

Trees and Search Strategies and Algorithms --

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Basic Search Strategies

- depth-first
- breadth-first
- exercise
 - apply depth-first to finding a path from this building to your favorite “feeding station” (McDonalds, Jason Deli, Pizza Hut)
 - is this task sufficiently specified
 - is success guaranteed
 - how long will it take
 - could you remember the path
 - how good is the solution

Motivation

- search strategies are important methods for many approaches to problem-solving
- the use of search requires an abstract formulation of the problem and the available steps to construct solutions
- search algorithms are the basis for many optimization and planning methods

Objectives

- formulate appropriate problems as search tasks
 - states, initial state, goal state, successor functions (operators), cost
- know the fundamental search strategies and algorithms
 - breadth-first, depth-first,
- evaluate the suitability of a search strategy for a problem
 - completeness, time & space complexity, optimality

Problems

- solution
 - path from the initial state to a goal state
- search cost
 - time and memory required to calculate a solution
- path cost
 - determines the expenses of the agent for executing the actions in a path
 - sum of the costs of the individual actions in a path
- total cost
 - sum of search cost and path cost
 - overall cost for finding a solution

Traveling Salesperson

- states
 - locations / cities
 - illegal states
 - each city may be visited only once
 - visited cities must be kept as state information
- initial state
 - starting point
 - no cities visited
- successor function (operators)
 - move from one location to another one
- goal test
 - all locations visited
 - agent at the initial location
- path cost: distance between locations

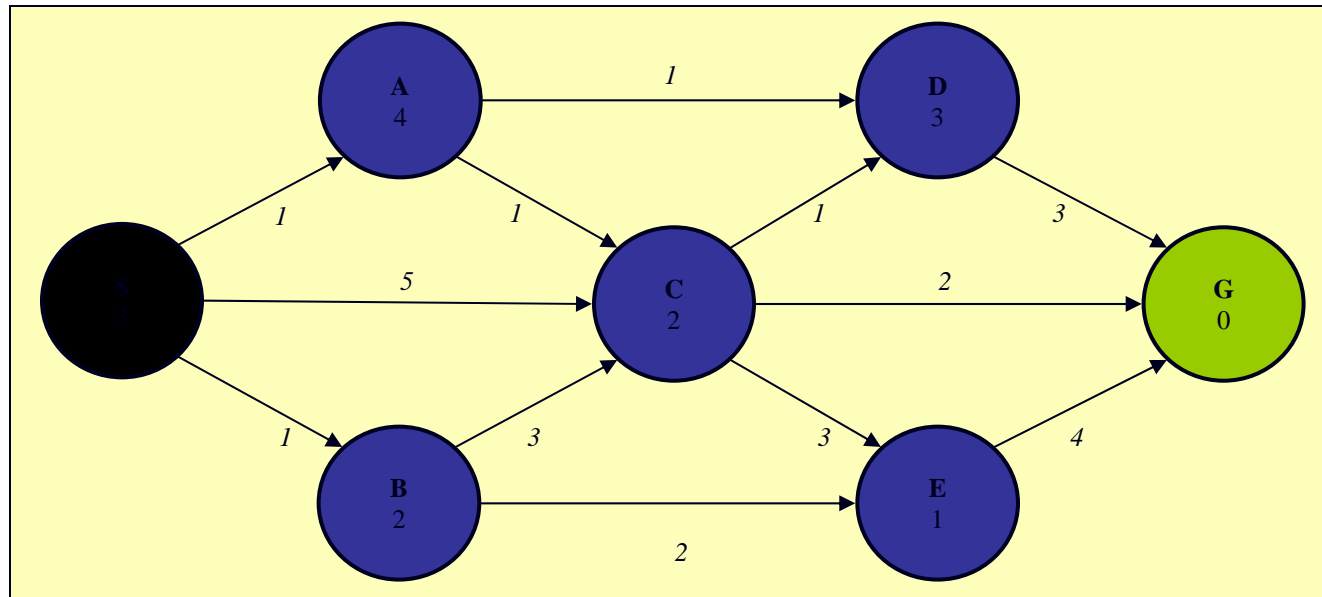
Searching for Solutions

- traversal of the search space
 - from the initial state to a goal state
 - legal sequence of actions as defined by successor function (operators)
- general procedure
 - check for goal state
 - expand the current state
 - determine the set of reachable states
 - return “failure” if the set is empty
 - select one from the set of reachable states
 - move to the selected state
- a search tree is generated

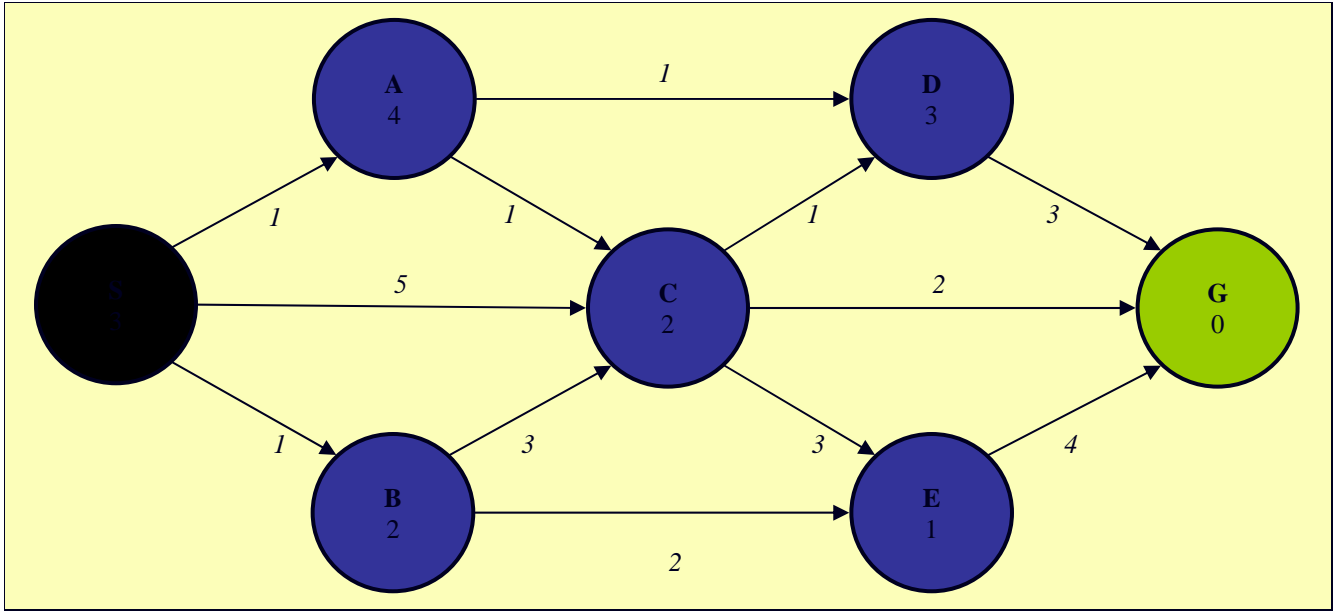
Search Terminology

- search tree
 - generated as the search space is traversed
 - the search space itself is not necessarily a tree, frequently it is a graph
 - the tree specifies possible paths through the search space
 - expansion of nodes
 - as states are explored, the corresponding nodes are *expanded* by applying the successor function
 - this generates a new set of (child) nodes
 - the *fringe* (frontier) is the set of nodes not yet visited
 - newly generated nodes are added to the fringe
 - search strategy
 - determines the selection of the next node to be expanded
 - can be achieved by ordering the nodes in the fringe
 - e.g. queue (FIFO), stack (LIFO), “best” node w.r.t. some measure (cost)

