

Introduction to Graphs

<http://people.cs.clemson.edu/~pargas/courses/cs212/common/notes/ppt/>

Introduction: Formal Definition

- A **directed** graph, or **digraph**, is a graph in which the edges are ordered pairs
 - $(v, w) \neq (w, v)$
- An **undirected** graph is a graph in which the edges are unordered pairs
 - $(v, w) == (w, v)$

Slide 4

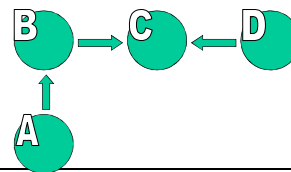
Introduction

- Graphs are a generalization of trees
 - Nodes or vertices
 - Edges or arcs
- Two kinds of graphs
 - Directed
 - Undirected

Slide 2

Introduction: Directed Graphs

- In a directed graph, the edges are arrows.
- Directed graphs show the flow from one node to another and not vice versa.



Slide 5

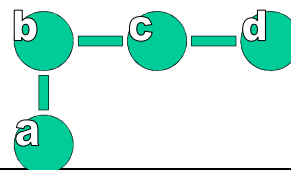
Introduction: Formal Definition

- A graph $G = (V, E)$ consists of a finite set of vertices, V , and a finite set of edges E .
- Each edge is a pair (v, w) where $v, w \in V$

Slide 3

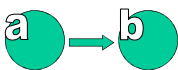
Introduction: Undirected Graphs

- In a directed graph, the edges are lines.
- Directed graphs show a relationship between two nodes.



Slide 6

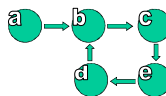
Terminology



- In the directed graph above, b is **adjacent** to a because $(a, b) \in E$. Note that a is *not* adjacent to b.
- A is a **predecessor** of node B
- B is a **successor** of node A
- The **source** of the edge is node A, the **target** is node B

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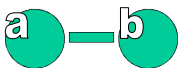
Terminology



- An **acyclic path** is a path where each vertex is unique
- A **cyclic path** is a path such that
 - There are at least two vertices on the path
 - $w_1 = w_n$ (path starts and ends at same vertex)

Slide 10

Terminology



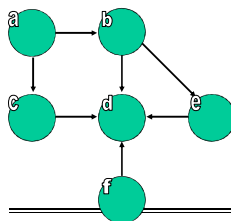
- In the undirected graph above, a and b are **adjacent** because $(a, b) \in E$. a and b are called **neighbors**.

Slide 8

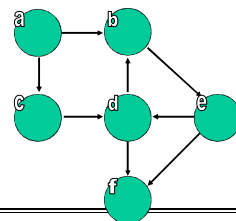
Test Your Knowledge

Cyclic or Acyclic?

1.

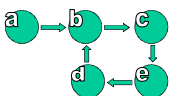


2.



Slide 11

Terminology



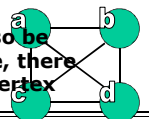
- A **path** is a sequence of vertices w_1, w_2, \dots, w_n such that $(w_i, w_{i+1}) \in E$, $1 \leq i < n$, and each vertex is unique except that the path may start and end on the same vertex
- The **length** of the path is the number of edges along the path

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Terminology

- A directed graph that has *no* cyclic paths is called a **DAG** (a Directed Acyclic Graph).
- An undirected graph that has an edge between every pair of vertices is called a **complete** graph.

Note: A directed graph can also be a complete graph; in that case, there must be an edge from every vertex to every other vertex.



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Test Your Knowledge

Complete, or "Acomplete" (Not Complete)

1.

2.

Slide 13

Test Your Knowledge

Connected, Strongly connected, or Weakly connected

1.

2.

3.

4.

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Test Your Knowledge

Complete, or "Acomplete" (Not Complete)

1.

2.

Slide 14

Terminology

- A graph is known as a **weighted graph** if a weight or metric is associated with each edge.

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Terminology

- An undirected graph is **connected** if a path exists from every vertex to every other vertex
- A directed graph is **strongly connected** if a path exists from every vertex to every other vertex
- A directed graph is **weakly connected** if a path exists from every vertex to every other vertex, disregarding the direction of the edge

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Various types of graphs

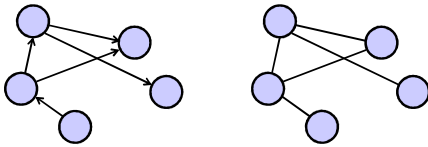
- Connected/disconnected graphs

- The circled subgraphs are also known as connected components

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Various types of graphs

- Directed/undirected graphs

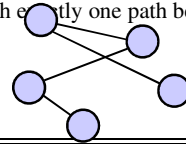


- You may treat each undirected edge as two directed edges in opposite directions

