



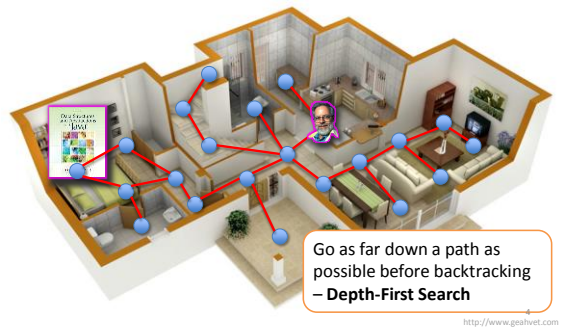
Where did David leave that book?



Where did David leave that book?



Where did David leave that book?



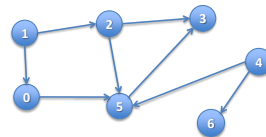
## Graph Algorithms

- Search
  - Depth-first search
  - Breadth-first search
- Shortest paths
  - Dijkstra's algorithm
- Minimum spanning trees
  - Prim's algorithm
  - Kruskal's algorithm

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## Reachability

Node  $v$  is reachable from node  $u$  if there is a path from  $u$  to  $v$ .

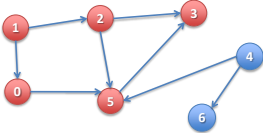


Which nodes are reachable from node 1?

6

## Reachability

Node  $v$  is reachable from node  $u$  if there is a path from  $u$  to  $v$ .

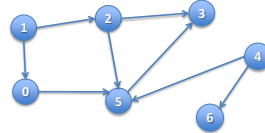


Which nodes are reachable from node 1?  
0, 1, 2, 3, 5

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## Reachability

Node  $v$  is reachable from node  $u$  if there is a path from  $u$  to  $v$ .

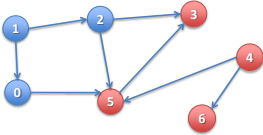


Which nodes are reachable from node 4?

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## Reachability

Node  $v$  is reachable from node  $u$  if there is a path from  $u$  to  $v$ .



Which nodes are reachable from node 4?  
3, 4, 5, 6

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## Reachability

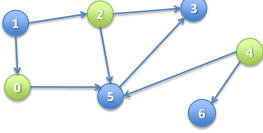
We need an invariant!

How to determine reachability efficiently?

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## Reachability

Node  $v$  is reachable from node  $u$  without green nodes if there is a path from  $u$  to  $v$  without green nodes.



Which nodes are reachable from node 1 without green nodes?

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## Reachability

Node  $v$  is reachable from node  $u$  without green nodes if there is a path from  $u$  to  $v$  without green nodes.

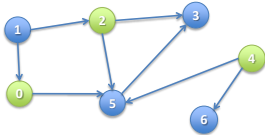


Which nodes are reachable from node 1 without green nodes?  
1

12

## Reachability

Node  $v$  is reachable from node  $u$  **without green nodes** if there is a path from  $u$  to  $v$  **without green nodes**.

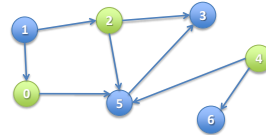


Which nodes are reachable from node 4 without green nodes?

13

## Reachability

Node  $v$  is reachable from node  $u$  **without green nodes** if there is a path from  $u$  to  $v$  **without green nodes**.



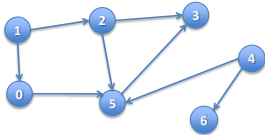
Which nodes are reachable from node 4 without green nodes?  
None!

Node 4 is green, so all paths from node 4 contain a green node!

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## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further

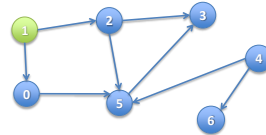


Which nodes are reachable from node 1?

15

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



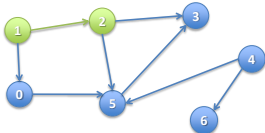
Which nodes are reachable from node 1?

