

CSI33 DATA STRUCTURES

Department of Mathematics and Computer Science
Bronx Community College

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OUTLINE

- 1 CHAPTER 14: GRAPHS
 - Graph Data Structures
 - Shortest Path Algorithms



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 - Graph Data Structures
 - Shortest Path Algorithms



GRAPHS

Graphs can represent airlines, electrical circuits, or computer networks.

A Graph G will consist of:

- A set V of vertices (nodes, points). (Cities, circuit connections, computers). We will use V to mean the **number** of vertices as well.
- A set E of edges (lines connecting vertices). (Air lanes, elements in a circuit, computer connections in a network). We will use E to mean the **number** of edges as well.



GRAPHS

- A **path** is a series of edges connecting two vertices.
- In an **undirected graph** edges are “two-way streets”
- A **connected graph** is one in which every pair of vertices is connected by a path.
- A **complete graph** is one in which every pair of vertices is connected by an edge.
- Two vertices are **adjacent** if there is an edge connecting them.
- A **cycle** in a directed graph is a loop formed by adjacent vertices.



GRAPHS

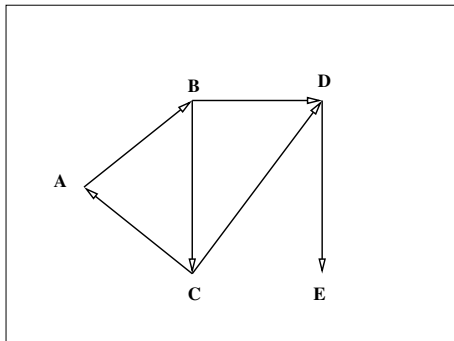
Directed graphs:

- In a **directed graph** edges are “one-way streets” beginning at one vertex and ending at another.
- The **in-degree** of a vertex is how many edges end at that vertex.
- The **out-degree** of a vertex is how many edges begin at that vertex.
- A **directed acyclic graph**, or **DAG**, is a directed graph containing no cycles.
- Vertex B is **adjacent** to vertex A if there is an edge from A to B.
- Example: A **tree** is a special type of DAG.



GRAPHS

A directed graph



GRAPHS

- A graph is **dense** if it has many edges connecting vertices.
- A graph is **sparse** if it has much less than the maximum possible number of edges.
- The best implementation of a graph depends on how sparse it is.



REPRESENTING GRAPHS

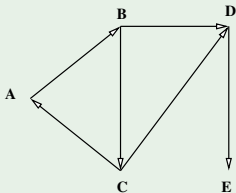
ADJACENCY MATRICES

- An adjacency matrix has rows and columns of zeros and ones. A one in row i , column j means that an edge connects vertex i with vertex j (that is, that vertices i and j are adjacent).
- An adjacency matrix is used to implement a dense graph.
- It requires $\Theta(v^2)$ time to find all the edges (by checking every entry in the matrix).



REPRESENTING GRAPHS

ADJACENCY MATRICES (DIRECTED GRAPH)

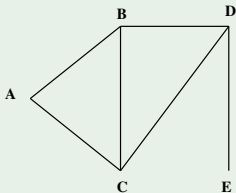


	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>
<i>A</i>	0	1	0	0	0
<i>B</i>	0	0	1	1	0
<i>C</i>	1	0	0	1	0
<i>D</i>	0	0	0	0	1
<i>E</i>	0	0	0	0	0



REPRESENTING GRAPHS

ADJACENCY MATRICES (UNDIRECTED GRAPH)

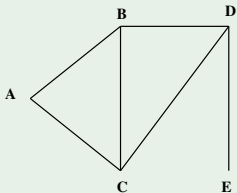


	<i>A</i>	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>
<i>A</i>	0	1	1	0	0
<i>B</i>	1	0	1	1	0
<i>C</i>	1	1	0	1	0
<i>D</i>	0	1	1	0	1
<i>E</i>	0	0	0	1	0



REPRESENTING GRAPHS

ADJACENCY MATRICES (UNDIRECTED GRAPH)



