

GRAPHS

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Agenda

1 Introduction

2 Graph traversals

3 Applications of DFS and BFS

4 Bibliography



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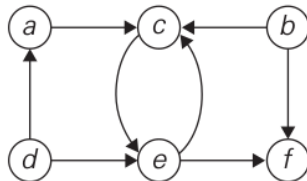
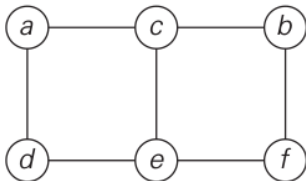


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Introduction¹

Graph: a collection of **nodes** (vertices), some of them connected by **edges** (arcs) – $G = (V, E)$, where $V \neq \emptyset$, and $E \in V \leftrightarrow V$

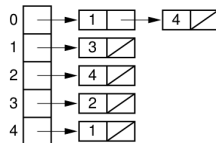
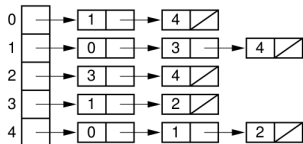
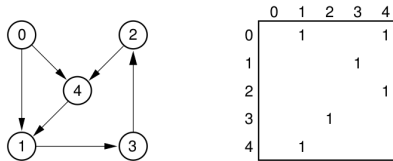
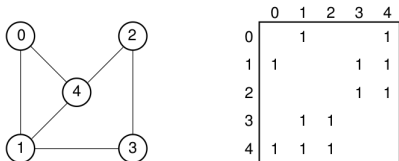
- Undirected / Directed graphs (digraphs)



¹ Source: A. Levitin. Introduction to the Design and Analysis of Algorithms. 2011.

Possible implementations (unweighted graphs)²

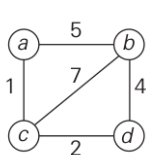
Adjacency **matrix** or adjacency **list**



²Source: C. Shaffer. Data Structures and Algorithm Analysis. 2013.

Possible implementations (weighted graphs)⁴

Adjacency **matrix** or adjacency **list**



	a	b	c	d
a	∞	5	1	∞
b	5	∞	7	4
c	1	7	∞	2
d	∞	4	2	∞

a	$\rightarrow b, 5 \rightarrow c, 1$
b	$\rightarrow a, 5 \rightarrow c, 7 \rightarrow d, 4$
c	$\rightarrow a, 1 \rightarrow b, 7 \rightarrow d, 2$
d	$\rightarrow b, 4 \rightarrow c, 2$

3

Choosing the most appropriate implementation

- Space efficiency: **dense** graph vs. **sparse** graph
- Time efficiency (graph traversal): $\Theta(|V|^2)$ vs. $\Theta(|V| + |E|)$

³ Fonte: A. Levitin. Introduction to the Design and Analysis of Algorithms. 2011.

⁴ Source: C. Shaffer. Data Structures and Algorithm Analysis. 2013.

Graph ADT

Operations

- `int n(G g);`
- `int e(G g);`
- `int first(G g, int v);`
- `int next(G g, int v, int w);`
- `void setEdge(G g, int i, int j, int wt);`
- `void delEdge(G g, int i, int j);`
- `boolean isEdge(G g, int i, int j);`
- `int weight(G g, int i, int j);`
- `void setMark(G g, int v, int val);`
- `int getMark(G g, int v);`



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Graph ADT implemented as an adjacency matrix

Composite type:

```

1  int[][] matrix ;           // adjacency matrix
2  int numEdge ;             // number of edges
3  int[] Mark ;              // auxiliary marking array

```

Algorithm: G create_graph(int n)

```

1  g.Mark ← new int[n];
2  g.matrix ← new int[n][n];
3  g.numEdge ← 0;
4  return g;

```



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Graph ADT implemented as an adjacency matrix

Algorithm: `int first(G g, int v)`

```

1  for  $i \leftarrow 0$  to  $n(g) - 1$  do
2    if  $g.matrix[v][i] \neq 0$  then return  $i$ ;
3  return  $n(g)$ ;