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Special graphs

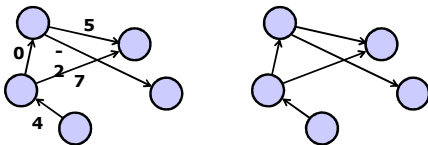
- Tree: either one of the followings is the definition
 - A connected graph with $|V|-1$ edges
 - A connected graph without cycles
 - A graph with exactly one path between every pair of vertices



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Various types of graphs

- Weighted/unweighted graphs

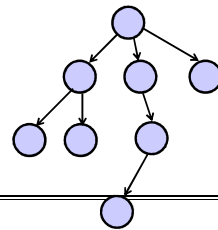


- You may treat unweighted edges to be weighted edges of equal weights

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Special graphs

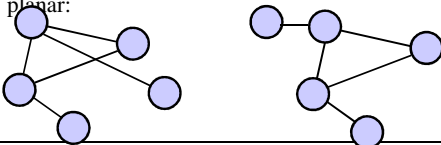
- Tree edges could be directed or undirected
- For trees with directed edges, a root usually exists



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Special graphs

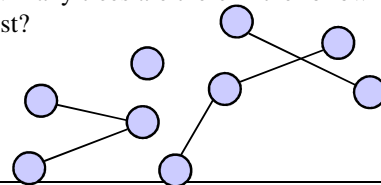
- Planar graphs
 - A graph that can be drawn on a plane without edge intersections
 - The following two graphs are equivalent and planar:



- To be discussed in details in Graph (III) ☺ Slide 21

Special graphs

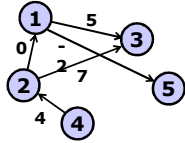
- Forest
 - All connected component(s) is/are tree(s)
- How many trees are there in the following forest?



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How to store graphs in the program?

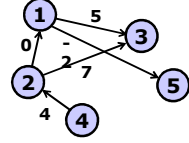
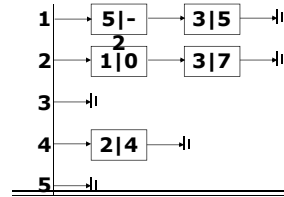
- Usually, the vertices are labeled beforehand
- 3 types of graph representations:
 - Adjacency matrix
 - Adjacency list
 - Edge list



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Adjacency list

- N vertices, N linked lists
- Each list stores its adjacent vertices

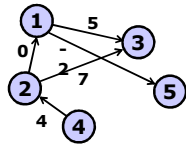


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Adjacency matrix

- Use a 2D array

s\t	1	2	3	4	5
1			5	-2	
2	0		7		
3					
4		4			
5					



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Adjacency list

- Memory complexity?
- Time complexity for:
 - Checking the weight of an edge between 2 given nodes?
 - Querying all adjacent nodes of a given node?

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Adjacency matrix

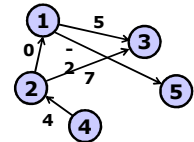
- Memory complexity?
- Time complexity for:
 - Checking the weight of an edge between 2 given nodes?
 - Querying all adjacent nodes of a given node?

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Edge list

- A list of edges

id	x	y	w
0	1	5	-2
1	2	1	0
2	1	3	5
3	2	3	7
4	4	2	4



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Edge list

- Memory complexity?
- Time complexity for:
 - Checking the weight of an edge between 2 given nodes?
 - Querying all adjacent nodes of a given node?

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Uses for Graphs

- **Two-Player Game Tree:** All of the possibilities in a board game like chess can be represented in a graph. Each vertex stands for one possible board position. (For chess, this is a very big graph!)

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Which one should be used?

- It depends on:
 - Constraints
 - Time Limit
 - Memory Limit
 - What algorithm is used

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Uses for Graphs

- **Computer network:** The set of vertices V represents the set of computers in the network. There is an edge (u, v) if and only if there is a direct communication link between the computers corresponding to u and v .

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Uses for Graphs

- **Precedence Constraints:** Suppose you have a set of jobs to complete, but some must be completed before others are begun. (For example, Atilla advises you always pillage before you burn.) Here the vertices are jobs to be done. Directed edges indicate constraints; there is a directed edge from job u to job v if job u must be done before job v is begun.

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Topological Sort

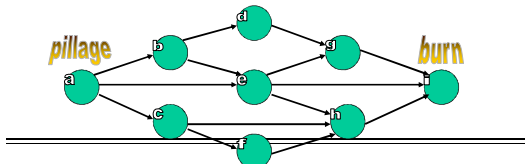
Don't burn before you pillage!



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Topological Sort

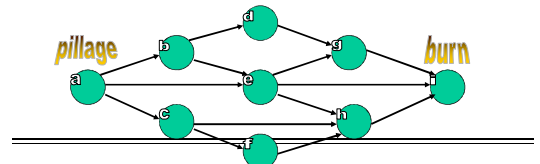
- Informally, a topological sort is a linear ordering of the vertices of a DAG in which all successors of any given vertex appear in the sequence after that vertex.