- Start at node 1

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## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



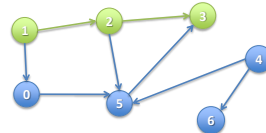
Which nodes are reachable from node 1?

- Extend path to some child

17

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



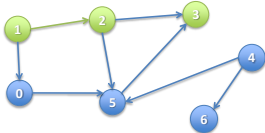
Which nodes are reachable from node 1?

- Extend path to some child

18

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



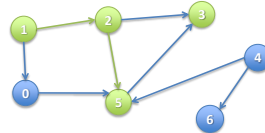
Which nodes are reachable from node 1?

- No new way to extend path, so backtrack

19

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



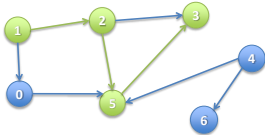
Which nodes are reachable from node 1?

- Extend path to a different child

20

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



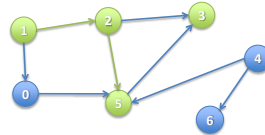
Which nodes are reachable from node 1?

- Extend path to some child

21

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



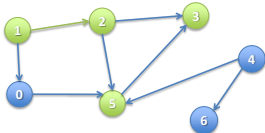
Which nodes are reachable from node 1?

- Already visited, so backtrack

22

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



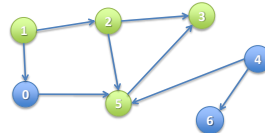
Which nodes are reachable from node 1?

- No new way to extend path, so backtrack

23

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



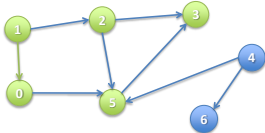
Which nodes are reachable from node 1?

- No new way to extend path, so backtrack

24

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



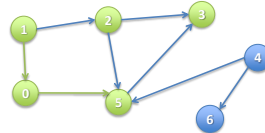
Which nodes are reachable from node 1?

- Extend path to a different child

25

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



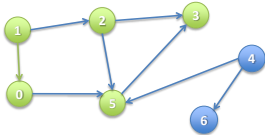
Which nodes are reachable from node 1?

- Extend path to some child

26

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



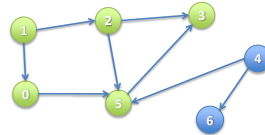
Which nodes are reachable from node 1?

- Already visited, so backtrack

27

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



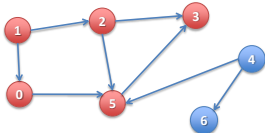
Which nodes are reachable from node 1?

- No new way to extend path, so backtrack

28

## Depth-First Search

- Keep pushing the search forward
- Mark nodes as “visited” (green) as you go
- Backtrack only when you can’t go any further



Which nodes are reachable from node 1?

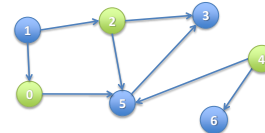
- Nothing to backtrack, so all done!

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## Depth-First Search using Recursion

```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    if (u.hasBeenVisited()) return;
```

```
}
```

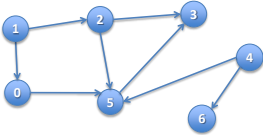


Which nodes are reachable from node 4 without green nodes?  
None!

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## Depth-First Search using Recursion

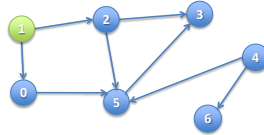
```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    if (u.hasBeenVisited()) return;
}
}
```



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## Depth-First Search using Recursion

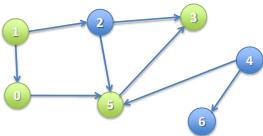
```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    if (u.hasBeenVisited()) return;
    u.visit();
    for (Node v with edge from u to v) dfs(v);
}
}
```



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## Depth-First Search using Recursion