```

Algorithm: `int next(G g, int v, int w)`

```

1  for  $i \leftarrow w + 1$  to  $n(g) - 1$  do
2    if  $g.matrix[v][i] \neq 0$  then return  $i$ ;
3  return  $n(g)$ ;

```

Implicit **assumption**: 0 denotes the absence of an edge between two nodes



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Graph ADT implemented as an adjacency matrix

Algorithm: void setEdge(G g, int i, int j, int wt)

```

1  if wt = 0 then error ;
2  if g.matrix[i][j] = 0 then g.numEdge++;
3  g.matrix[i][j] ← wt;

```

Algorithm: void delEdge(G g, int i, int j)

```

1  if g.matrix[i][j] ≠ 0 then g.numEdge--;
2  g.matrix[i][j] ← 0;

```

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Graph traversals

In general terms (attention to **unconnected graphs**):

Algorithm: void graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2     $\lfloor$     $setMark(g, v, UNVISITED)$ ;
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
4     $\lfloor$    if  $getMark(g, v) = UNVISITED$  then
5         $\lfloor$     $traverse(g, v)$ ;

```

Possible traversals

- **DFS**: depth-first search
- **BFS**: breadth-first search



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Graph traversals: DFS

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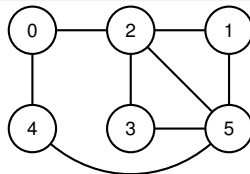
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Algorithm: void
DFS(G g, int v)

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1   $\text{preVisit}(g, v);$ 
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      then  $\text{DFS}(g, w);$ 
6     $w \leftarrow \text{next}(g, v, w);$ 
7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	×	×	×	×	×	×



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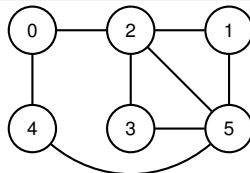
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DFS calls:
- DFS(–, 0)



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Graph traversals: DFS

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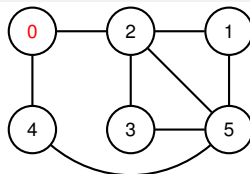
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Algorithm: void
DFS(G g, int v)

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	0	1	2	3	4	5
Mark	✓	×	×	×	×	×

DFS calls:
- DFS(0, 0)



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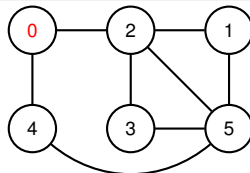
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Mark	✓	×	×	×	×	×

DFS calls:

- DFS(., 0)
- DFS(., 2)



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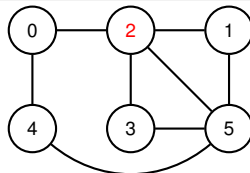
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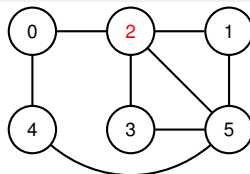
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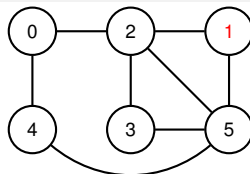
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DFS(G g, int v)

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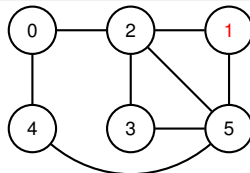
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DFS calls:

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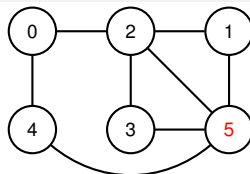
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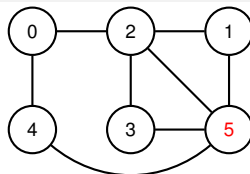
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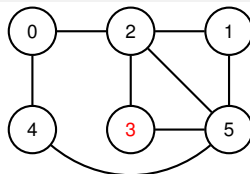
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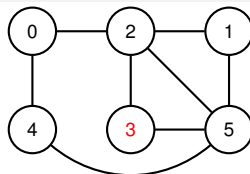
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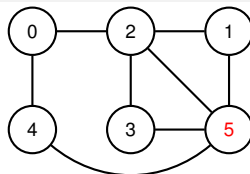
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Graph traversals: DFS

Algorithm: void
graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2    setMark(g, v, UNVISITED);
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
4    if getMark(g, v) = UNVISITED
       then DFS(g, v);

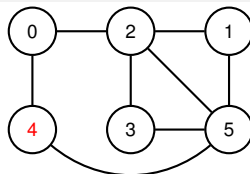
```