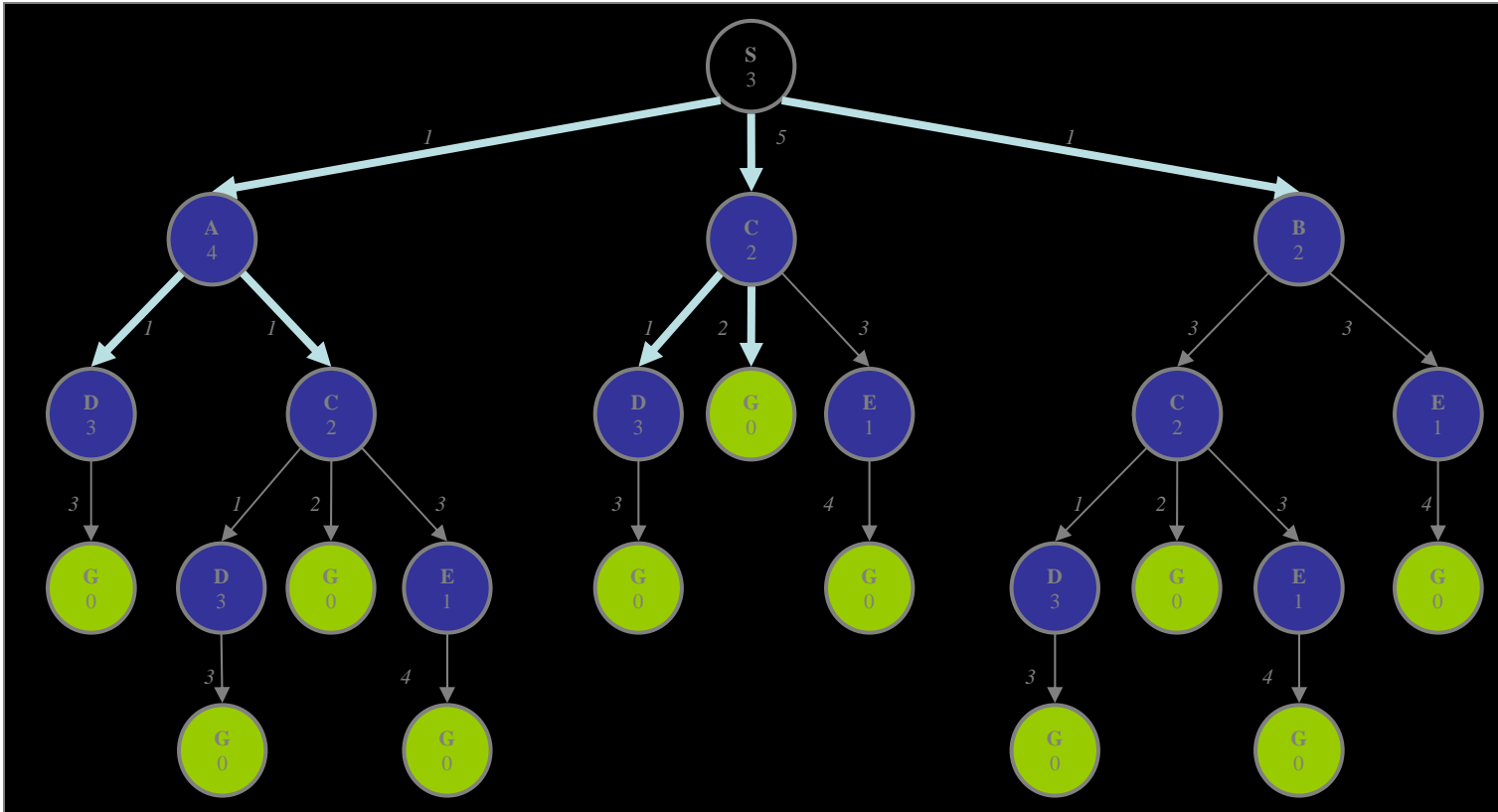
Example: Graph Search



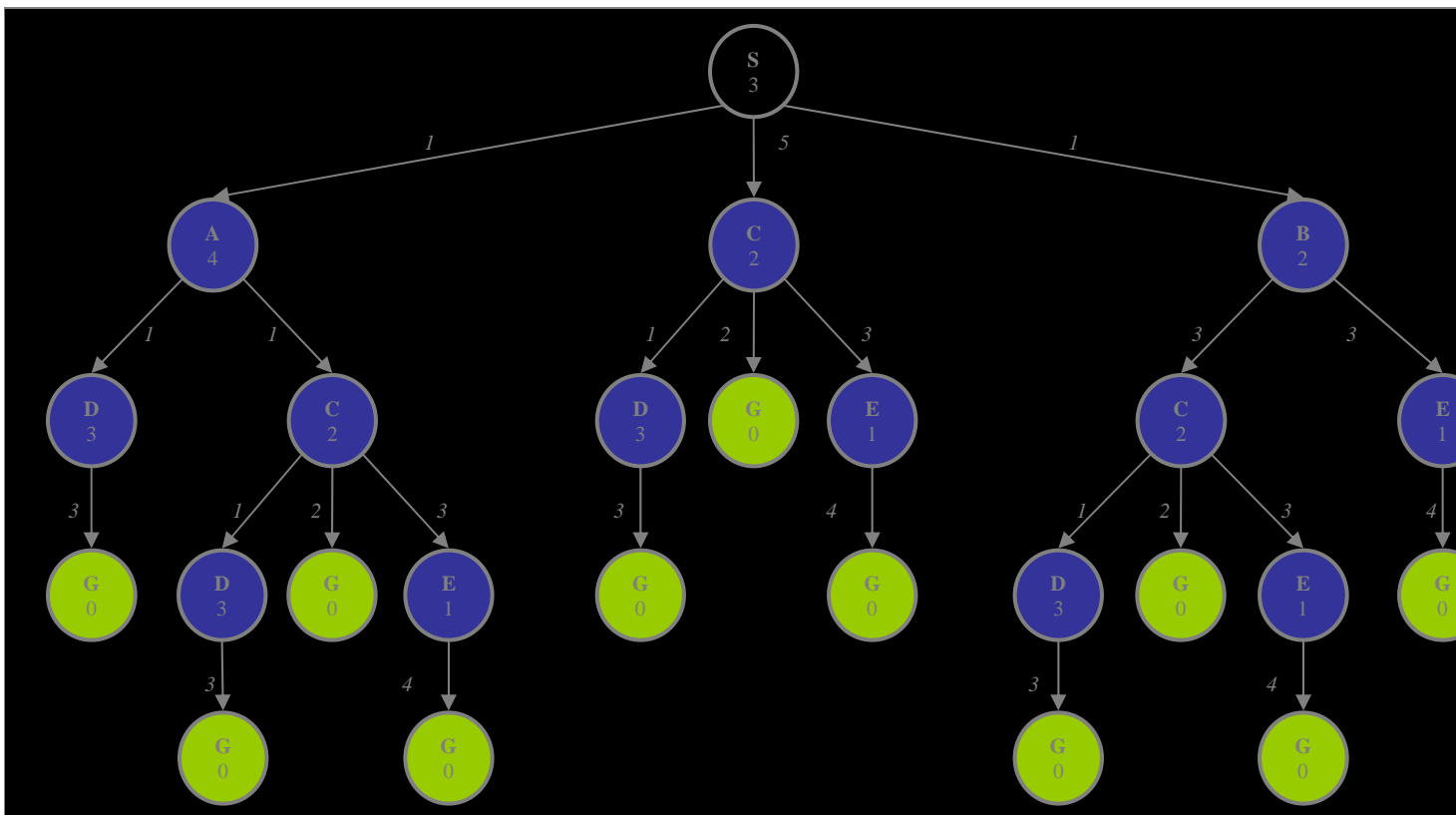
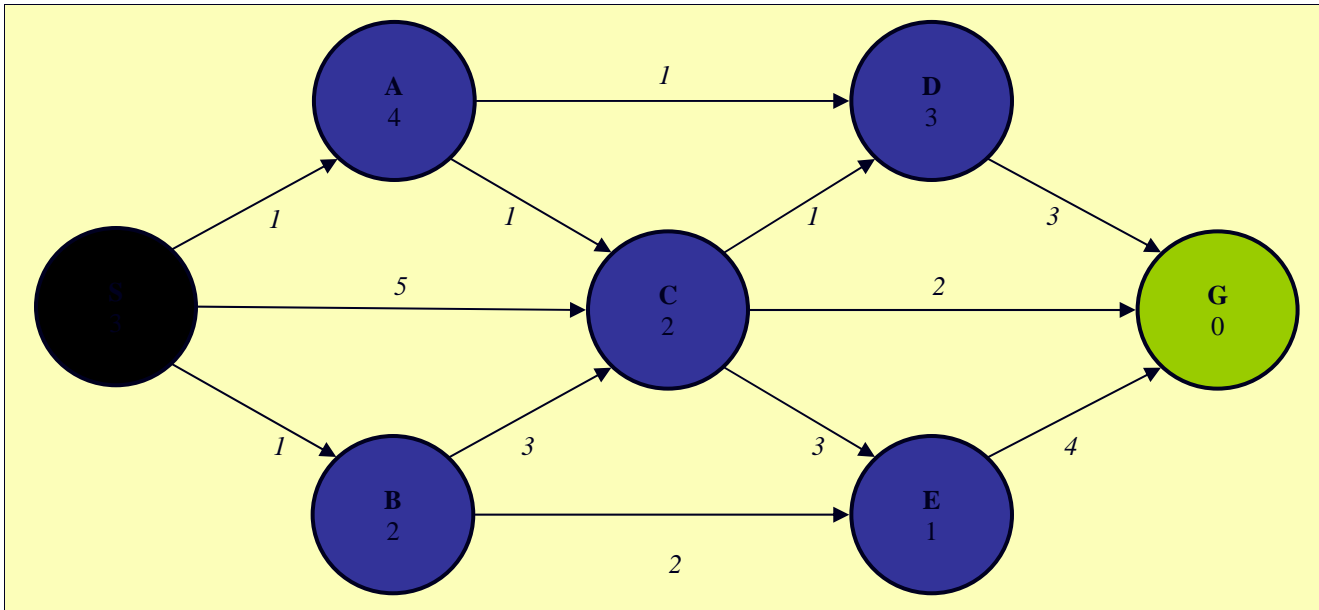
- the graph describes the search (state) space
 - each node in the graph represents one state in the search space. e.g. a city to be visited in a routing or touring problem
- this graph has additional information
 - names and properties for the states (e.g. **S**, 3)
 - links between nodes, specified by the successor function
 - properties for links (distance. cost. name. ...)



