



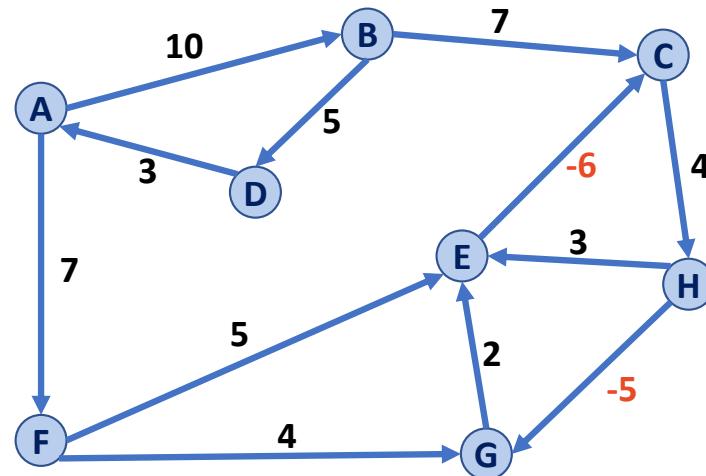
# CS 225

## Data Structures

*April 29 – Floyd-Warshall’s Algorithm*  
*Wade Fagen-Ulmschneider, Craig Zilles*

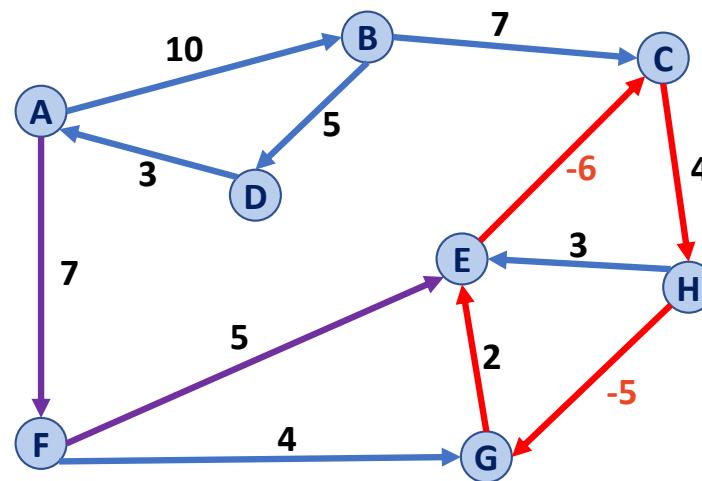
# Dijkstra's Algorithm (SSSP)

Q: How does Dijkstra handle negative weight cycles?



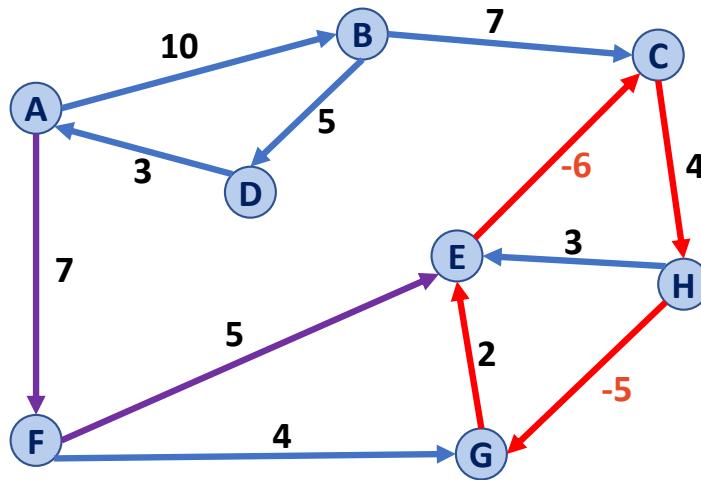
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# Dijkstra's Algorithm (SSSP)

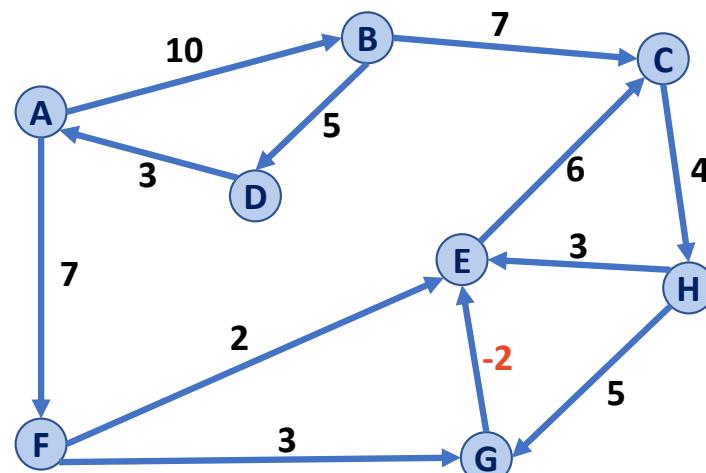
Q: How does Dijkstra handle negative weight cycles?