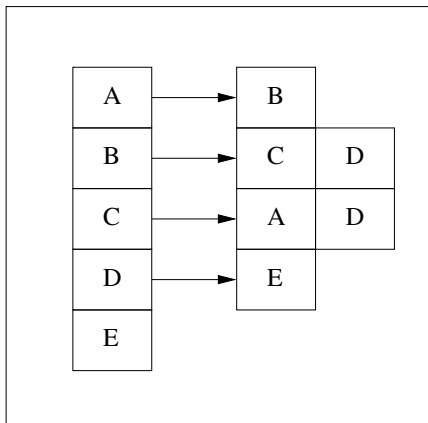
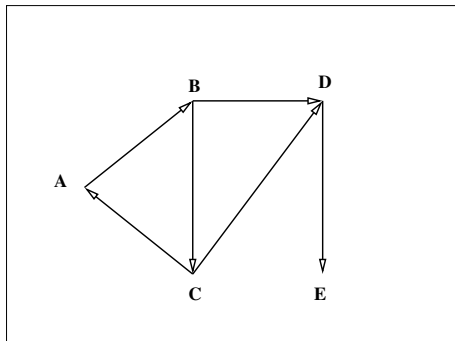
	<i>B</i>	<i>C</i>	<i>D</i>	<i>E</i>
<i>A</i>	1	1	0	0
<i>B</i>		1	1	0
<i>C</i>			1	0
<i>D</i>				1

ADJACENCY LISTS

- An **adjacency list** gives each vertex an attribute which is a list of all the vertices adjacent to it.
- To represent a sparse graph, an **adjacency list** is more economical, since it only indicates where the edges are, not where they aren't.
- An adjacency list uses time $\Theta(V * E)$ to find all edges.



ADJACENCY LISTS



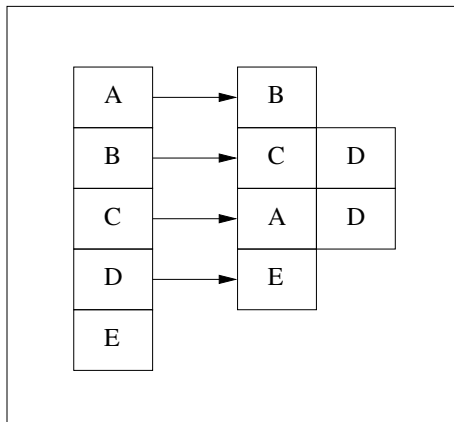
ADJACENCY LISTS

Implementation of adjacency lists in Python:

- A list of lists.
- A dictionary.



ADJACENCY LISTS



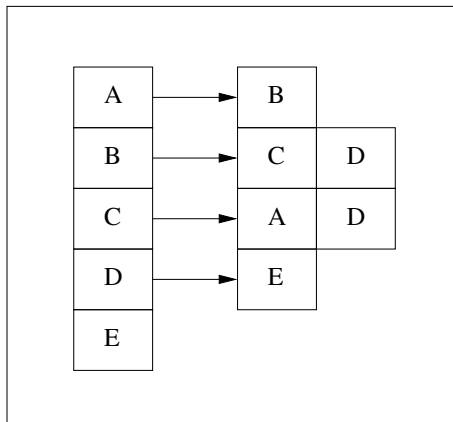
```

g = [
  ['A', [( 'B', 1 )]],
  ['B', [( 'C', 1 ), ( 'D', 1 )]],
  ['C', [( 'A', 1 ), ( 'D', 1 )]],
  ['D', [( 'E', 1 )]],
  ['E', []]]

```



ADJACENCY LISTS



$$g = \{$$

$$\text{'A'} : \{ \text{'B'} : 1 \},$$

$$\text{'B'} : \{ \text{'C'} : 1, \text{'D'} : 1 \},$$

$$\text{'C'} : \{ \text{'A'} : 1, \text{'D'} : 1 \},$$

$$\text{'D'} : \{ \text{'E'} : 1 \},$$

$$\text{'E'} : \{ \}$$


ADJACENCY LISTS

Implementation of adjacency lists in C++:

- For static graphs (which do not change): a two-dimensional array.
- For dynamic graphs: a list of lists (linked-list implementation).