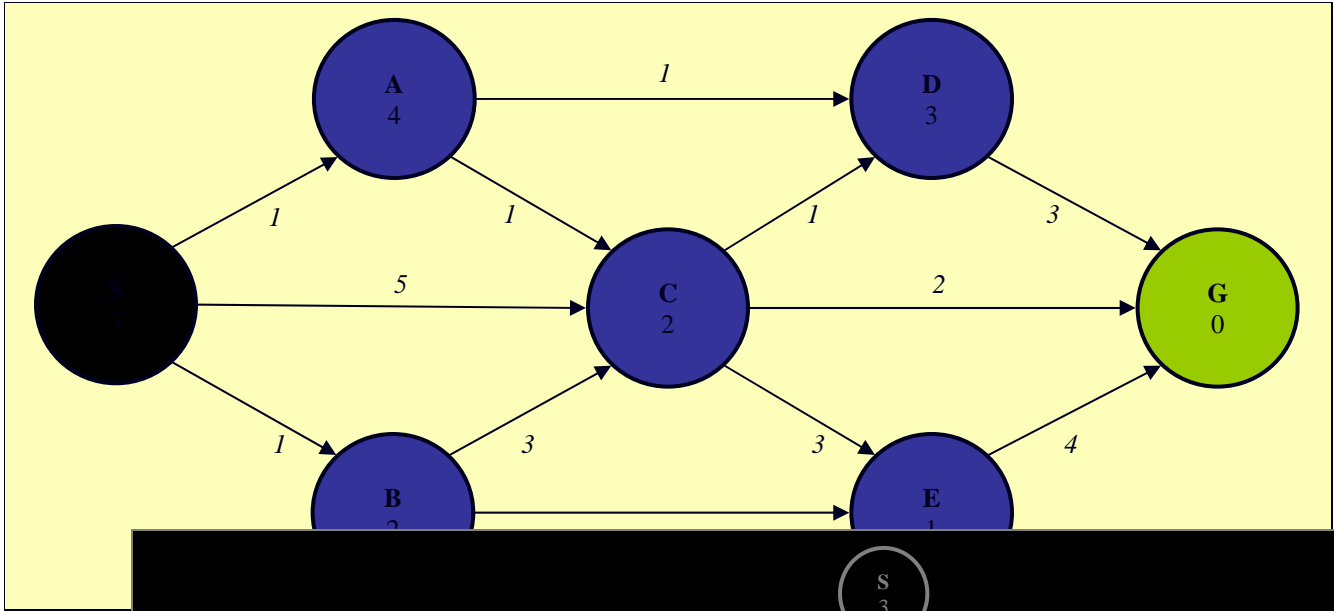
Breadth First Search



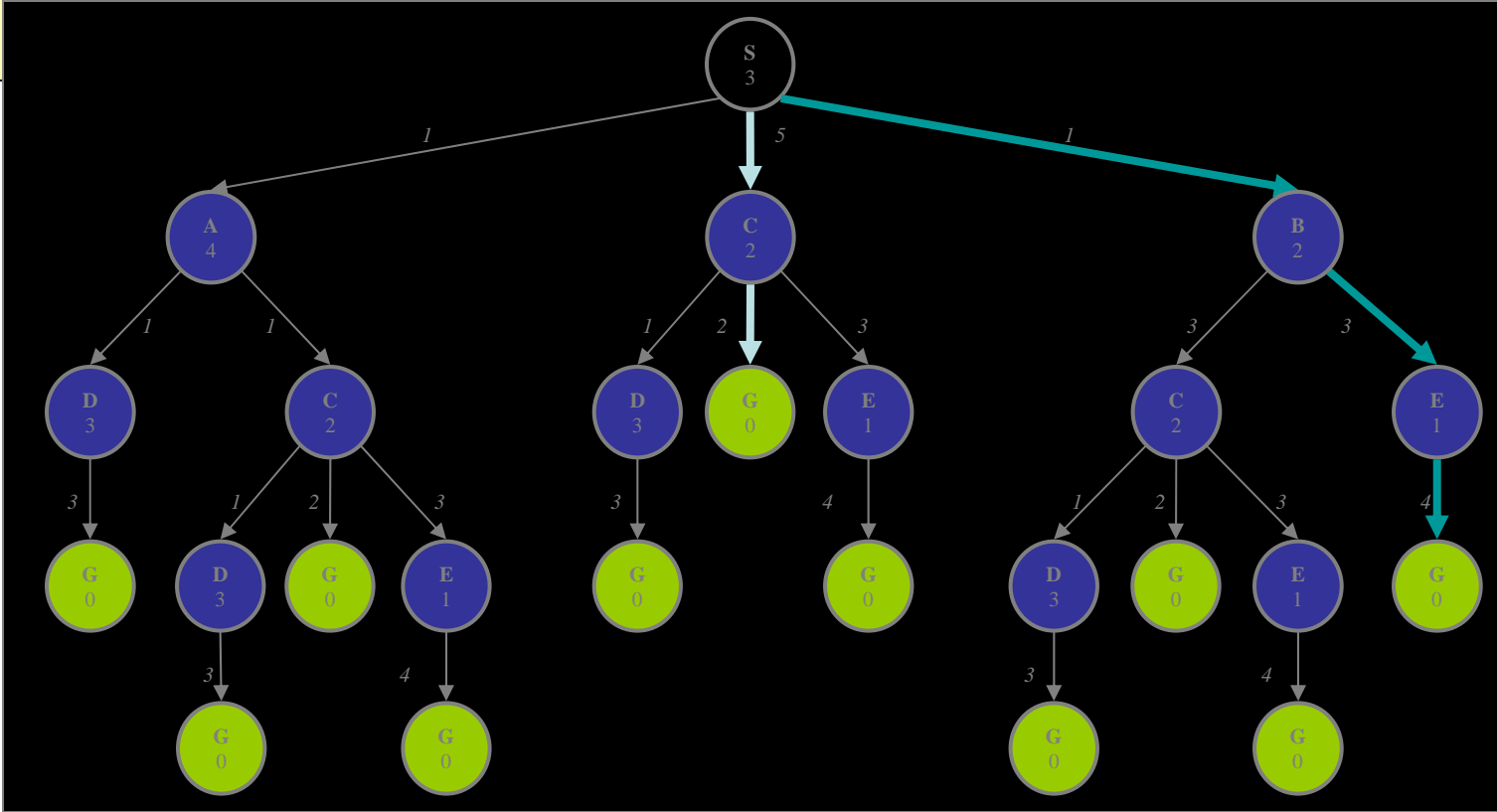
Graph and Tree

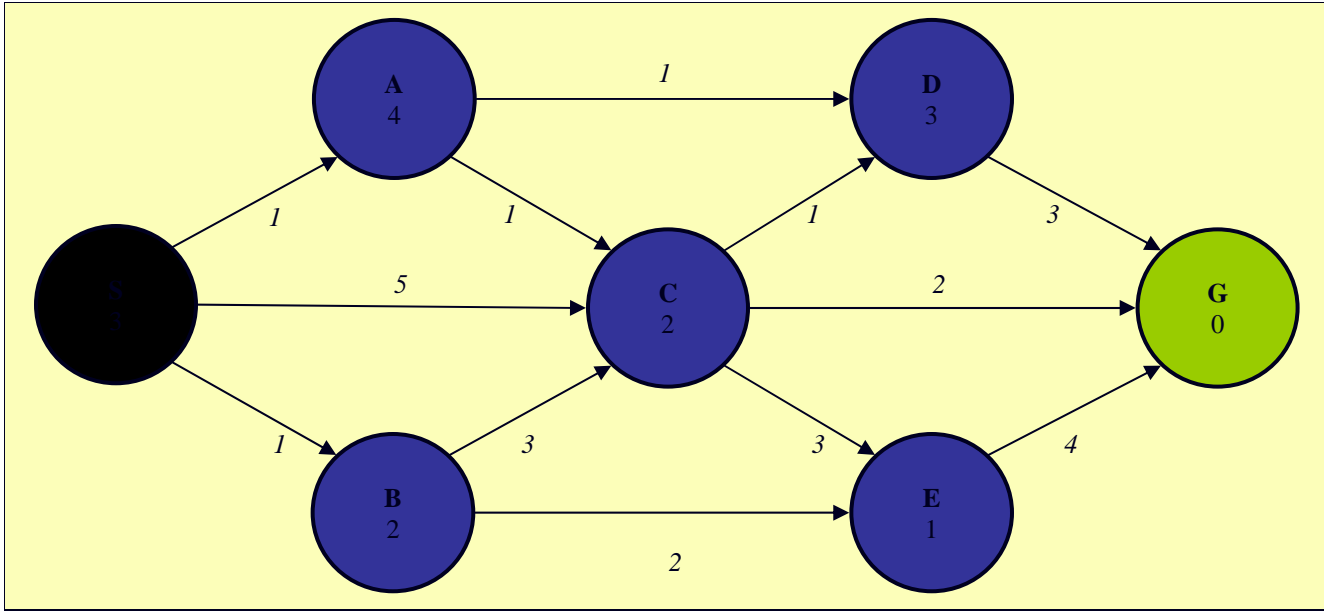


- the tree is generated by traversing the graph
- the same node in the graph may appear repeatedly in the tree
- the arrangement of the tree depends on the traversal strategy (search method)
- the initial state becomes the root node of the tree
- in the fully expanded tree, the goal states are the leaf nodes

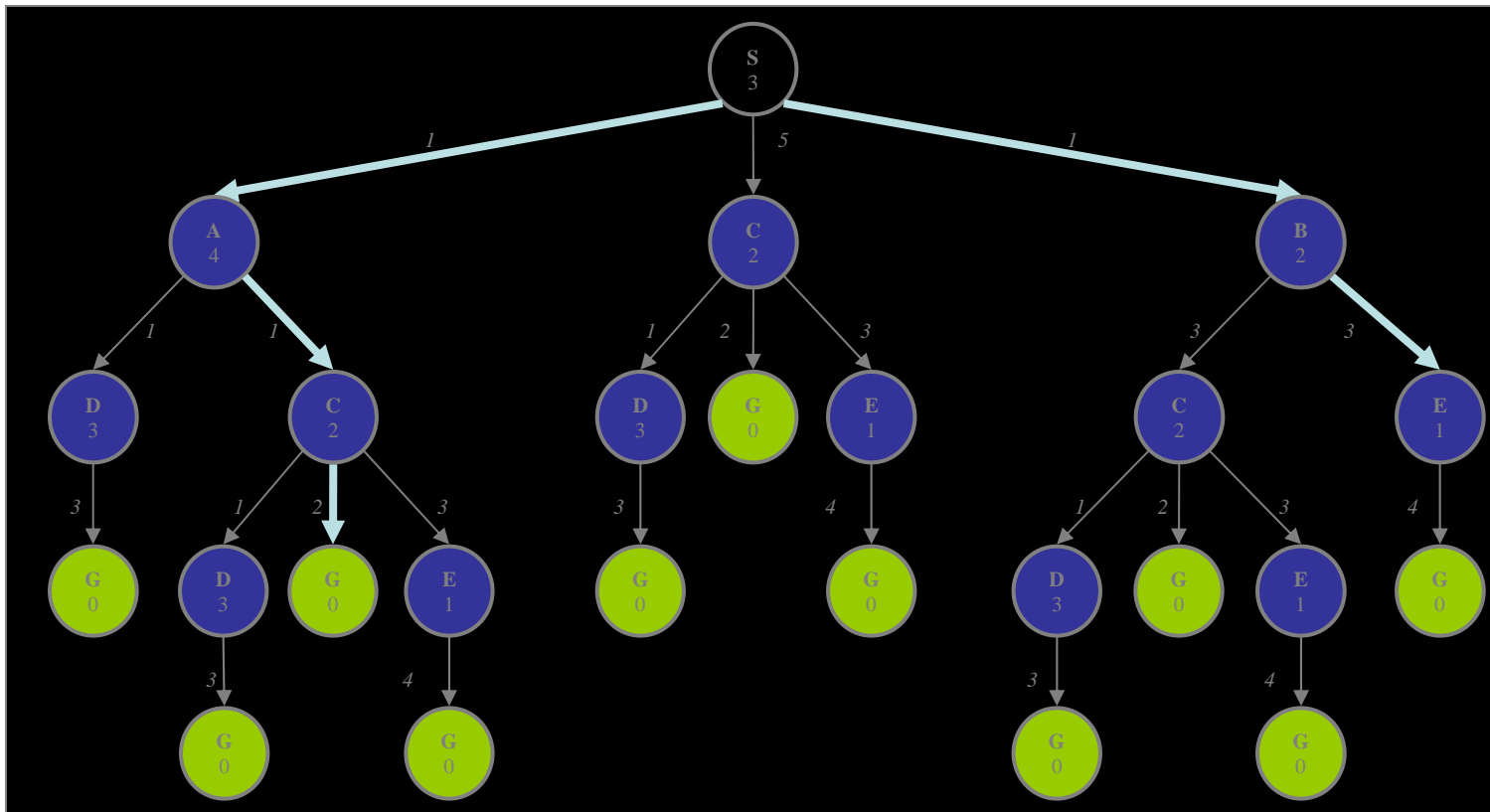


Greedy Search





A*
Search



General Search Algorithm

```
function TREE-SEARCH(problem, fringe) returns solution  
  fringe := INSERT(MAKE-NODE(INITIAL-STATE[problem]), fringe)  
  loop do  
    if EMPTY?(fringe) then return failure  
    node := REMOVE-FIRST(fringe)  
    if GOAL-TEST[problem] applied to STATE[node] succeeds  
      then return SOLUTION(node)  
    fringe := INSERT-ALL(EXPAND(node, problem), fringe)
```

- generate the node from the initial state of the problem
- repeat
 - return failure if there are no more nodes in the fringe
 - examine the current node; if it's a goal, return the solution
 - expand the current node, and add the new nodes to the fringe

General Search Algorithm

```
function GENERAL-SEARCH(problem, QUEUING-FN) returns solution  
  nodes := MAKE-QUEUE(MAKE-NODE(INITIAL-STATE[problem]))  
  loop do  
    if nodes is empty then return failure  
    node := REMOVE-FRONT(nodes)  
    if GOAL-TEST[problem] applied to STATE(node) succeeds  
      then return node  
    nodes := QUEUING-FN(nodes, EXPAND(node,  
      OPERATORS[problem]))  
end
```