Shortest Path ( $A \rightarrow E$ ):  $A \rightarrow F \rightarrow E$   $\rightarrow (C \rightarrow H \rightarrow G \rightarrow E)^*$   
Length: 12      Length: -5 (repeatable)

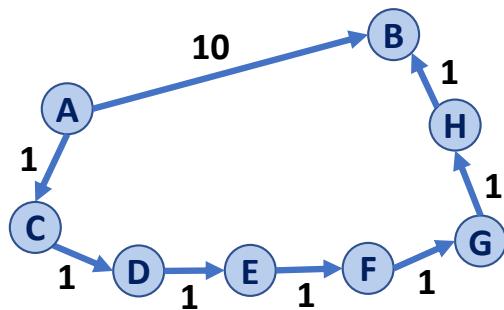
# Dijkstra's Algorithm (SSSP)

**Q:** How does Dijkstra handle negative weight edges, without a negative weight cycle?



## Dijkstra's Algorithm (SSSP)

**Q:** How does Dijkstra handle a single heavy-weight path vs. many light-weight paths?



# Dijkstra's Algorithm (SSSP)

What is Dijkstra's running time?

```
      DijkstraSSSP(G, s):
6        foreach (Vertex v : G):
7          d[v] = +inf
8          p[v] = NULL
9          d[s] = 0
10
11         PriorityQueue Q // min distance, defined by d[v]
12         Q.buildHeap(G.vertices())
13         Graph T           // "labeled set"
14
15         repeat n times:
16           Vertex u = Q.removeMin()
17           T.add(u)
18           foreach (Vertex v : neighbors of u not in T):
19             if cost(u, v) + d[u] < d[v]:
20               d[v] = cost(u, v) + d[u]
21               p[v] = m
22
23         return T
```

# Floyd-Warshall Algorithm

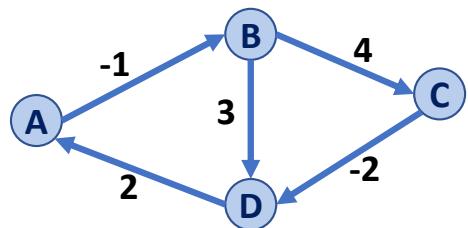
Floyd-Warshall's Algorithm is an alterative to Dijkstra in the presence of **negative-weight edges (not negative weight cycles)**.

```
6   FloydWarshall(G) :  
7       Let d be a adj. matrix initialized to +inf  
8       foreach (Vertex v : G):  
9           d[v][v] = 0  
10      foreach (Edge (u, v) : G):  
11          d[u][v] = cost(u, v)  
12      foreach (Vertex u : G):  
13          foreach (Vertex v : G):  
14              foreach (Vertex w : G):  
15                  if d[u, v] > d[u, w] + d[w, v]:  
16                      d[u, v] = d[u, w] + d[w, v]
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# Floyd-Warshall Algorithm

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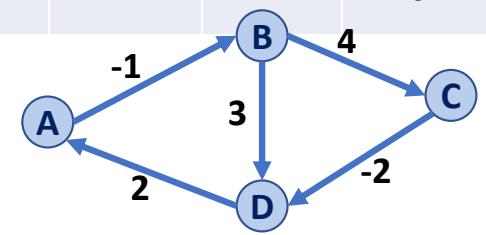
	A	B	C	D
A				
B				
C				
D				



# Floyd-Warshall Algorithm

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12     foreach (Vertex u : G):  
13         foreach (Vertex v : G):  
14             foreach (Vertex k : G):  
15                 if d[u, v] > d[u, k] + d[k, v]:  
16                     d[u, v] = d[u, k] + d[k, v]
```

	A	B	C	D
A	0	-1	$\infty$	$\infty$
B	$\infty$	0	4	3
C	$\infty$	$\infty$	0	-2
D	2	$\infty$	$\infty$	0

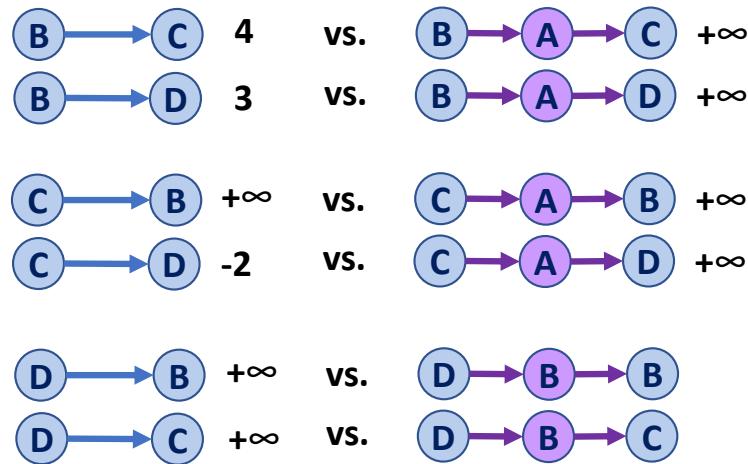


# Floyd-Warshall Algorithm

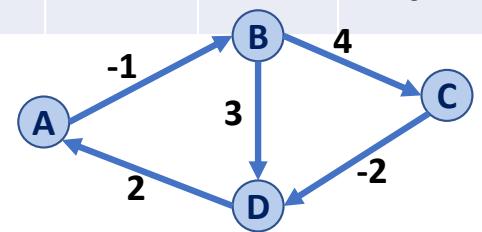
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15                 if d[u, v] > d[u, k] + d[k, v]:
16                     d[u, v] = d[u, k] + d[k, v]
    