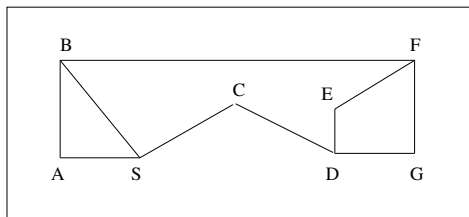


THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.
while the queue is not
empty:
    dequeue a vertex v
    for each vertex w
adjacent to v:
        if w's parent is None:
            set w's parent to v
            set w's distance to
v's distance + 1
            insert w into queue

```



queue:

v:

w:

	S	A	B	C	D	E	F	G
par								
dis								



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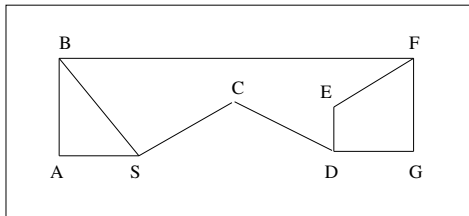
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queue:

v :

w :

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par	-	N	N	N	N	N	N	N
dis								



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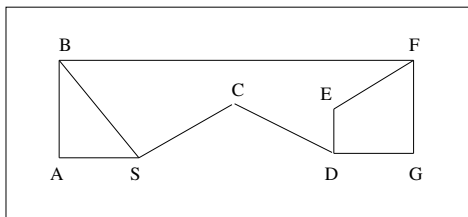
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v :

w :

	S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N
dis	0							



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Insert the source vertex
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```

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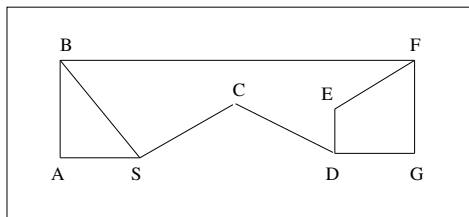
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```

queue: S

```

```

v:

```

```

w:

```

		S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N	N
dis	0								



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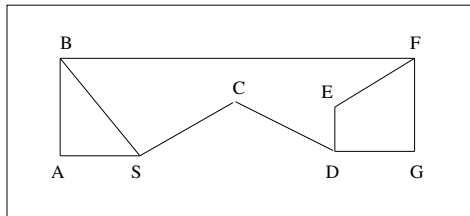
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```



```
queue:S
```

```
v:
```

```
w:
```

		S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N	N
dis	0								



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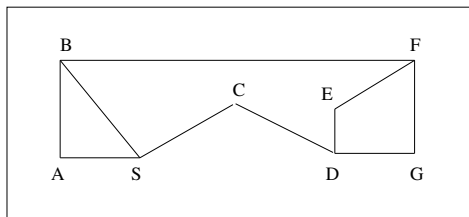
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queue:

v: S

w:

		S		A		B		C		D		E		F		G		

	par		-		N		N		N		N		N		N		N	

	dis		0															



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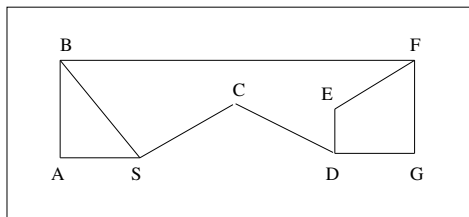
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 insert w into queue



queue:

v: S

w: A

	S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N
dis	0							



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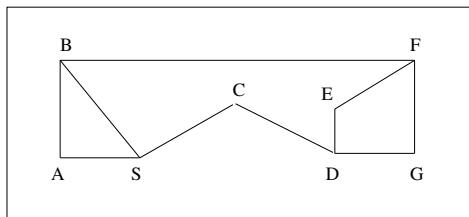
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queue:

v: S

w: A

	S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N
dis	0							

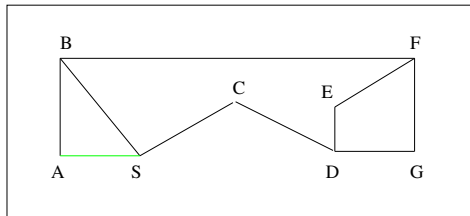


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```



```

queue:  A
v:      S
w:      A