Evaluation Criteria

- completeness
 - if there is a solution, will it be found
- time complexity
 - how long does it take to find the solution
 - does not include the time to perform actions
- space complexity
 - memory required for the search
- optimality
 - will the best solution be found

main factors for complexity considerations:

branching factor b , depth d of the shallowest goal node, maximum path length m

Search Cost

- the *search cost* indicates how expensive it is to generate a solution
 - time complexity (e.g. number of nodes generated) is usually the main factor
 - sometimes space complexity (memory usage) is considered as well
- *path cost* indicates how expensive it is to execute the solution found in the search
 - distinct from the search cost, but often related
- *total cost* is the sum of search and path

Breadth-First

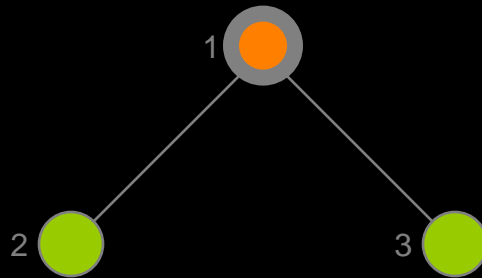
- all the nodes reachable from the current node are explored first
 - achieved by the TREE-SEARCH method by appending newly generated nodes at the end of the search queue







```
function BREADTH-FIRST-SEARCH(problem) returns solution  
  
    return TREE-SEARCH(problem, FIFO-QUEUE())
```

| | |
|------------------|-----------------------------------|
| Time Complexity | b^{d+1} |
| Space Complexity | b^{d+1} |
| Completeness | yes (for finite b) |
| Optimality | yes (for non-negative path costs) |

| | |
|-----|-------------------|
| b | branching factor |
| d | depth of the tree |

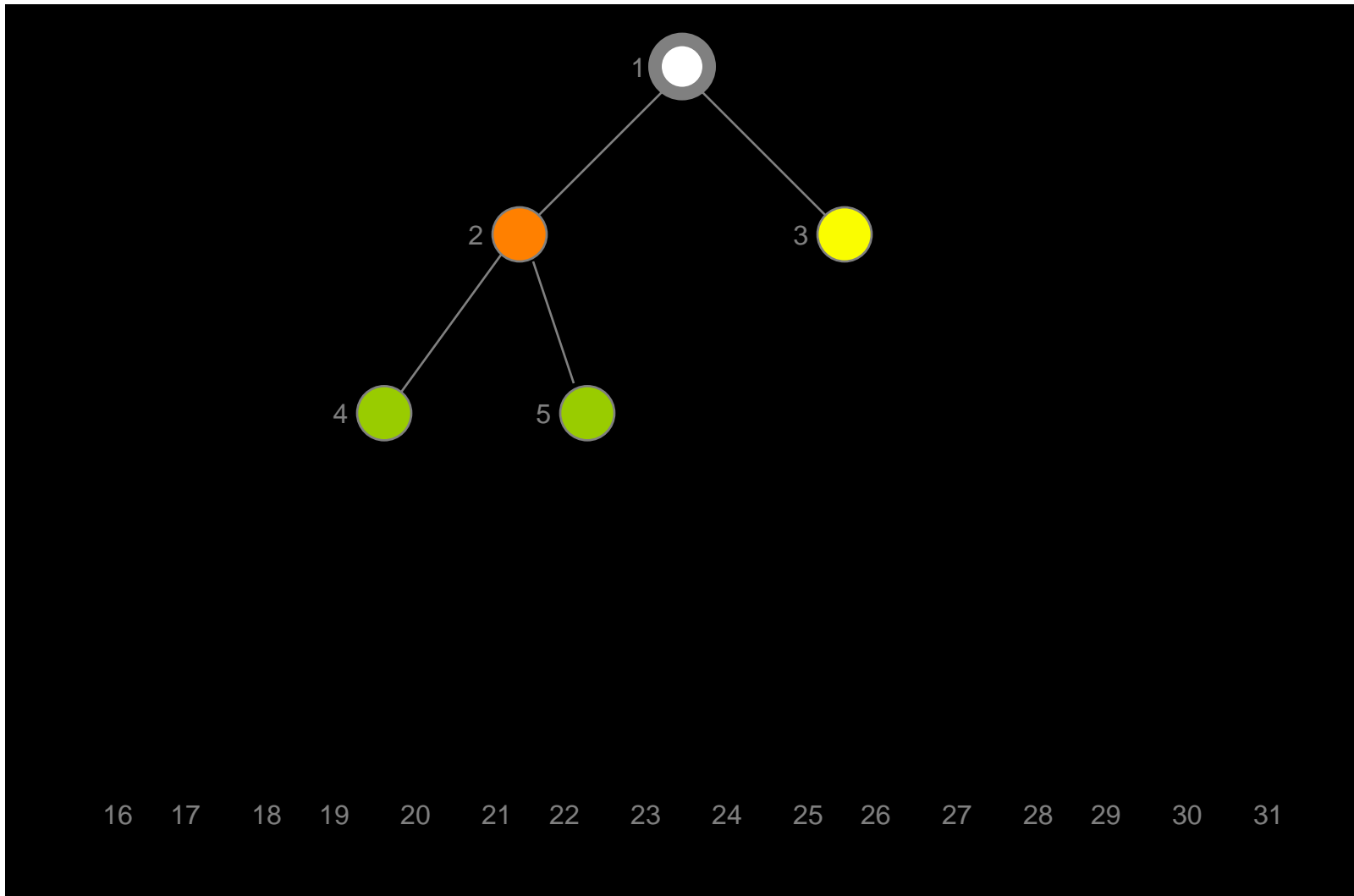
Breadth-First Snapshot 1









- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

Fringe: [] + [2,3]

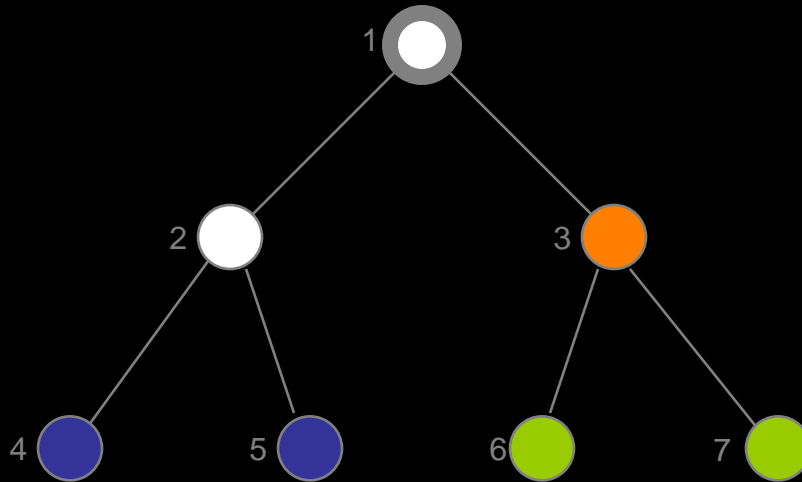
Breadth-First Snapshot 2









- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

Fringe: [3] + [4,5]

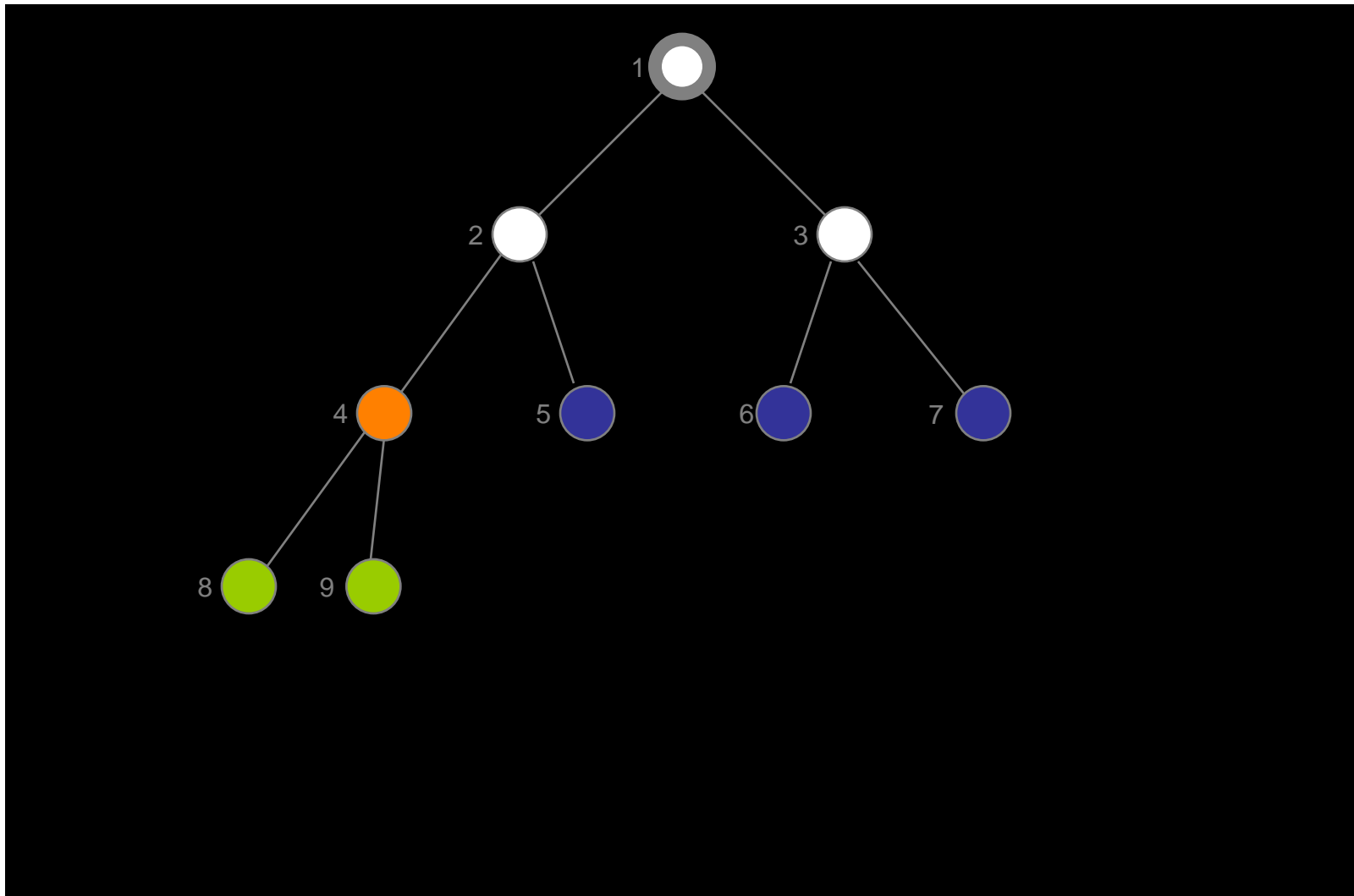
Breadth-First Snapshot 3









- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

Fringe: [4,5] + [6,7]