```

Let us consider k=A:



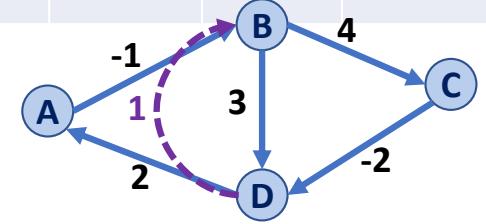
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# Floyd-Warshall Algorithm

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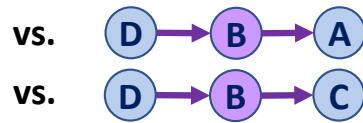
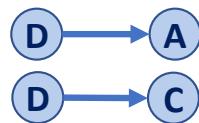
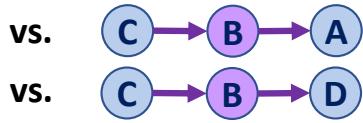
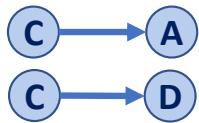
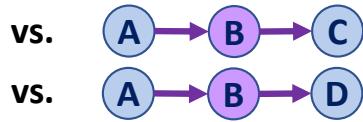
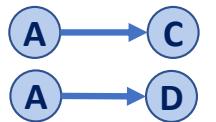


# Floyd-Warshall Algorithm

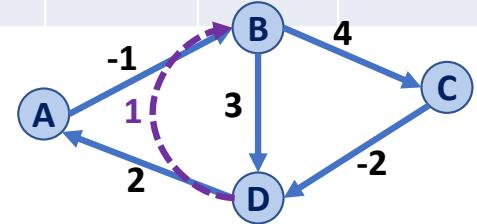
```

12     foreach (Vertex u : G):
13         foreach (Vertex v : G):
14             foreach (Vertex k : G):
15                 if d[u, v] > d[u, k] + d[k, v]:
16                     d[u, v] = d[u, k] + d[k, v]
    
```

Let us consider k=B:



	A	B	C	D
A	0	-1	$\infty$	$\infty$
B	$\infty$	0	4	3
C	$\infty$	$\infty$	0	-2
D	2	1	$\infty$	0



# Floyd-Warshall Algorithm Intuition

Consider a graph  $G$  with vertices  $V$  numbered 1 through  $N$ .

Consider the function  $\text{shortestPath}(i, j, k)$  that returns the shortest possible path from  $i$  to  $j$  using only vertices from the set  $\{1, 2, \dots, k\}$  as intermediate vertices.

Clearly,  $\text{shortestPath}(i, j, N)$  returns \_\_\_\_\_

# Floyd-Warshall Algorithm Intuition

For each pair of vertices, the  $\text{shortestPath}(i, j, k)$  could be either

- (1) a path that **doesn't** go through  $k$  (only uses vertices in the set  $\{1, \dots, k-1\}$ .)
- (2) a path that **does** go through  $k$  (from  $i$  to  $k$  and then from  $k$  to  $j$ , both only using intermediate vertices in  $\{1, \dots, k-1\}$ )

# Floyd-Warshall Algorithm Intuition

If  $w(i,j)$  is the weight of the edge between vertices  $i$  and  $j$ , we can recursively define  $\text{shortestPath}(i,j,k)$  as:

$\text{shortestPath}(i, j, 0) =$  *// base case*

$\text{shortestPath}(i, j, k) = \min($  *// recursive*  
     $)$

# Floyd-Warshall Algorithm Intuition

If  $w(i,j)$  is the weight of the edge between vertices  $i$  and  $j$ , we can recursively define  $\text{shortestPath}(i,j,k)$  as:

$$\text{shortestPath}(i, j, 0) = w(i, j) \quad // \text{base case}$$

$$\begin{aligned} \text{shortestPath}(i, j, k) &= \min( \text{shortestPath}(i, j, k-1), \quad // \text{recursive} \\ &\quad \text{shortestPath}(i, k, k-1) + \text{shortestPath}(k, j, k-1) ) \end{aligned}$$

# Floyd-Warshall Algorithm

## Running Time?

```
6   FloydWarshall(G) :  
7       Let d be a adj. matrix initialized to +inf  
8       foreach (Vertex v : G):  
9           d[v][v] = 0  
10      foreach (Edge (u, v) : G):  
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15                  if d[u, v] > d[u, w] + d[w, v]:  
16                      d[u, v] = d[u, w] + d[w, v]
```



# Final Exam Review Session

- Implementations
  - Edge List
  - Adjacency Matrix
  - Adjacency List
- Traversals
  - Breadth First
  - Depth First
- Minimum Spanning Tree
  - Kruskal's Algorithm
  - Prim's Algorithm
- Shortest Path
  - Dijkstra's Algorithm
  - Floyd-Warshall's Algorithm

*...and this is just the beginning. The journey continues to CS 374!*