```

	S	A	B	C	D	E	F	G
par	-	S	N	N	N	N	N	N
dis	0	1						

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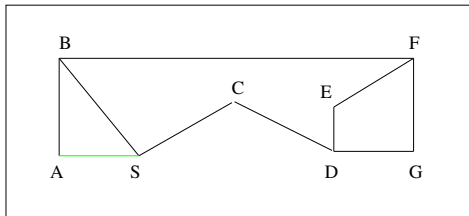
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 insert w into queue



queue: A

v: S

w: B

	S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N
dis	0	1						

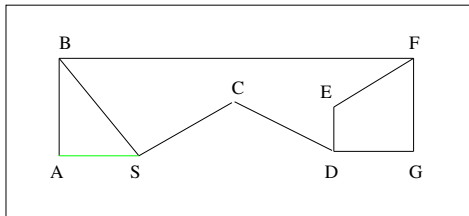


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```



```

queue: A
v: S
w: B

```

	S	A	B	C	D	E	F	G
par	-	N	N	N	N	N	N	N
dis	0	1						

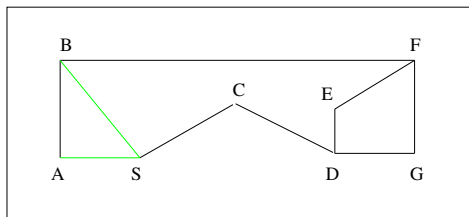


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            insert w into queue

```



```

queue: BA
v: S
w: B

```

	S	A	B	C	D	E	F	G
par	-	S	S	N	N	N	N	N
dis	0	1	1					



THE UNWEIGHTED SHORTEST PATH

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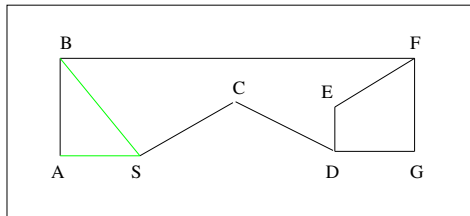
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 insert w into queue



queue: BA

v: S

w: C

	S	A	B	C	D	E	F	G
par	-	S	S	N	N	N	N	N
dis	0	1	1					

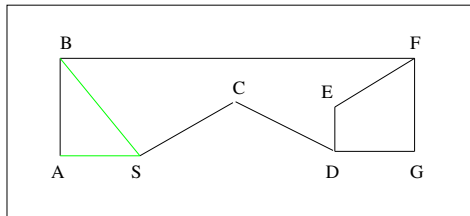


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```



```

queue: BA
v: S
w: C

```

	S	A	B	C	D	E	F	G
par	-	S	S	N	N	N	N	N
dis	0	1	1					

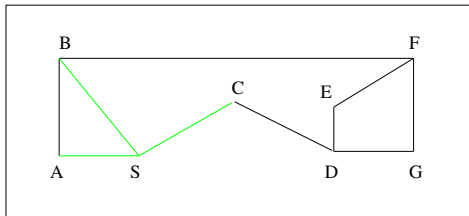


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```



queue: CBA

v: S

w: C

	S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	N
dis	0	1	1	1				



THE UNWEIGHTED SHORTEST PATH

```

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Insert the source vertex
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```

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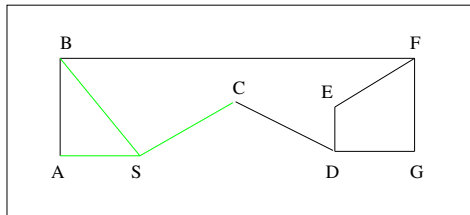
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            insert w into queue

```