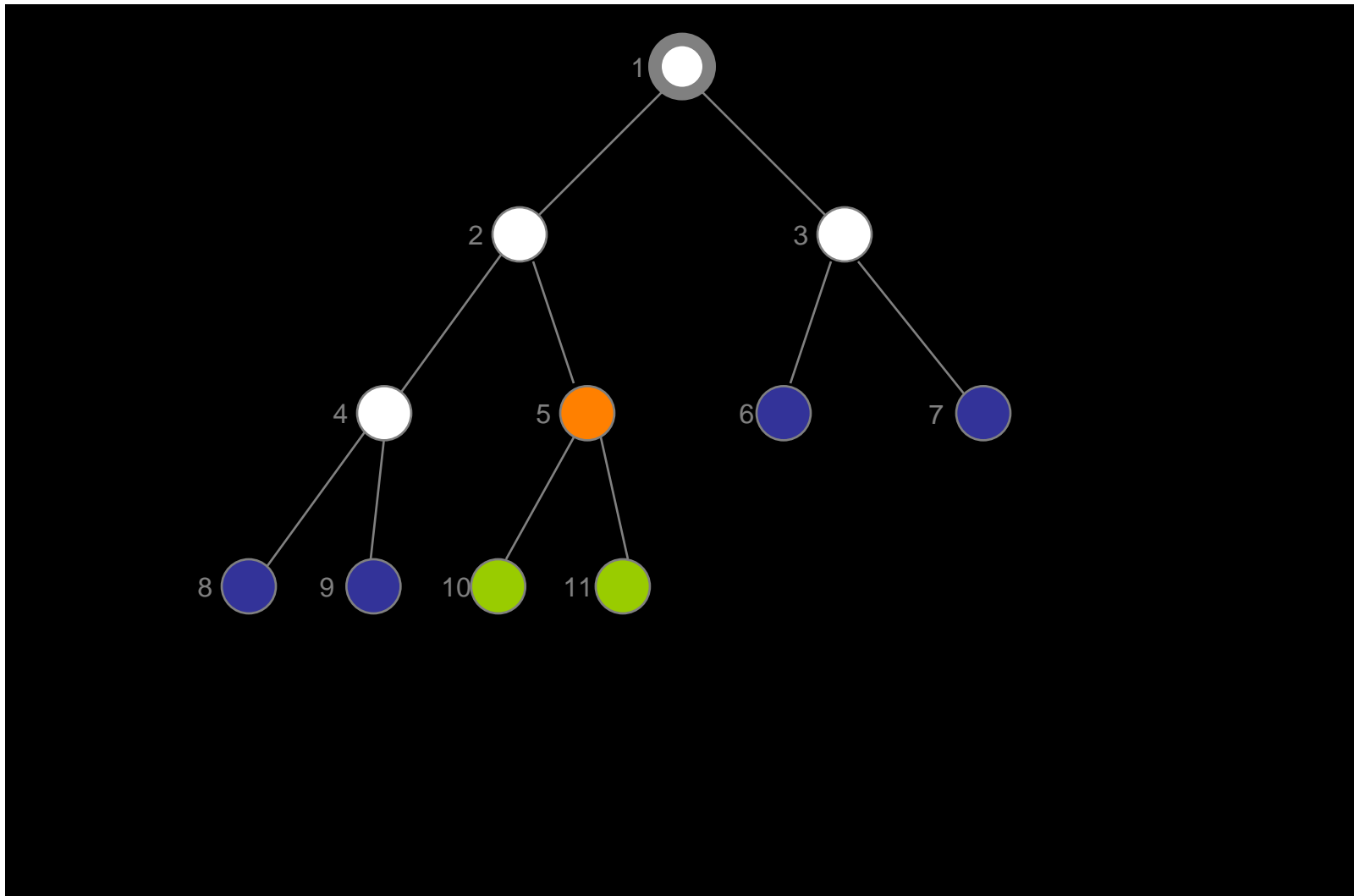
Breadth-First Snapshot 4









- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

Fringe: [5,6,7] + [8,9]

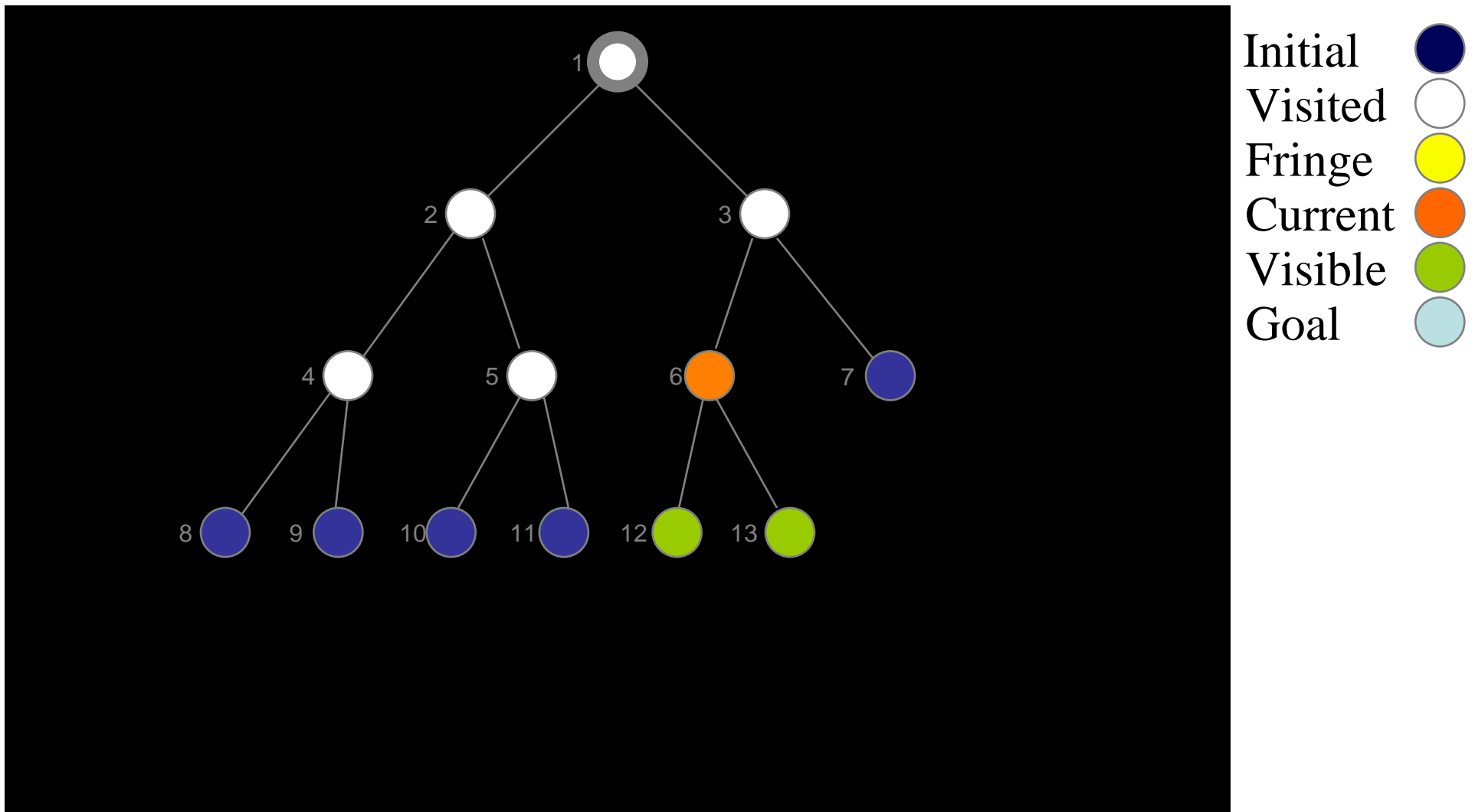
Breadth-First Snapshot 5



- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

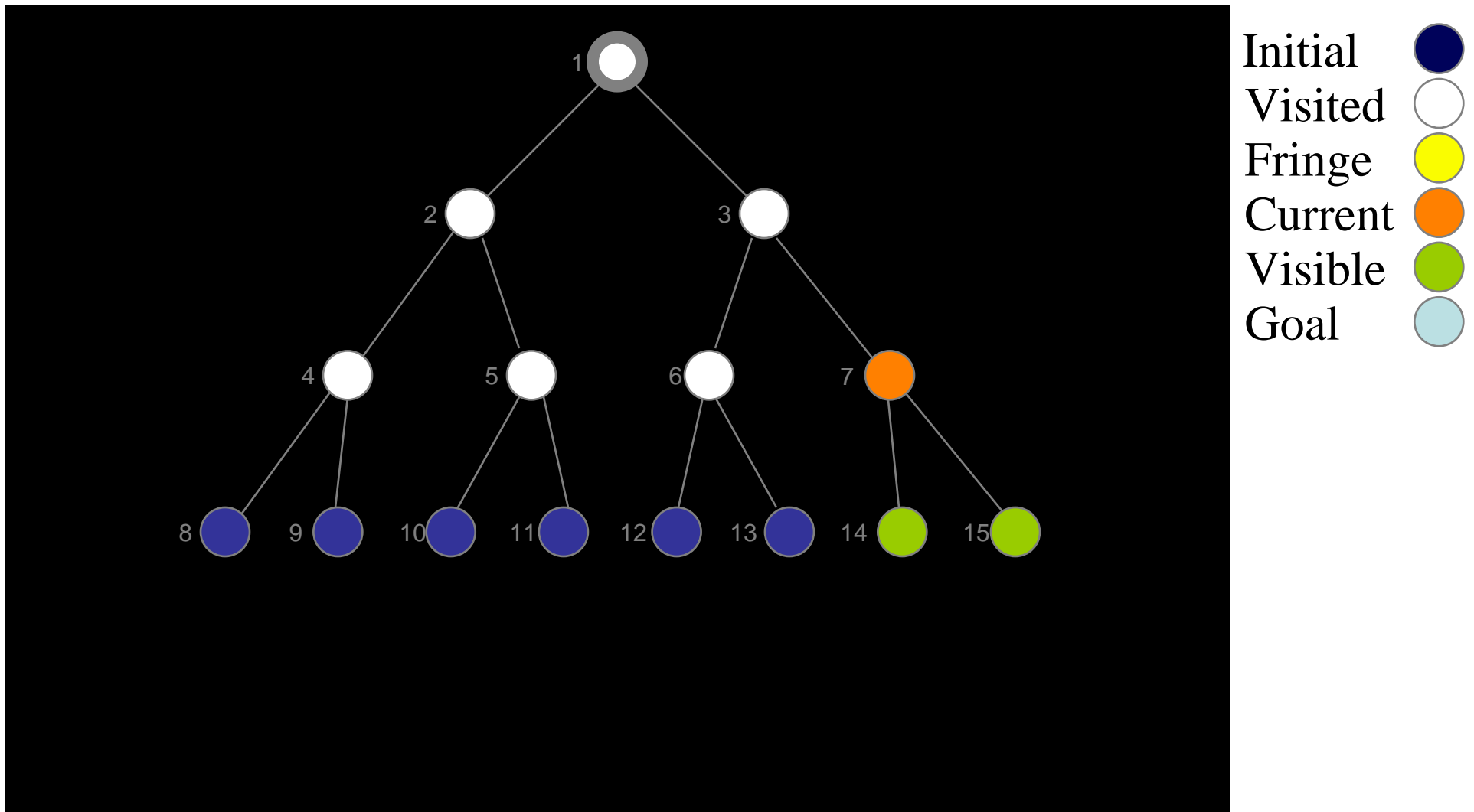
Fringe: [6,7,8,9] + [10,11]