Algorithm: void
DFS(G g, int v)

```

1  preVisit(g, v);
2  setMark(g, v, VISITED);
3   $w \leftarrow \text{first}(g, v)$ ;
4  while  $w < n(g)$  do
5    if getMark(g, w) = UNVISITED
       then DFS(g, w);
6     $w \leftarrow \text{next}(g, v, w)$ ;
7  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:

- DFS(., 0)
- DFS(., 2)
- DFS(., 1)
- DFS(., 5)
- DFS(., 4)



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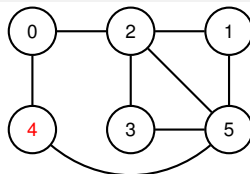
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v);$ 
2   $\text{setMark}(g, v, \text{VISITED});$ 
3   $w \leftarrow \text{first}(g, v);$ 
4  while  $w < n(g)$  do
5    if  $\text{getMark}(g, w) = \text{UNVISITED}$ 
       then  $\text{DFS}(g, w);$ 
6     $w \leftarrow \text{next}(g, v, w);$ 
7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:

- DFS(–, 0)
- DFS(–, 2)
- DFS(–, 1)
- DFS(–, 5)
- DFS(–, 4)



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4    if  $\text{getMark}(g, v) = \text{UNVISITED}$ 
       then  $\text{DFS}(g, v);$ 

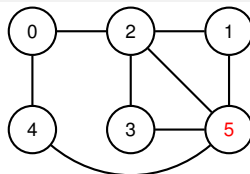
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v);$ 
2   $\text{setMark}(g, v, \text{VISITED});$ 
3   $w \leftarrow \text{first}(g, v);$ 
4  while  $w < n(g)$  do
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       then  $\text{DFS}(g, w);$ 
6     $w \leftarrow \text{next}(g, v, w);$ 
7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:

- DFS(., 0)
- DFS(., 2)
- DFS(., 1)
- DFS(., 5)



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Graph traversals: DFS

Algorithm: void
graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2     $\text{setMark}(g, v, \text{UNVISITED})$ ;
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
4    if  $\text{getMark}(g, v) = \text{UNVISITED}$ 
       then  $\text{DFS}(g, v)$ ;

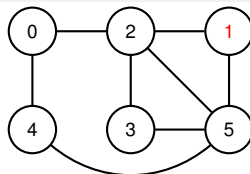
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v)$ ;
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3   $w \leftarrow \text{first}(g, v)$ ;
4  while  $w < n(g)$  do
5    if  $\text{getMark}(g, w) = \text{UNVISITED}$ 
       then  $\text{DFS}(g, w)$ ;
6     $w \leftarrow \text{next}(g, v, w)$ ;
7   $\text{posVisit}(g, v)$ ;

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:

- DFS(., 0)
- DFS(., 2)
- DFS(., 1)



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Graph traversals: DFS

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graphTraverse(G g)

```

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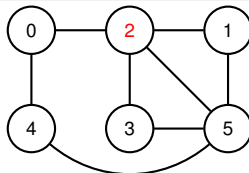
```

Algorithm: void
DFS(G g, int v)

```

1  preVisit(g, v);
2  setMark(g, v, VISITED);
3  w ← first(g, v);
4  while w < n(g) do
5    if getMark(g, w) = UNVISITED
       then DFS(g, w);
6    w ← next(g, v, w);
7  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:

- DFS(., 0)
- DFS(., 2)



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Graph traversals: DFS

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graphTraverse(G g)

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       then  $\text{DFS}(g, v);$ 

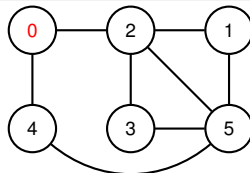
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v);$ 
2   $\text{setMark}(g, v, \text{VISITED});$ 
3   $w \leftarrow \text{first}(g, v);$ 
4  while  $w < n(g)$  do
5    if  $\text{getMark}(g, w) = \text{UNVISITED}$ 
       then  $\text{DFS}(g, w);$ 
6     $w \leftarrow \text{next}(g, v, w);$ 
7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