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Test Your Knowledge

- Give a topological sort for this graph, it should be evident that more than one solution exists for this problem.



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Method to the Madness

- One way to find a topological sort is to consider the *in-degrees* of the vertices. (The number of incoming edges is the **in-degree**). Clearly the first vertex in a topological sort must have in-degree zero and every DAG must contain at least one vertex with in-degree zero.

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Backtracking Algorithm Depth-First Search

Text

Read Weiss, § 9.6 Depth-First Search and § 10.5 Backtracking Algorithms

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Simple Topological Sort Algorithm

- Repeat the following steps until the graph is empty:
 - Select a vertex that has in-degree zero.
 - Add the vertex to the sort.
 - Delete the vertex and all the edges emanating from it from the graph.

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Requirements

- Also called Depth-First Search
- Can be used to attempt to visit all nodes of a graph in a systematic manner
- Works with directed and undirected graphs
- Works with weighted and unweighted graphs

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Walk-Through

A	
B	
C	
D	
E	
F	
G	
H	

Task: Conduct a depth-first search of the graph starting with node D

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Walk-Through

A	
B	
C	✓
D	✓
E	
F	
G	
H	

C

D

The order nodes are visited:
D, C

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Walk-Through

A	
B	
C	
D	✓
E	
F	
G	
H	

D

The order nodes are visited:
D

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Walk-Through

A	
B	
C	✓
D	✓
E	
F	
G	
H	

C

D

The order nodes are visited:
D, C

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Walk-Through

A	
B	
C	
D	✓
E	
F	
G	
H	

D

The order nodes are visited:
D

Slide 45

Walk-Through

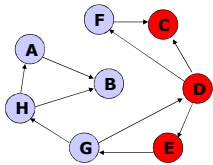
A	
B	
C	✓
D	✓
E	
F	
G	
H	

D

The order nodes are visited:
D, C

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Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

E
D

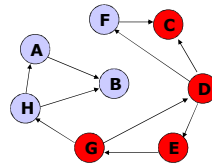
The order nodes are visited:

D, C, E

Back to D – C has been visited,
decide to visit E next

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Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

G
E
D

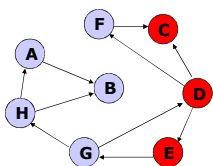
The order nodes are visited:

D, C, E, G

Nodes D and H are adjacent to
G. D has already been
visited. Decide to visit H.

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Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

E
D

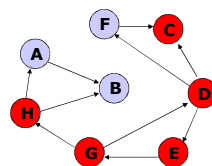
The order nodes are visited:

D, C, E

Only G is adjacent to E

Slide 50

Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

H
G
E
D

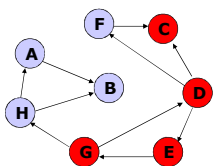
The order nodes are visited:

D, C, E, G, H

Visit H

Slide 53

Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

G
E
D

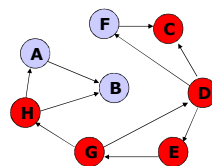
The order nodes are visited:

D, C, E, G

Visit G

Slide 51

Walk-Through



Visited

Array
A
B
C
D
E
F
G
H

H
G
E
D

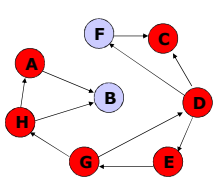
The order nodes are visited:

D, C, E, G, H

Nodes A and B are adjacent to F.
Decide to visit A next

Slide 54

Walk-Through



Visited Array	
A	✓
B	
C	✓
D	✓
E	✓
F	
G	✓
H	✓

A
H
G
E
D

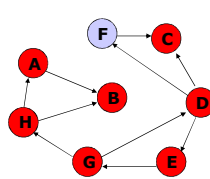
The order nodes are visited:

D, C, E, G, H, A

Visit A

Slide 55

Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

A
H
G
E
D

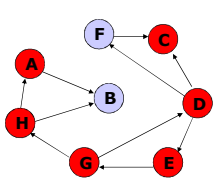
The order nodes are visited:

D, C, E, G, H, A, B

No unvisited nodes adjacent to B. Backtrack (pop the stack).

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Walk-Through



Visited Array	
A	✓
B	
C	✓
D	✓
E	✓
F	
G	✓
H	✓

A
H
G
E
D

The order nodes are visited:

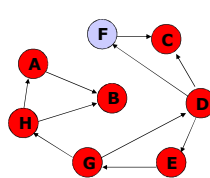
D, C, E, G, H, A

Only Node B is adjacent to A.

Decide to visit B next.

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

H
G
E
D

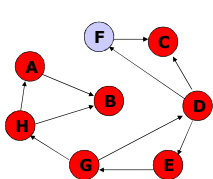
The order nodes are visited:

D, C, E, G, H, A, B

No unvisited nodes adjacent to A. Backtrack (pop the stack).