Breadth-First Snapshot 6



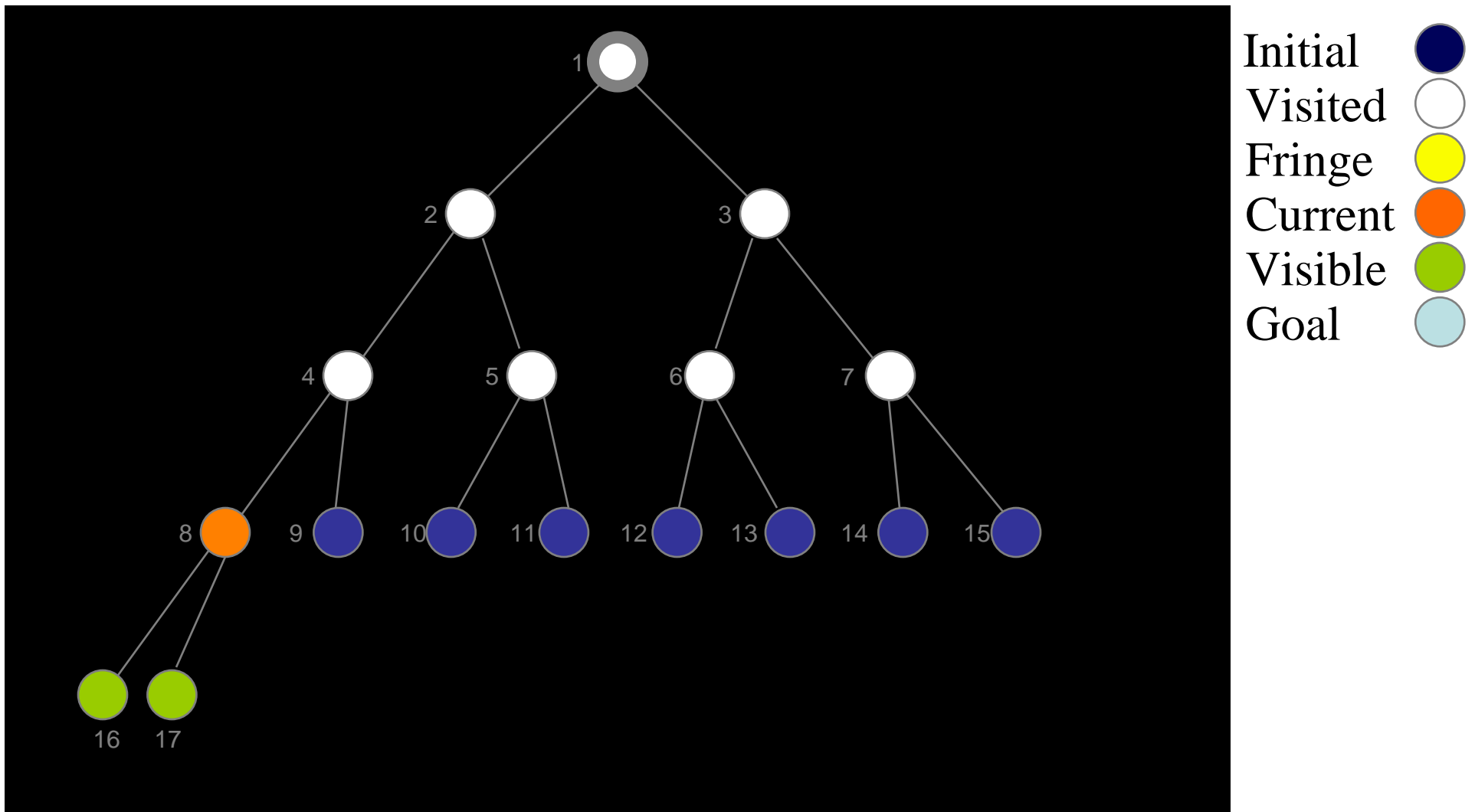
Fringe: [7,8,9,10,11] + [12,13]

Breadth-First Snapshot 7



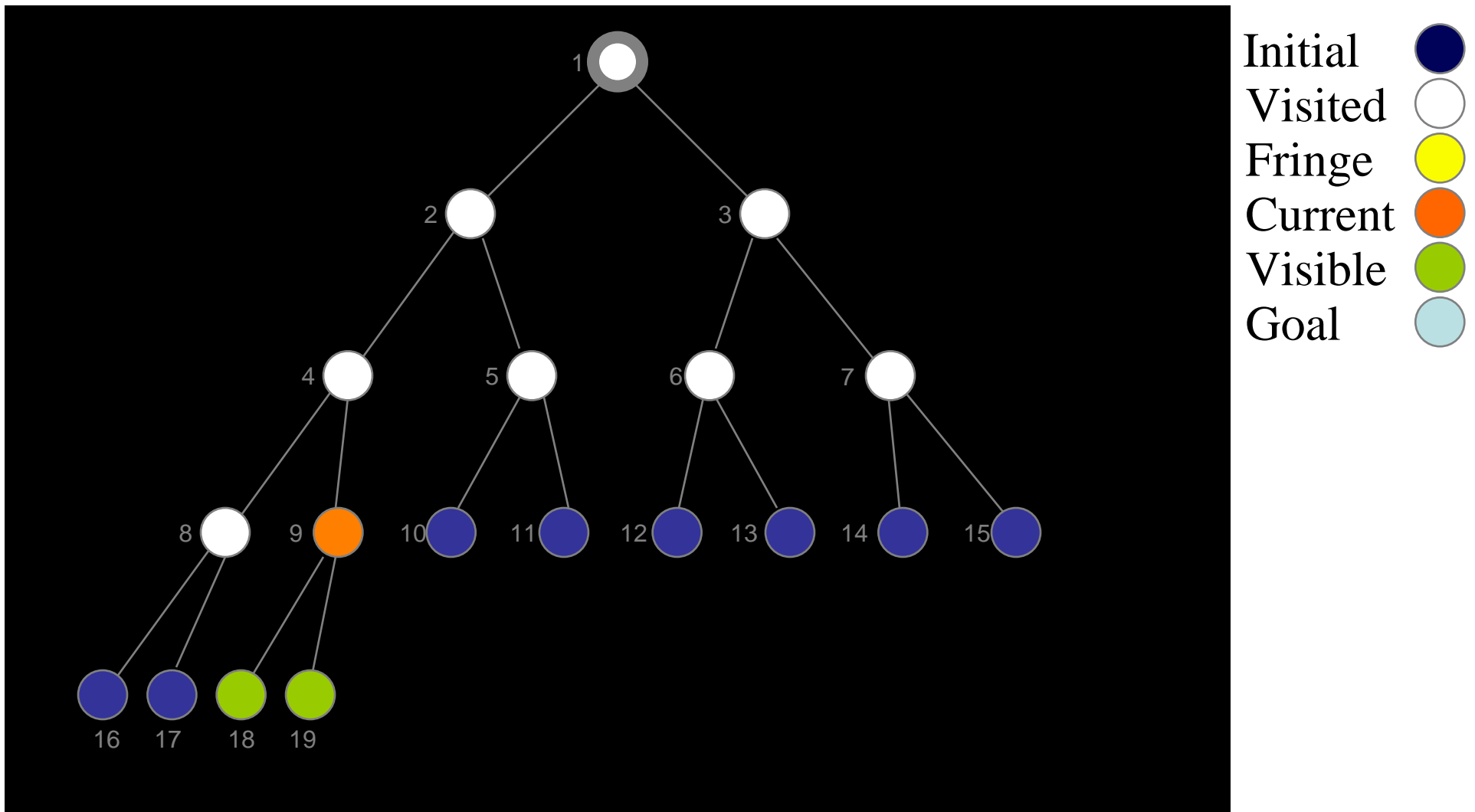
Fringe: [8,9,10,11,12,13] + [14,15]

Breadth-First Snapshot 8



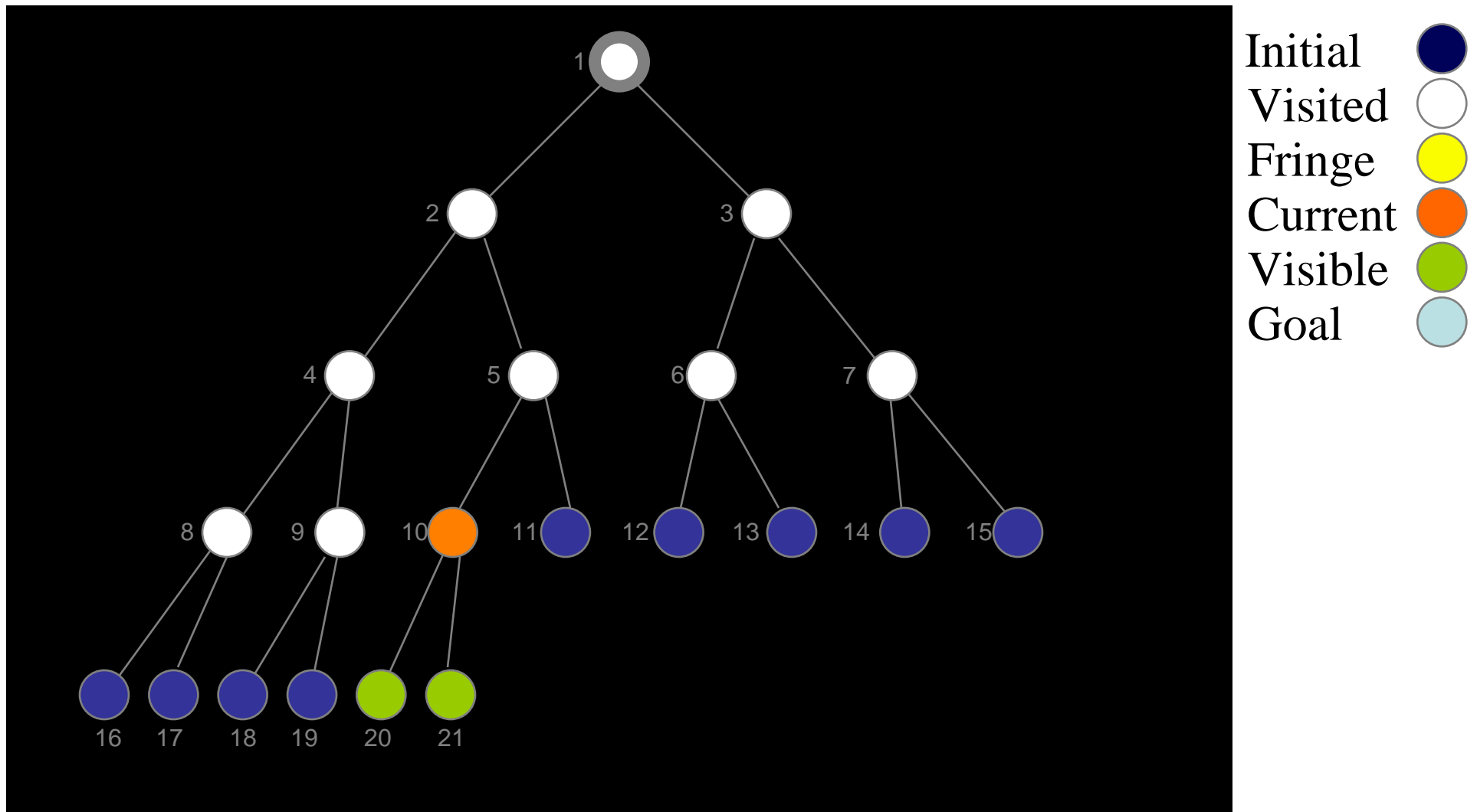
Fringe: [9,10,11,12,13,14,15] + [16,17]