```
queue: CB
```

```
v: A
```

```
w:
```

		S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	N	
dis	0	1	1	1					



THE UNWEIGHTED SHORTEST PATH

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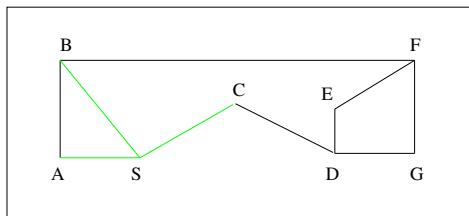
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 insert w into queue



queue: CB

v: A

w: B

	S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	N
dis	0	1	1	1				



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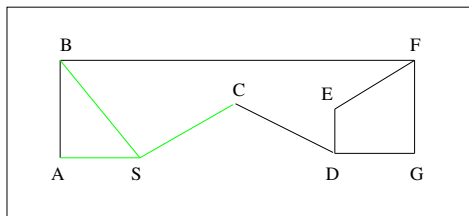
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queue: CB

v : A

w : S

	S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	N
dis	0	1	1	1				



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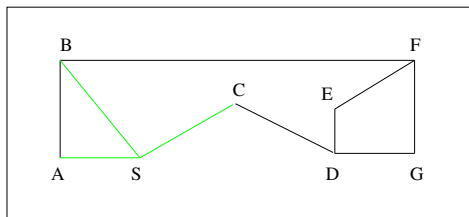
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```



```

queue: C

```

```

v: B

```

```

w:

```

		S		A		B		C		D		E		F		G		

	par		-		S		S		S		N		N		N		N	

	dis		0		1		1		1									



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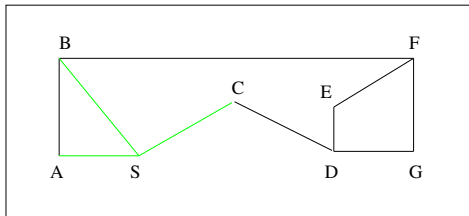
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queue: C

v: B

w: F

	S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	N
dis	0	1	1	1				

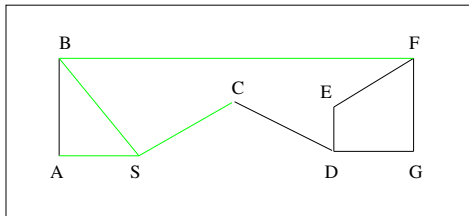


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            insert w into queue

```



queue: **FC**

v: B

w: F

	S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	B	N
dis	0	1	1	1			2	



THE UNWEIGHTED SHORTEST PATH

```

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```

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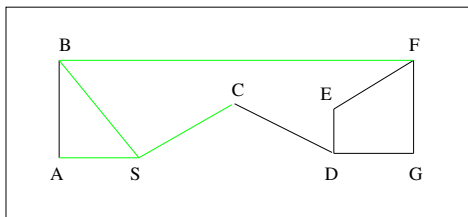
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        if w's parent is None:
            set w's parent to v
            set w's distance to
v's distance + 1
            insert w into queue

```



```
queue: F
```

```
v: C
```

```
w:
```

		S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	B	N	
dis	0	1	1	1				2	



THE UNWEIGHTED SHORTEST PATH

set all vertices to have
parent 'None'.

set distance for source
vertex to 0

Insert the source vertex
into the queue.

while the queue is not
empty:

 dequeue a vertex v

 for each vertex w

 adjacent to v :

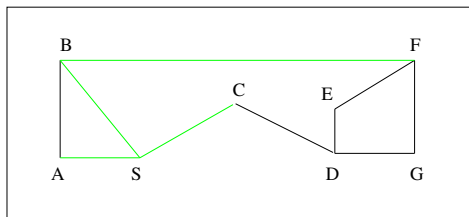
 if w 's parent is None:

 set w 's parent to v

 set w 's distance to

v 's distance + 1

 insert w into queue



queue: F

v: C

w: D

		S	A	B	C	D	E	F	G
par	-	S	S	S	N	N	N	B	
dis	0	1	1	1				2	



THE UNWEIGHTED SHORTEST PATH

set all vertices to have
parent 'None'.