Slide 59

Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

B
A
H
G
E
D

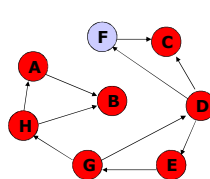
The order nodes are visited:

D, C, E, G, H, A, B

Visit B

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

G
E
D

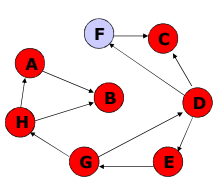
The order nodes are visited:

D, C, E, G, H, A, B

No unvisited nodes adjacent to F. Backtrack (pop the stack).

Slide 60

Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

E
D

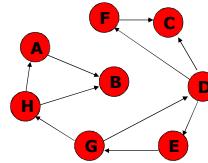
The order nodes are visited:

D, C, E, G, H, A, B

No unvisited nodes adjacent to G. Backtrack (pop the stack).

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

F
D

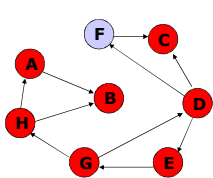
The order nodes are visited:

D, C, E, G, H, A, B, F

Visit F

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

D

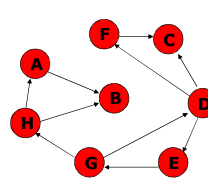
The order nodes are visited:

D, C, E, G, H, A, B

No unvisited nodes adjacent to E. Backtrack (pop the stack).

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

D

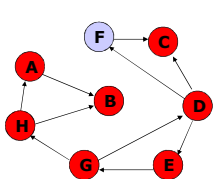
The order nodes are visited:

D, C, E, G, H, A, B, F

No unvisited nodes adjacent to E. Backtrack.

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Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	
G	✓
H	✓

D

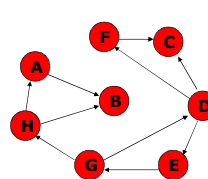
The order nodes are visited:

D, C, E, G, H, A, B

F is unvisited and is adjacent to D. Decide to visit F next.

Slide 63

Walk-Through



Visited Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

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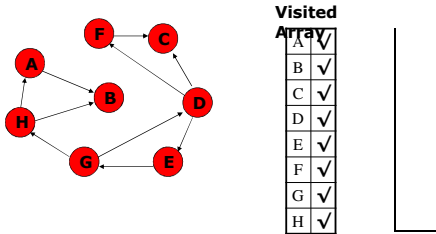
The order nodes are visited:

D, C, E, G, H, A, B, F

No unvisited nodes adjacent to D. Backtrack.

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Walk-Through



The order nodes are visited:

D, C, E, G, H, A, B, F

Stack is empty. Depth-first traversal is done.

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Requirements

- Can be used to attempt to visit all nodes of a graph in a systematic manner
- Works with directed and undirected graphs
- Works with weighted and unweighted graphs

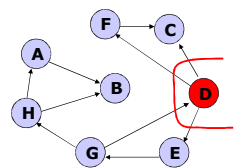
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Consider Trees

1. What depth-first traversals do you know?
2. How do the traversals differ?
3. In the walk-through, we visited a node just as we pushed the node onto the stack. Is there another time at which you can visit the node?
4. Conduct a depth-first search of the same graph using the strategy you came up with in #3.

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Overview



Breadth-first search starts with given node

Task: Conduct a breadth-first search of the graph starting with node D

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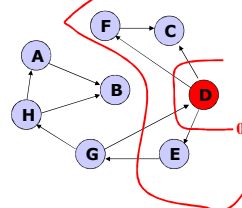
Breadth-First Search

Text

Read Weiss, § 9.3 (pp. 299-304) Breadth-First Search Algorithms

Slide 69

Overview



Breadth-first search starts with given node

Then visits nodes adjacent in some specified order (e.g., alphabetical)

Like ripples in a pond

Nodes visited: D

Slide 72

Overview

Breadth-first search starts with given node

Then visits nodes adjacent in some specified order (e.g., alphabetical)

Like ripples in a pond

Nodes visited: D, C

Slide 73

Overview

When all nodes in ripple are visited, visit nodes in next ripples

Nodes visited: D, C, E, F, G

Slide 76

Overview

Breadth-first search starts with given node

Then visits nodes adjacent in some specified order (e.g., alphabetical)

Like ripples in a pond

Nodes visited: D, C, E

Slide 74

Overview

When all nodes in ripple are visited, visit nodes in next ripples

Nodes visited: D, C, E, F, G, H

Slide 77

Overview

Breadth-first search starts with given node

Then visits nodes adjacent in some specified order (e.g., alphabetical)