DFS calls:
- DFS(0, 0)



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Graph traversals: DFS

Algorithm: void
graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2     $\text{setMark}(g, v, \text{UNVISITED});$ 
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
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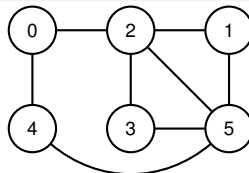
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v);$ 
2   $\text{setMark}(g, v, \text{VISITED});$ 
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7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓



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Graph traversals: DFS

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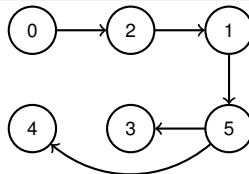
```

Algorithm: void
DFS(G g, int v)

```

1   $\text{preVisit}(g, v);$ 
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       then  $\text{DFS}(g, w);$ 
6     $w \leftarrow \text{next}(g, v, w);$ 
7   $\text{posVisit}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓



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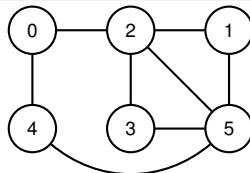
Graph traversals: BFS

Algorithm: void
graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2     $\lfloor$    setMark( $g, v, UNVISITED$ );
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
4     $\lfloor$    if getMark( $g, v$ ) = UNVISITED
         then BFS( $g, v$ ) ;

```



	0	1	2	3	4	5
Mark	×	×	×	×	×	×



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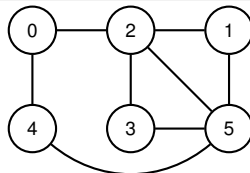
Graph traversals: BFS

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      then  $\text{BFS}(g, v);$ 

```



	0	1	2	3	4	5
Mark	×	×	×	×	×	×

BFS calls:
- BFS(., 0)



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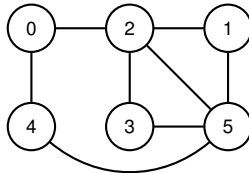
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	×	×	×	×	×

BFS calls:
- BFS(., 0)

Queue: 0



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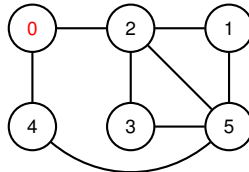
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

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7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	×	×	×	×	×

BFS calls:

- BFS(., 0)

Queue: -

$v = 0$

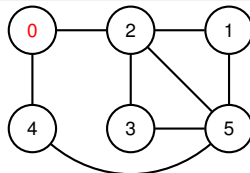
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6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	×	✓	×	✓	×

BFS calls:

- BFS(., 0)

Queue: 2, 4

$v = 0$



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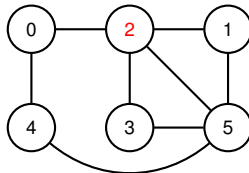
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
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9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	×	✓	×	✓	×

BFS calls:
- BFS(., 0)

Queue: 4
 $v = 2$



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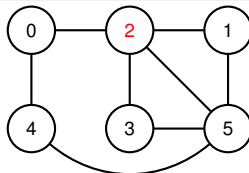
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:

- BFS(., 0)

Queue: 4, 1, 3, 5

$v = 2$



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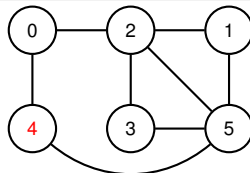
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:

- BFS(., 0)

Queue: 1, 3, 5

$v = 4$



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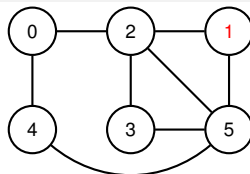
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:

- BFS(., 0)

Queue: 3, 5

$v = 1$



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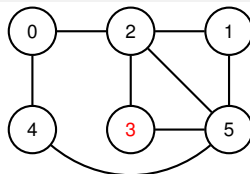
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:
- BFS(., 0)

