduce In-Degree of all vertices adjacent to a vertex and Enqueue any In-Degree 0 vertices:
  - ›  $O(|E|)$
- For input graph  $G=(V,E)$  run time =  $O(|V| + |E|)$ 
  - › Linear time!

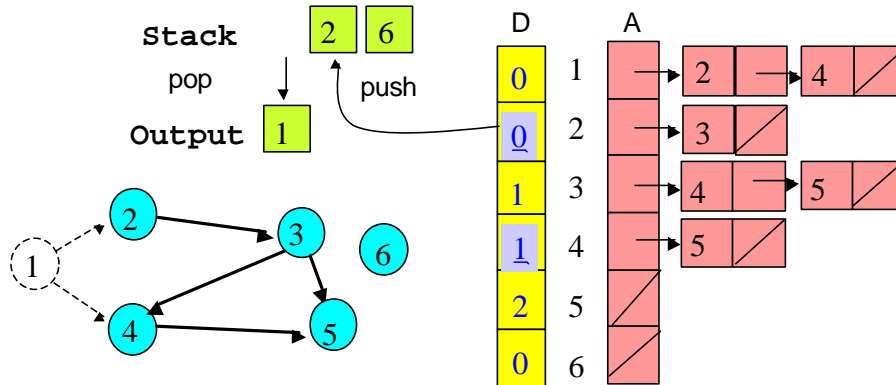
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## Topo Sort using a Stack (depth-first)

After each vertex is output, when updating In-Degree array, *push any vertex whose In-Degree becomes zero*



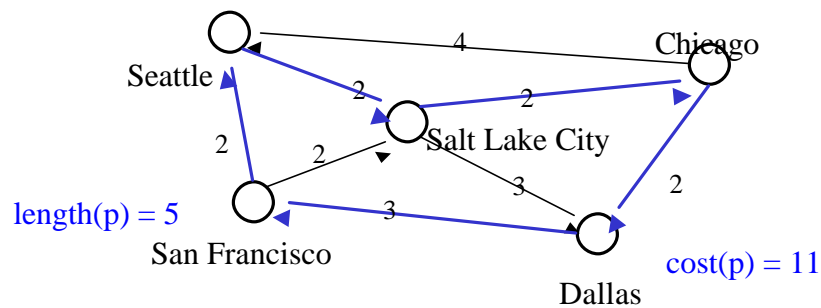
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## Recall Path cost ,Path length

- **Path cost:** the sum of the costs of each edge
- **Path length:** the number of edges in the path
  - › Path length is the unweighted path cost



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## Shortest Path Problems

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- Given a graph  $G = (V, E)$  and a “source” vertex  $s$  in  $V$ , find the [minimum cost paths](#) from  $s$  to every vertex in  $V$
- [Many variations](#):
  - › unweighted vs. weighted
  - › cyclic vs. acyclic
  - › pos. weights only vs. pos. and neg. weights
  - › etc

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## Why study shortest path problems?

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- [Traveling on a budget](#): What is the cheapest airline schedule from Seattle to city  $X$ ?
- [Optimizing routing of packets on the internet](#):
  - › Vertices are routers and edges are network links with different delays. What is the routing path with smallest total delay?
- [Shipping](#): Find which highways and roads to take to minimize total delay due to traffic
- etc.

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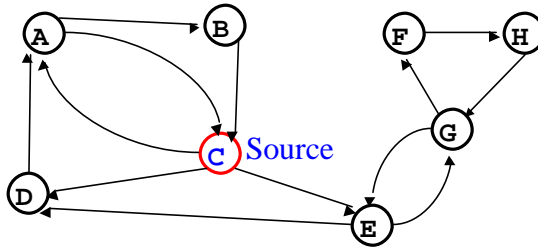
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# Unweighted Shortest Path

**Problem:** Given a “source” vertex  $s$  in an unweighted directed graph

$G = (V, E)$ , find the shortest path from  $s$  to all vertices in  $G$

Only interested  
in path lengths



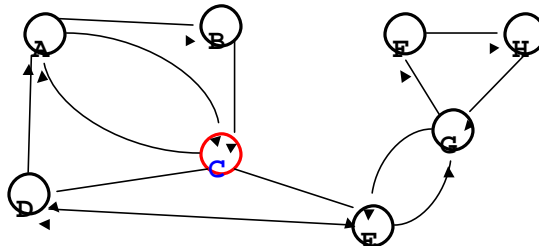
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# Breadth-First Search Solution

- **Basic Idea:** Starting at node  $s$ , find vertices that can be reached using 0, 1, 2, 3, ...,  $N-1$  edges (works even for cyclic graphs!)



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## Breadth-First Search Alg.