Breadth-First Snapshot 9



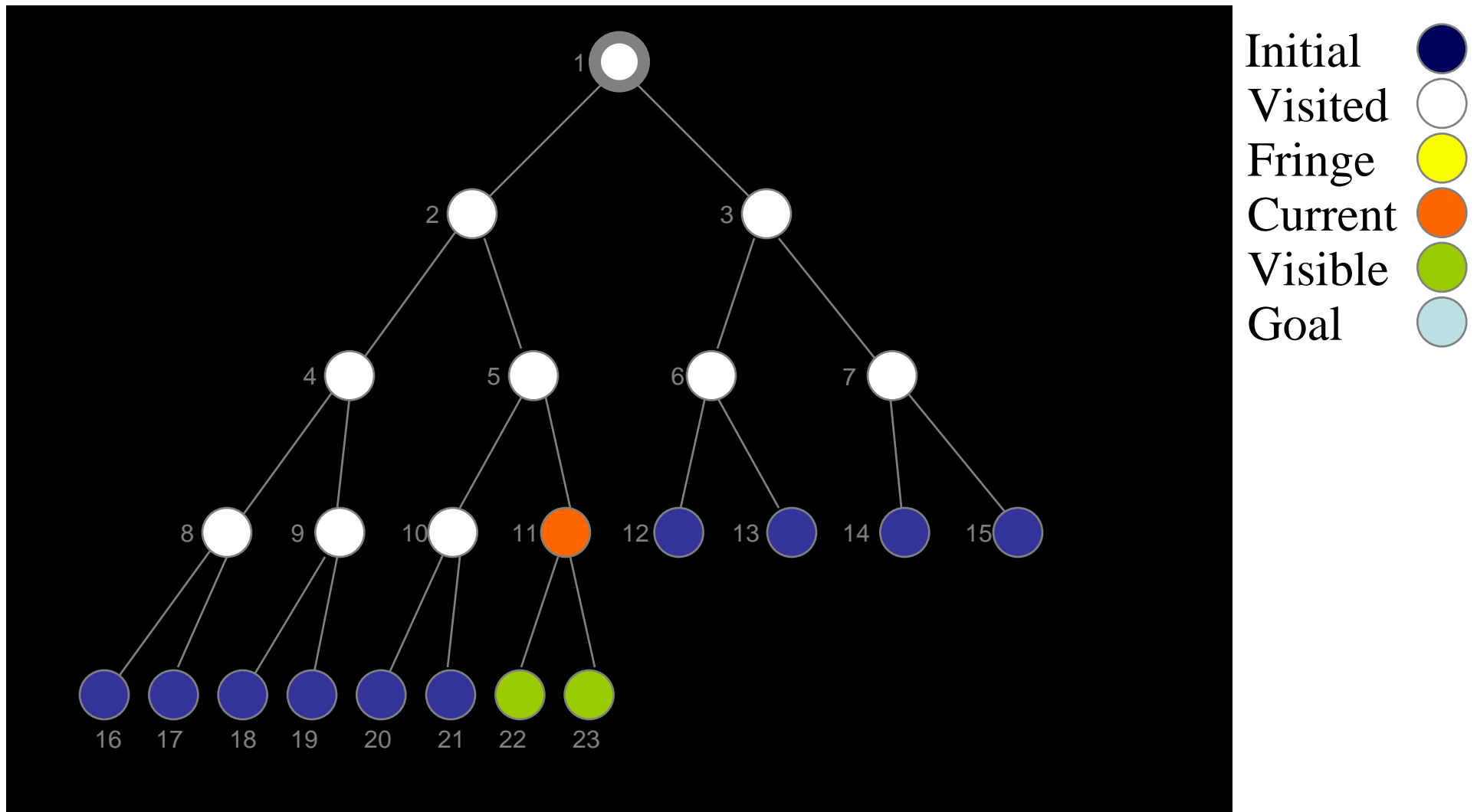
Fringe: [10,11,12,13,14,15,16,17] + [18,19]

Breadth-First Snapshot 10



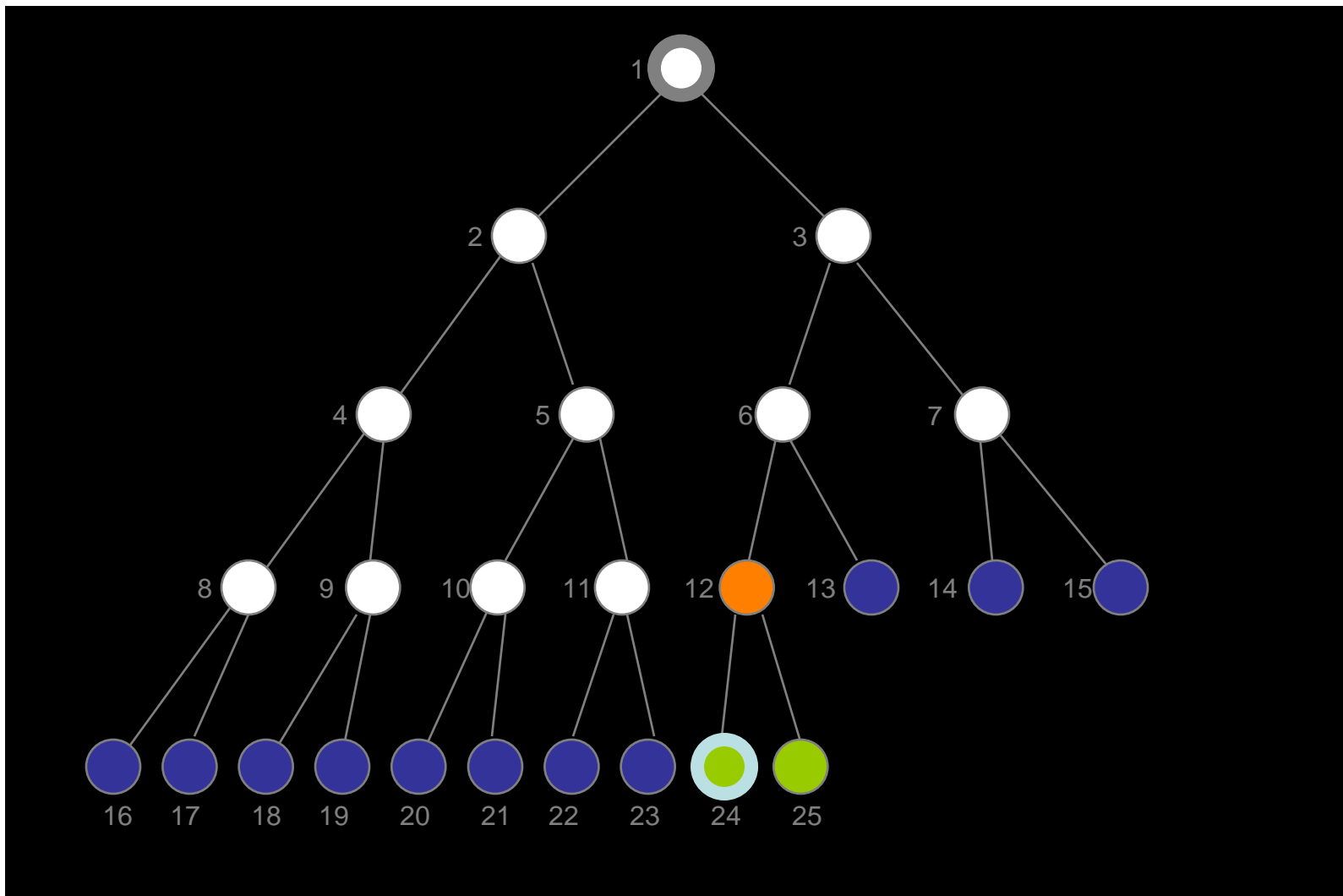
Fringe: [11,12,13,14,15,16,17,18,19] + [20,21]

Breadth-First Snapshot 11



Fringe: [12, 13, 14, 15, 16, 17, 18, 19, 20, 21] + [22,23]