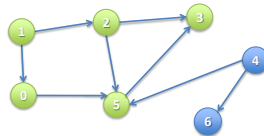
```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    if (u.hasBeenVisited()) return;
    u.visit();
    for (Node v with edge from u to v) dfs(v);
}
}
```



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## Depth-First Search using Recursion

```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    if (u.hasBeenVisited()) return;
    u.visit();
    for (Node v with edge from u to v) dfs(v);
}
}
```



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## OO-style Recursive Depth-First Search

```
class Node {
    final List<Node> targets; // edges go from this to targets
    boolean visited= false; // has this node been visited?
    Node(Node... targets) { this.targets= Arrays.asList(targets); }
    /**Visit all nodes reachable from this without visited nodes*/
    void dfs() {
        if (visited) return;
        visited= true;
        for (Node v : targets) v.dfs();
    }
}
}
```

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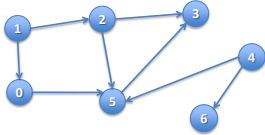
## Depth-First Search using Iteration

```
/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    Collection<Node> work= new Stack<Node>();
    work.add(u);
    // inv: all nodes that have to be visited are
    // reachable (without visited nodes) from some node in work
    while (!work.isEmpty()) {
        Node u= work.pop(); // Remove first node and put it in u
        if (!u.hasBeenVisited()) {
            u.visit();
            for (Node v with edge from u to v)
                work.add(v); // Stack adds nodes to front
        }
    }
}
}
```

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## Breadth-First Search

- Mark closest nodes as “visited” (green) first
- Then push search out further

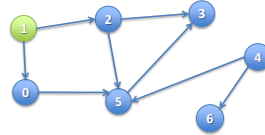


Which nodes are reachable from node 1?

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## Breadth-First Search

- Mark closest nodes as “visited” (green) first
- Then push search out further



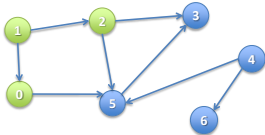
Which nodes are reachable from node 1?

38

- Visit nodes distance 0 from node 1

## Breadth-First Search

- Mark closest nodes as “visited” (green) first
- Then push search out further



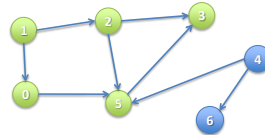
Which nodes are reachable from node 1?

39

- Visit nodes distance 1 from node 1

## Breadth-First Search

- Mark closest nodes as “visited” (green) first
- Then push search out further



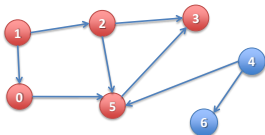
Which nodes are reachable from node 1?

40

- Visit nodes distance 2 from node 1

## Breadth-First Search

- Mark closest nodes as “visited” (green) first
- Then push search out further



Which nodes are reachable from node 1?

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- No nodes at distance 3, so all done!

## Depth-First Search using Iteration

```

/** Visit all nodes reachable from u without visited nodes */
void dfs(Node u) {
    Collection<Node> work= new Stack<Node>();
    work.add(u);
    // inv: all nodes that have to be visited are
    // reachable (without visited nodes) from some node in work
    while (!work.isEmpty()) {
        Node u= work.pop(); // Remove first node and put it in u
        if (!u.hasBeenVisited()) {
            u.visit();
            for (Node v with edge from u to v)
                work.add(v); // Stack adds nodes to front
        }
    }
}
    
```

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## Breadth-First Search using Iteration

```
/** Visit all nodes reachable from u without visited nodes */
void bfs(Node u) {
    Collection<Node> work= new Queue<Node>();
    work.add(u);
    // inv: all nodes that have to be visited are
    //       reachable (without visited nodes) from some node in work
    while (!work.isEmpty()) {
        Node u= work.pop(); // Remove first node and put it in u
        if (!u.hasBeenVisited()) {
            u.visit();
            for (Node v with edge from u to v)
                work.add(v); // Queue adds nodes to back
        }
    }
}
```

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