Queue: 5
 $v = 3$



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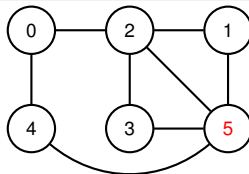
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:

- BFS(., 0)

Queue: -

v = 5



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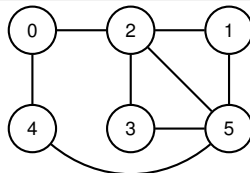
Graph traversals: BFS

Algorithm: void
BFS(G g, int start)

```

1  Q ← create_queue();
2  enqueue(Q, start);
3  setMark(g, start, VISITED);
4  while length(Q) > 0 do
5      v ← dequeue(Q);
6      preVisit(g, v);
7      w ← first(g, v);
8      while w < n(g) do
9          if getMark(g, w) =
             UNVISITED then
10             setMark(g, w, VISITED);
11             enqueue(Q, w);
12             w ← next(g, v, w);
13  posVisit(g, v);

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓

BFS calls:

- BFS(., 0)

Queue: -



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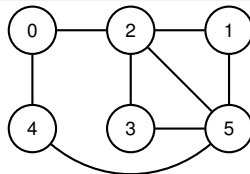
Graph traversals: BFS

Algorithm: void
graphTraverse(G g)

```

1  for  $v \leftarrow 0$  to  $n(g) - 1$  do
2     $\text{setMark}(g, v, \text{UNVISITED});$ 
3  for  $v \leftarrow 0$  to  $n(g) - 1$  do
4    if  $\text{getMark}(g, v) = \text{UNVISITED}$ 
      then  $\text{BFS}(g, v);$ 

```



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓



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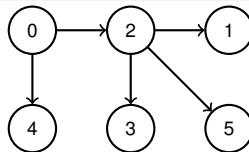
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	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓



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Agenda

1 Introduction

2 Graph traversals

3 Applications of DFS and BFS

4 Bibliography



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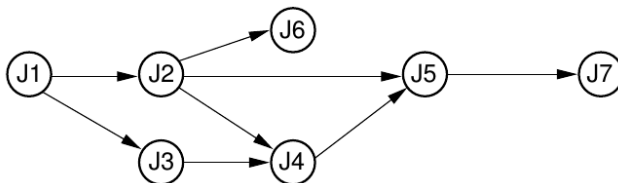


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DFS: topological sorting⁵

Let G be a **DAG** (directed acyclic graph), find a solution considering the informed prerequisites

- Assumption: $u \rightarrow v$ means that u is a prerequisite of v



⁵Source: C. Shaffer. Data Structures and Algorithm Analysis. 2013.

DFS: topological sorting

Algorithm: void toposort($G\ g$, int v , STACK s)

```

1  setMark( $g$ ,  $v$ , VISITED);
2   $w \leftarrow \text{first}(g, v)$ ;
3  while  $w < n(g)$  do
4      if getMark( $g$ ,  $w$ ) = UNVISITED then
5          |   toposort( $g$ ,  $w$ ,  $s$ );
6          |    $w \leftarrow \text{next}(g, v, w)$ ;
7  push( $s$ ,  $v$ );           // we will have in  $s$  a solution

```

For the given example: J1, J3, J2, J6, J4, J5, J7



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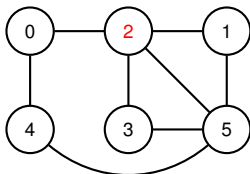
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BFS: shortest path on unweighted graphs

Similar to the original BFS code

- Start the search on the origin
- When the destination is reached, stop the search
- To reconstruct the path: auxiliary array to store **predecessors**

Let the origin be 0 and the destination be 5, solution = $0 \rightarrow 2 \rightarrow 5$



	0	1	2	3	4	5
Mark	✓	✓	✓	✓	✓	✓
Pred	-	2	0	2	0	2



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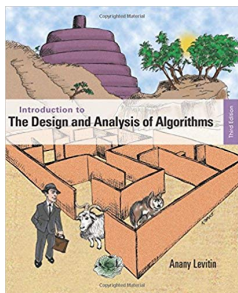


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GRAPHS

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