Like ripples in a pond

Nodes visited: D, C, E, F

Slide 75

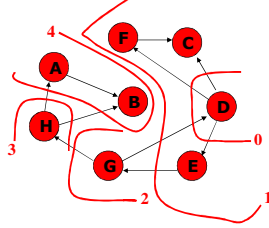
Overview

When all nodes in ripple are visited, visit nodes in next ripples

Nodes visited: D, C, E, F, G, H, A

Slide 78

Overview

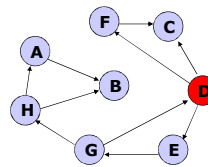


When all nodes in ripple are visited, visit nodes in next ripples

Nodes visited: D, C, E, F, G, H, A, B

Slide 79

Walk-Through



Enqueued

A	
B	
C	✓
D	✓
E	✓
F	✓
G	
H	

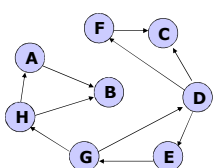
Q → C → E → F

Nodes visited: D

Dequeue D. Visit D. Enqueue unenqueued nodes adjacent to D.

Slide 82

Walk-Through



Enqueued

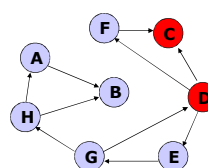
A	
B	
C	
D	
E	
F	
G	
H	

Q →

How is this accomplished? Simply replace the stack with a queue! Rules: (1) Maintain an *enqueued* array. (2) Visit node when *dequeued*.

Slide 80

Walk-Through



Enqueued

A	
B	
C	✓
D	✓
E	✓
F	✓
G	
H	

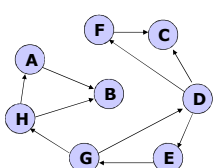
Q → E → F

Nodes visited: D, C

Dequeue C. Visit C. Enqueue unenqueued nodes adjacent to C.

Slide 83

Walk-Through



Enqueued

A	
B	
C	
D	✓
E	
F	
G	
H	

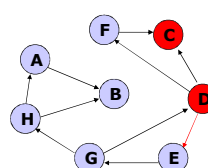
Q → D

Nodes visited:

Enqueue D. Notice, D not yet visited.

Slide 81

Walk-Through



Enqueued

A	
B	
C	✓
D	✓
E	✓
F	✓
G	
H	

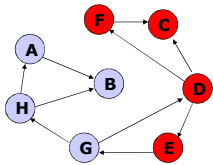
Q → F → G

Nodes visited: D, C, E

Dequeue E. Visit E. Enqueue unenqueued nodes adjacent to E.

Slide 84

Walk-Through



Nodes visited: D, C, E, F

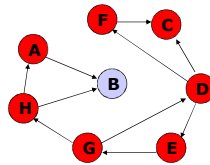
Enqueued Array	
A	
B	
C	✓
D	✓
E	✓
F	✓
G	
H	

Q → G

Dequeue F. Visit F. Enqueue unenqueued nodes adjacent to F.

Slide 85

Walk-Through



Nodes visited: D, C, E, F, G, H, A

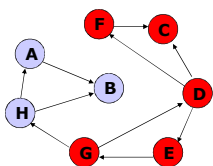
Enqueued Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

Q → B

Dequeue A. Visit A. Enqueue unenqueued nodes adjacent to A.

Slide 88

Walk-Through



Nodes visited: D, C, E, F, G

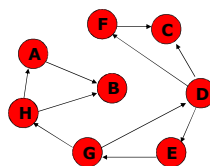
Enqueued Array	
A	
B	
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

Q → H

Dequeue G. Visit G. Enqueue unenqueued nodes adjacent to G.

Slide 86

Walk-Through



Nodes visited: D, C, E, F, G, H, A, B

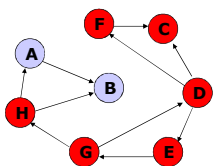
Enqueued Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

Q empty

Dequeue B. Visit B. Enqueue unenqueued nodes adjacent to B.

Slide 89

Walk-Through



Nodes visited: D, C, E, F, G, H

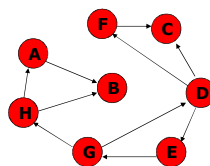
Enqueued Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

Q → A → B

Dequeue H. Visit H. Enqueue unenqueued nodes adjacent to H.

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Walk-Through



Nodes visited: D, C, E, F, G, H, A, B

Enqueued Array	
A	✓
B	✓
C	✓
D	✓
E	✓
F	✓
G	✓
H	✓

Q empty

Q empty. Algorithm done.