set distance for source
vertex to 0

Insert the source vertex
into the queue.

while the queue is not
empty:

 dequeue a vertex v

 for each vertex w

 adjacent to v :

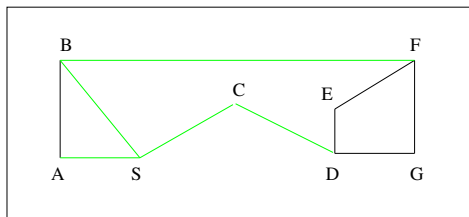
 if w 's parent is None:

 set w 's parent to v

 set w 's distance to

v 's distance + 1

 insert w into queue



queue: DF

v: B

w: D

		S	A	B	C	D	E	F	G
par	-	S	S	S	C	N	B	N	
dis	0	1	1	1	2		2		



THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.

```

```

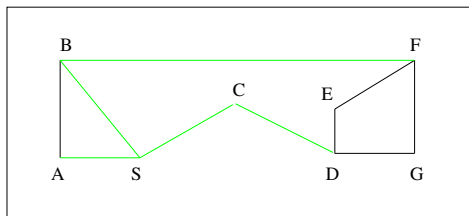
while the queue is not
empty:

```

```

    dequeue a vertex v
    for each vertex w
    adjacent to v:
        if w's parent is None:
            set w's parent to v
            set w's distance to
            v's distance + 1
            insert w into queue

```



```
queue: D
```

```
v: F
```

```
w:
```

		S	A	B	C	D	E	F	G
par	-	S	S	S	C	N	B	N	
dis	0	1	1	1	2		2		



THE UNWEIGHTED SHORTEST PATH

set all vertices to have
parent 'None'.

set distance for source
vertex to 0

Insert the source vertex
into the queue.

while the queue is not
empty:

 dequeue a vertex v

 for each vertex w

 adjacent to v :

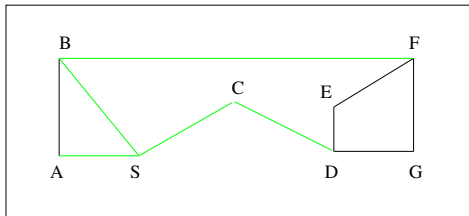
 if w 's parent is None:

 set w 's parent to v

 set w 's distance to

v 's distance + 1

 insert w into queue



queue: D

v: F

w: E

		S	A	B	C	D	E	F	G
par	-	S	S	S	C	N	B	N	
dis	0	1	1	1	2		2		

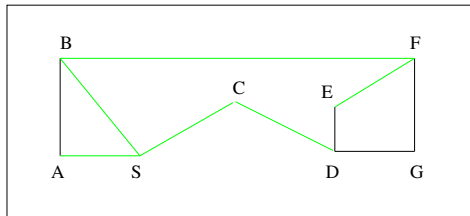


THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.
while the queue is not
empty:
    dequeue a vertex v
    for each vertex w
    adjacent to v:
        if w's parent is None:
            set w's parent to v
            set w's distance to
            v's distance + 1
            insert w into queue

```



queue: **E**D

v: F

w: E

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	N
dis	0	1	1	1	2	3	2	



THE UNWEIGHTED SHORTEST PATH

set all vertices to have
parent 'None'.

set distance for source
vertex to 0

Insert the source vertex
into the queue.

while the queue is not
empty:

 dequeue a vertex v

 for each vertex w

 adjacent to v :