- Uses a queue to track vertices that are “nearby”
- source vertex is **s**

```
Distance[s] := 0
Enqueue(Q,s); Mark(s)//After a vertex is marked once
// it won't be enqueued again
while queue is not empty do
  X := Dequeue(Q);
  for each vertex Y adjacent to X do
    if Y is unmarked then
      Distance[Y] := Distance[X] + 1;
      Previous[Y] := X;//if we want to record paths
      Enqueue(Q,Y); Mark(Y);
```

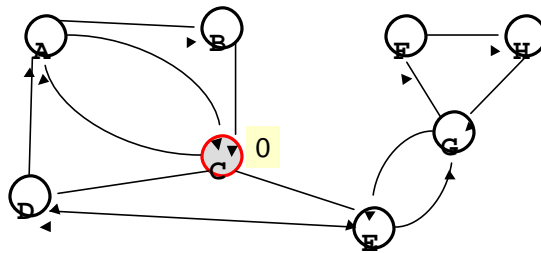
- Running time =  $O(|V| + |E|)$

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## Example: Shortest Path length



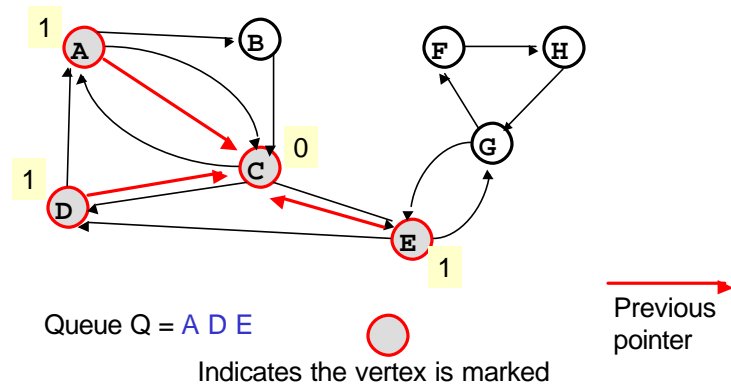
Queue Q = C

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## Example (ct'd)

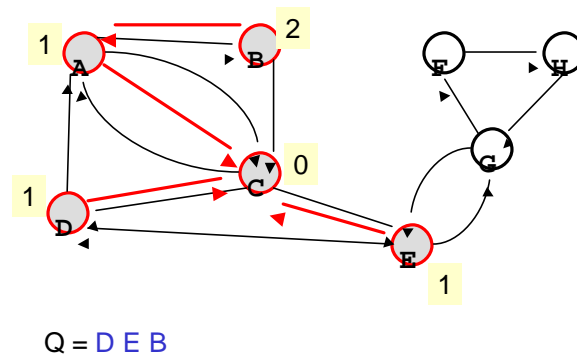


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## Example (ct'd)

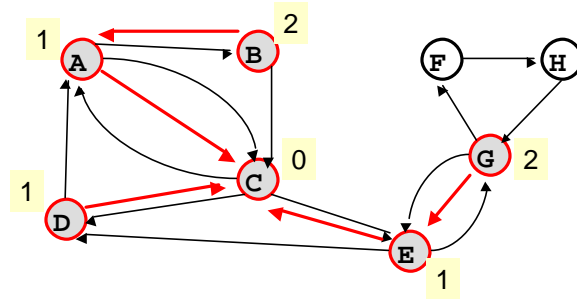


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## Example (ct'd)



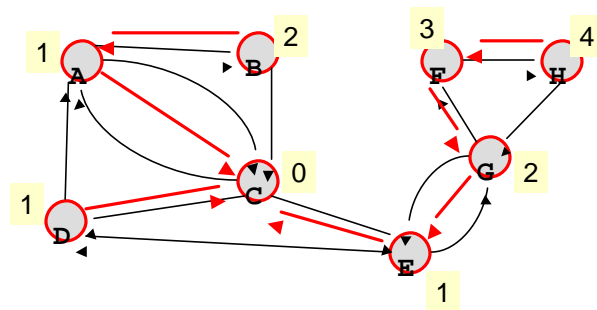
Q = B G

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## Example (ct'd)



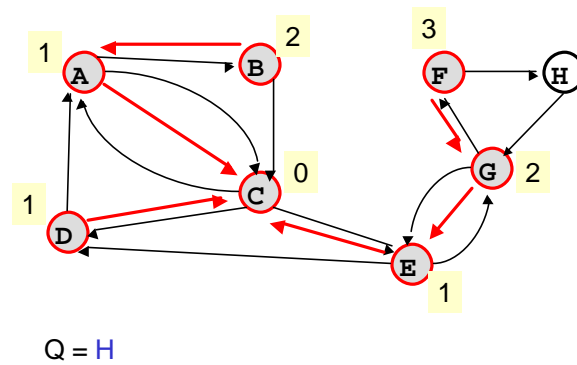
Q = F

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## Example (ct'd)



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## What if edges have weights?

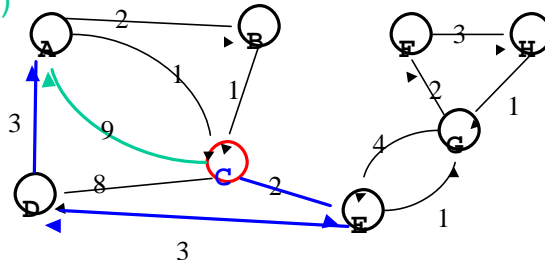
- Breadth First Search does not work anymore
  - › minimum *cost* path may have more edges than minimum *length* path

Shortest path (length)  
from C to A:

C → A (cost = 9)

Minimum Cost

Path = C → E → D → A  
(cost = 8)



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## Dijkstra's Algorithm for Weighted Shortest Path

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- Classic algorithm for solving shortest path in weighted graphs (without negative weights)
- A greedy algorithm (irrevocably makes decisions without considering future consequences)
- Each vertex has a cost for path from initial vertex

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## Basic Idea of Dijkstra's Algorithm

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- Find the vertex with smallest cost that has not been "marked" yet.
- Mark it and compute the cost of its neighbors.
- Do this until all vertices are marked.
- Note that each step of the algorithm we are marking one vertex and we won't change our decision: hence the term "greedy" algorithm

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