Slide 90

Consider Trees

1. What do we call a breadth-first traversal on trees?

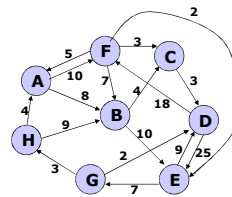
Slide 91

Requirements

- Works with directed and undirected graphs
- Works with weighted and unweighted graphs
- Rare type of algorithm →
A greedy algorithm that produces an optimal solution

Slide 94

Walk-Through



Initialize array

	K	d_v	p_v
A	F	∞	—
B	F	∞	—
C	F	∞	—
D	F	∞	—
E	F	∞	—
F	F	∞	—
G	F	∞	—
H	F	∞	—

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Dijkstra's Algorithm

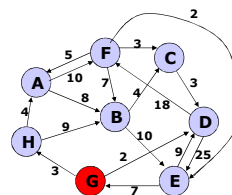
Text

Read Weiss, § 9.3

Dijkstra's Algorithm

Single Source Multiple Destination
Shortest Path Algorithm

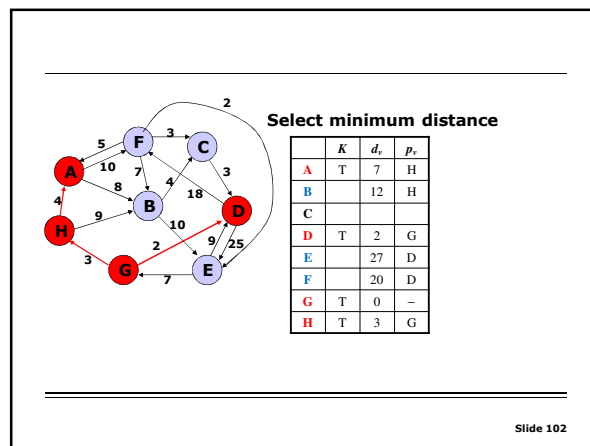
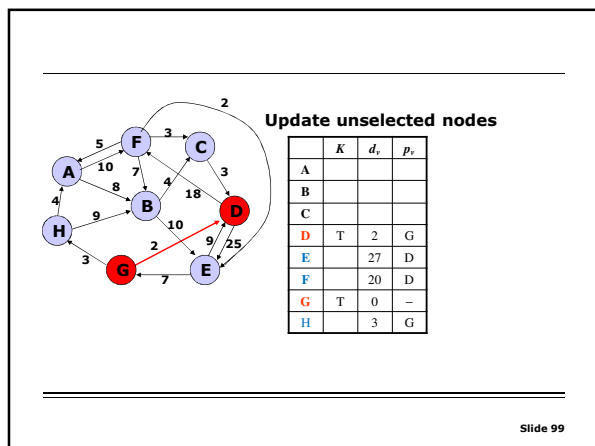
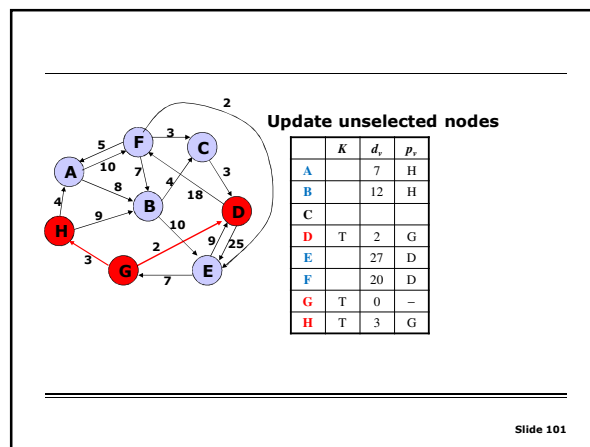
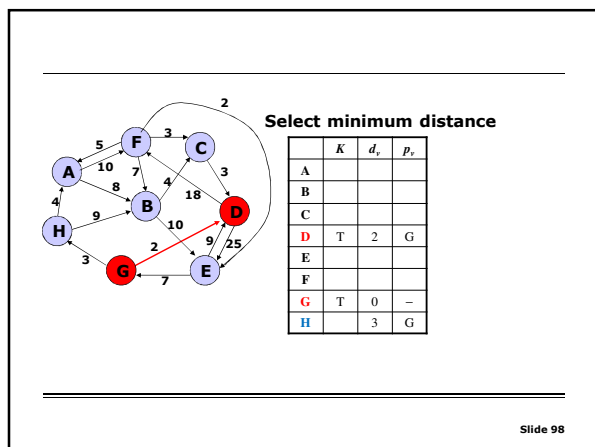
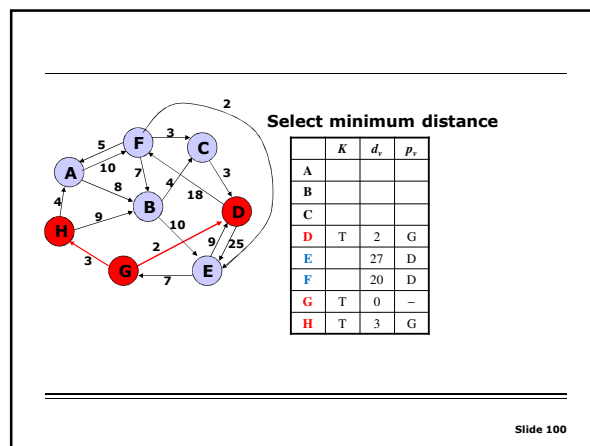
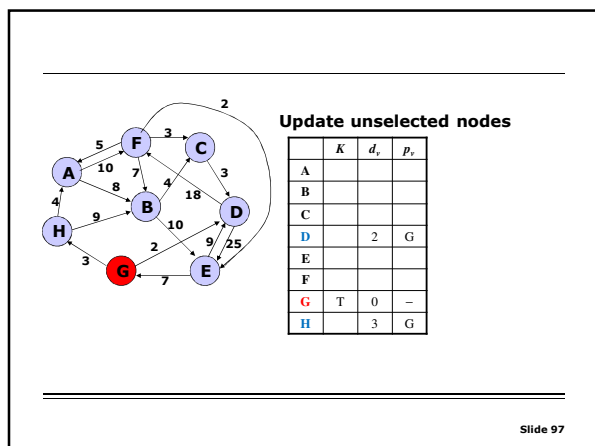
Slide 93