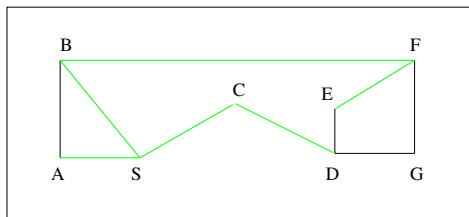
 if w 's parent is None:

 set w 's parent to v

 set w 's distance to

v 's distance + 1

 insert w into queue



queue: ED

v : F

w : G

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	N
dis	0	1	1	1	2	3	2	

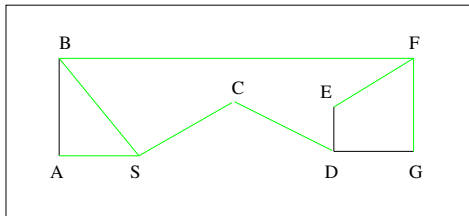


THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.
while the queue is not
empty:
    dequeue a vertex v
    for each vertex w
    adjacent to v:
        if w's parent is None:
            set w's parent to v
            set w's distance to
            v's distance + 1
            insert w into queue

```



```

queue: GED
v: F
w: G

```

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	F
dis	0	1	1	1	2	3	2	3



THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.

```

```

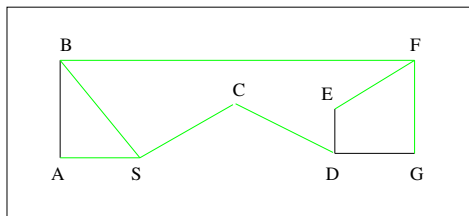
while the queue is not
empty:

```

```

    dequeue a vertex v
    for each vertex w
adjacent to v:
    if w's parent is None:
        set w's parent to v
        set w's distance to
v's distance + 1
        insert w into queue

```



```
queue: GE
```

```
v: D
```

```
w:
```

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	F
dis	0	1	1	1	2	3	2	3



THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.

```

```

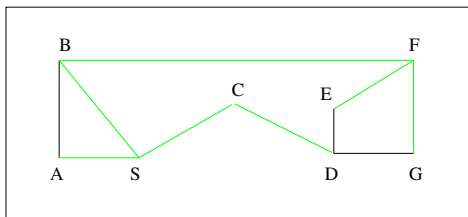
while the queue is not
empty:

```

```

    dequeue a vertex v
    for each vertex w
adjacent to v:
    if w's parent is None:
        set w's parent to v
        set w's distance to
v's distance + 1
        insert w into queue

```



```
queue: G
```

```
v: E
```

```
w:
```

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	F
dis	0	1	1	1	2	3	2	3



THE UNWEIGHTED SHORTEST PATH

```

set all vertices to have
parent 'None'.
set distance for source
vertex to 0
Insert the source vertex
into the queue.

```

```

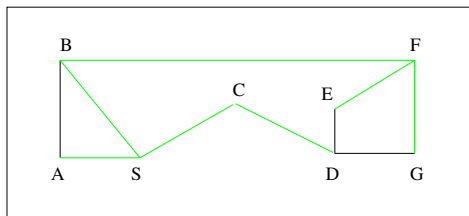
while the queue is not
empty:

```

```

    dequeue a vertex v
    for each vertex w
adjacent to v:
    if w's parent is None:
        set w's parent to v
        set w's distance to
v's distance + 1
        insert w into queue

```



```
queue:
```

```
v: G
```

```
w:
```

	S	A	B	C	D	E	F	G
par	-	S	S	S	C	F	B	F
dis	0	1	1	1	2	3	2	3



THE WEIGHTED SHORTEST PATH (DIJKSTRA)

Dijkstra:

set all vertices to have parent 'None'.

set distance for all vertices to infinity

set distance for source vertex to 0

Insert all vertices into a priority queue.

while priority queue is not empty:

 dequeue a vertex v (with the shortest distance)

 for each vertex w adjacent to v :

 if w 's distance $>$ (v 's distance + weight of edge v to w):

 set w 's parent to v

 set w 's distance to v 's distance + weight of edge v to w



THE WEIGHTED SHORTEST PATH (DIJKSTRA)

Unweighted:

set all vertices to have parent 'None'.

set distance for source vertex to 0

Insert the source vertex into the queue.

while the queue is not empty:

 dequeue a vertex v

 for each vertex w adjacent to v :

 if w 's parent is None:

 set w 's parent to v

 set w 's distance to v 's distance + 1

 insert w into queue