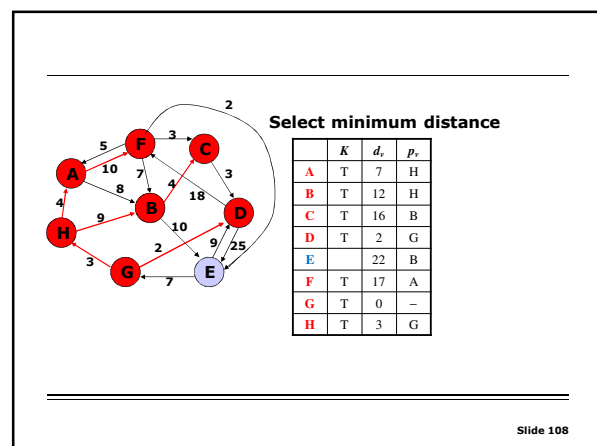
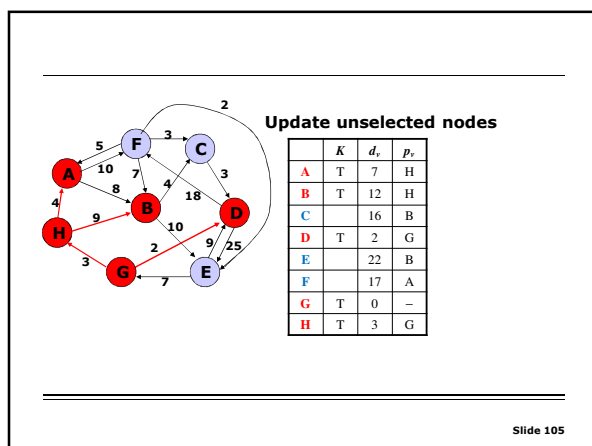
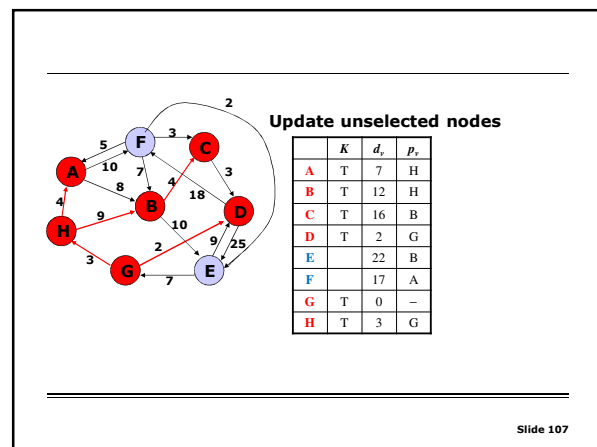
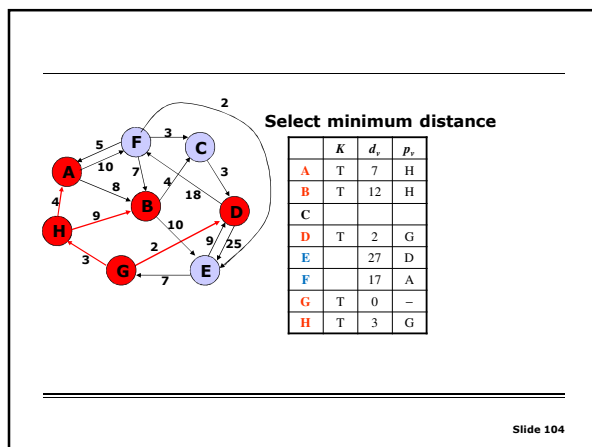
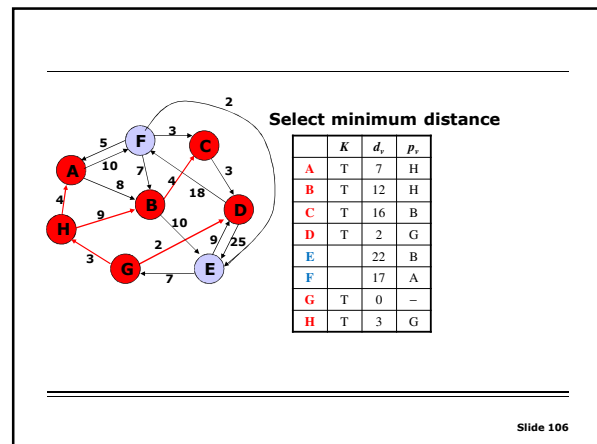
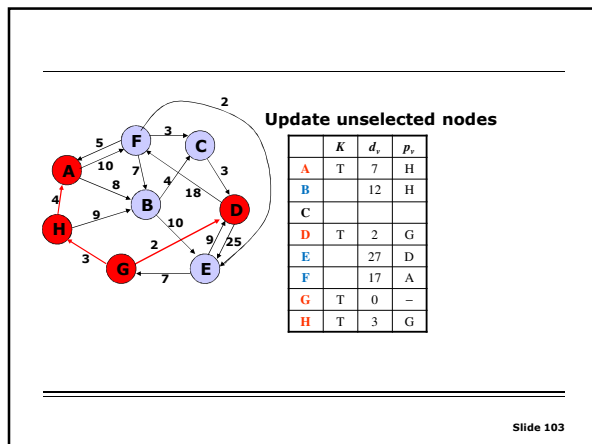


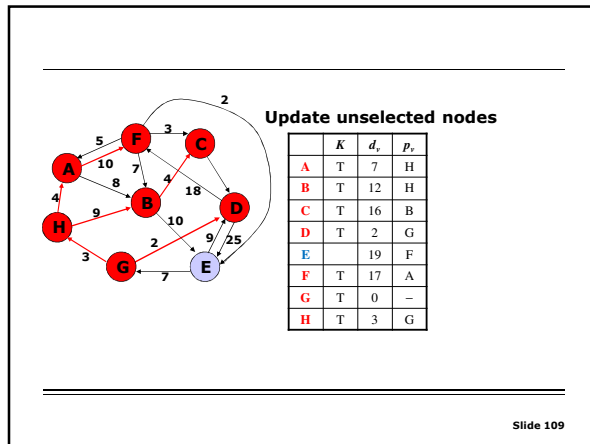
Start with G

	K	d_v	p_v
A			
B			
C			
D			
E			
F			
G	T	0	—
H			

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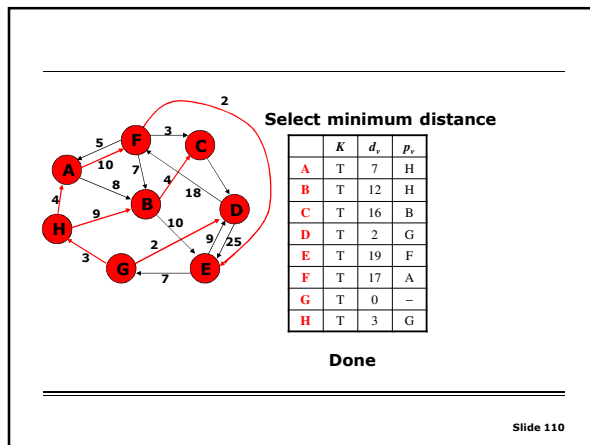




Order of Complexity

- Analysis
 - findMin() takes $O(V)$ time
 - outer loop iterates $(V-1)$ times
 - $O(V^2)$ time
- Optimal for dense graphs, i.e., $|E| = O(V^2)$
- Suboptimal for sparse graphs, i.e., $|E| = O(V)$

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Order of Complexity

If the graph is sparse, i.e., $|E| = O(V)$

- maintain distances in a priority queue
- insert new (shorter) distance produced by line 10 of Figure 9.32
- $O(|E| \log |V|)$ complexity

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Dijkstra's Algorithm

<http://www.youtube.com/watch?v=8LsIRqHCOPw>

Slide 111

Negative Edge Weights

Read § 9.3.3
Dijkstra's algorithm as shown in Figure 9.32 does not work!
Why?

Slide 114

Acyclic Graphs

- Read § 9.3.4
- Combine topological sort with Dijkstra's algorithm

Slide 115

All-Pairs Shortest Paths

- One option: run Dijkstra's algorithm $|V|$ times
→ $O(V^3)$ time
- A more efficient $O(V^3)$ time algorithm is discussed in Chapter 10

Slide 116