Breadth-First Snapshot 12

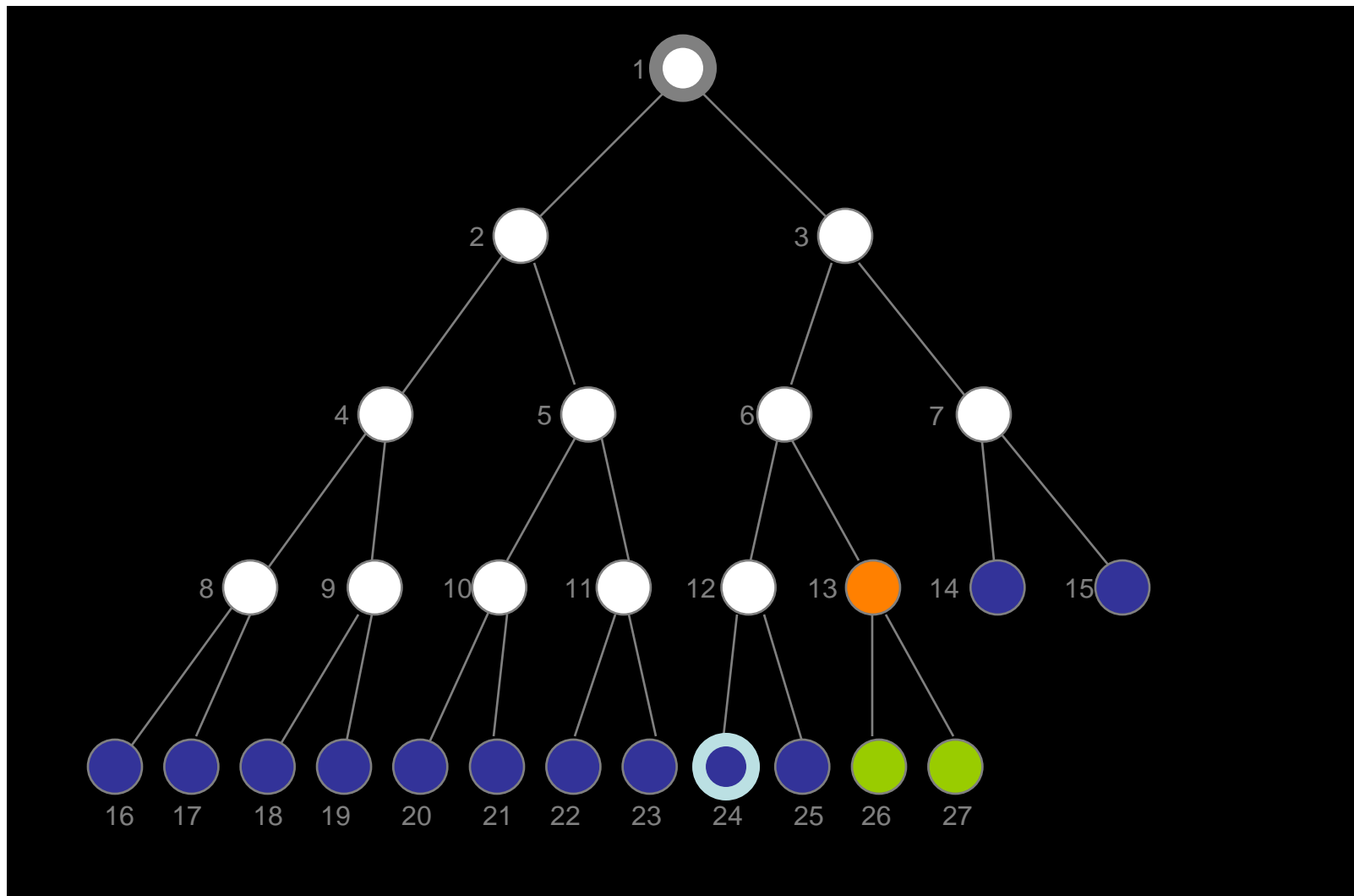








- Initial (dark blue circle)
- Visited (white circle)
- Fringe (yellow circle)
- Current (orange circle)
- Visible (green circle)
- Goal (light blue circle)

Note:
The goal node is “visible” here, but we can not perform the goal test yet.

Fringe: [13,14,15,16,17,18,19,20,21] + [22,23]

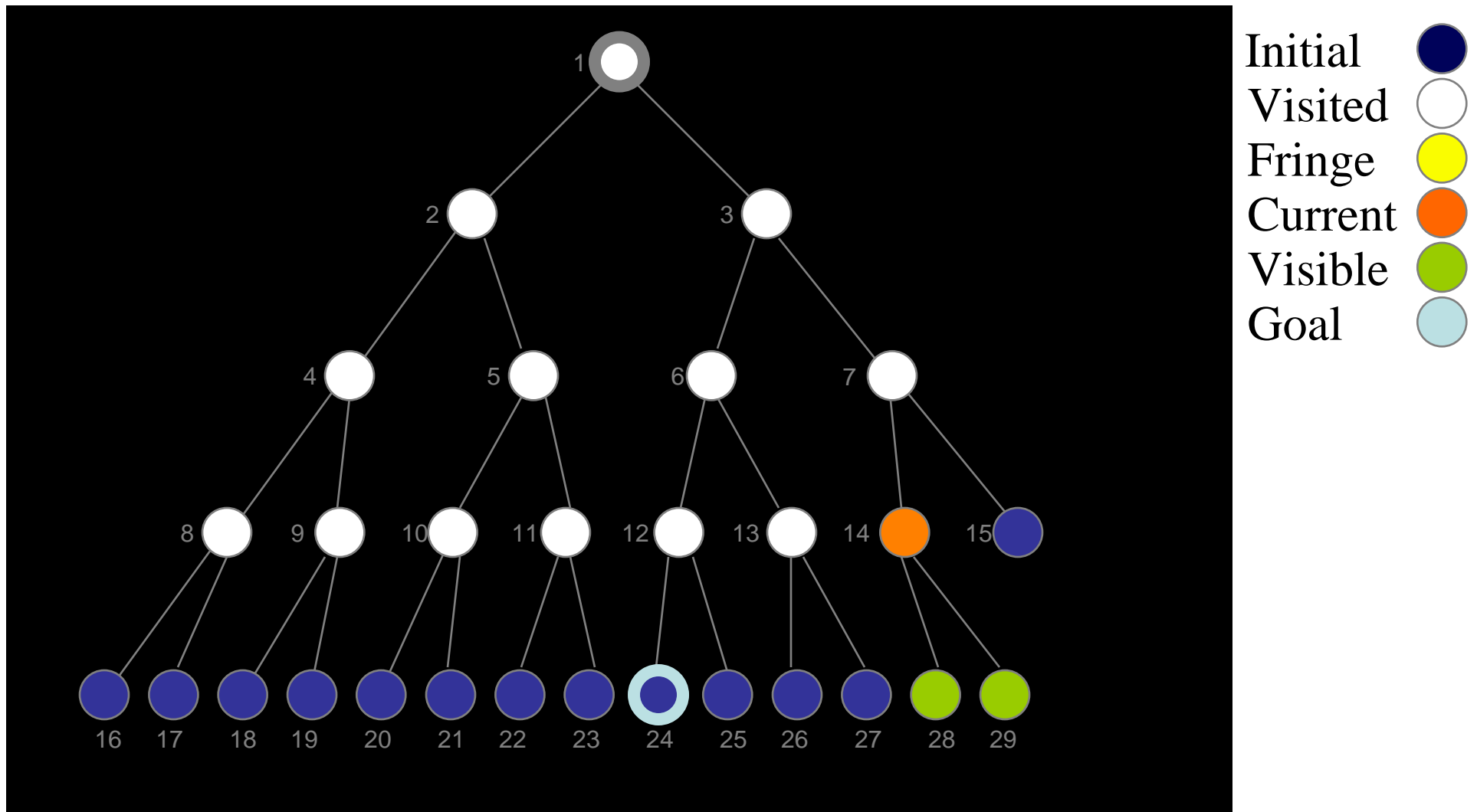
Breadth-First Snapshot 13



- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

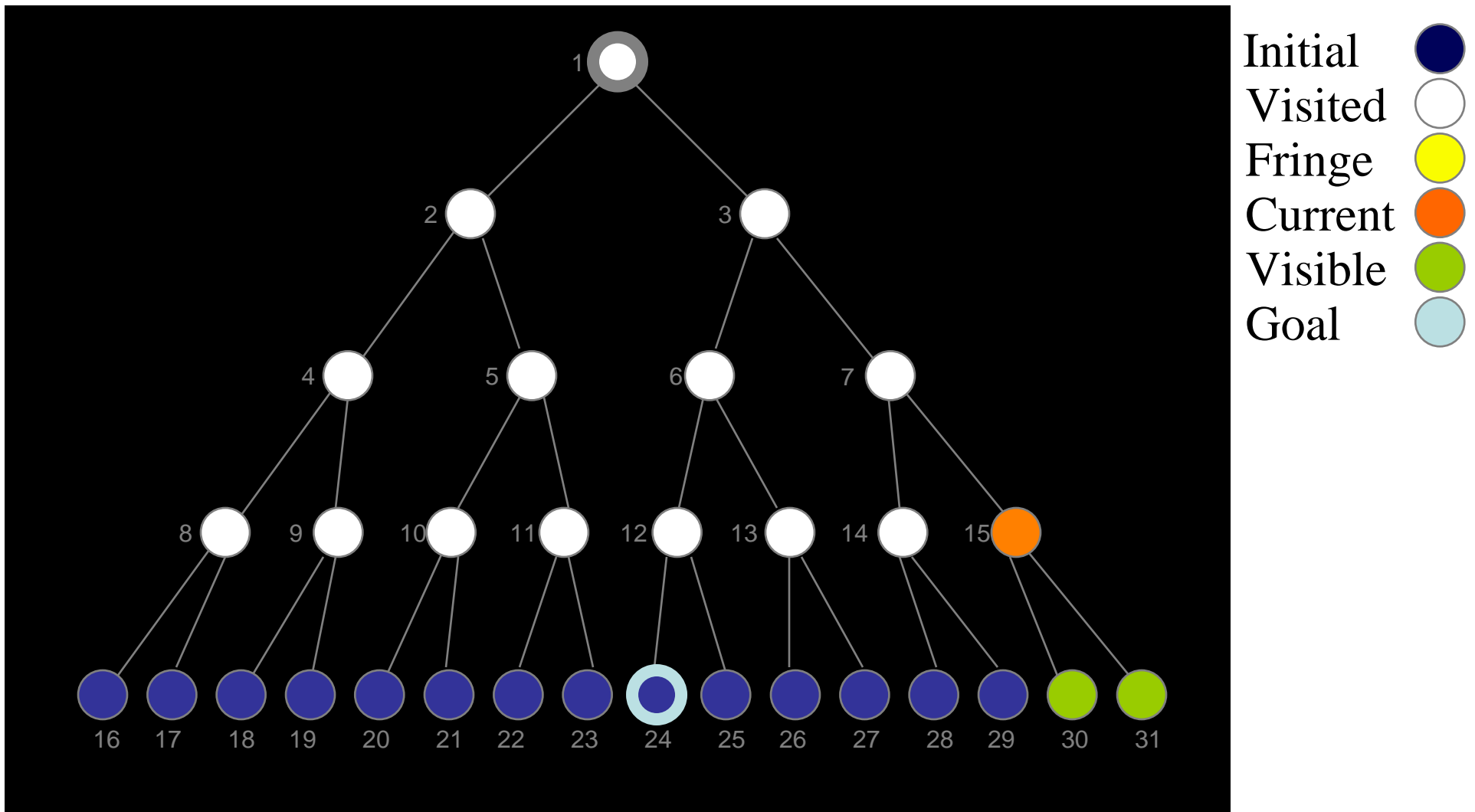
Fringe: [14,15,16,17,18,19,20,21,22,23,24,25] + [26,27]

Breadth-First Snapshot 14



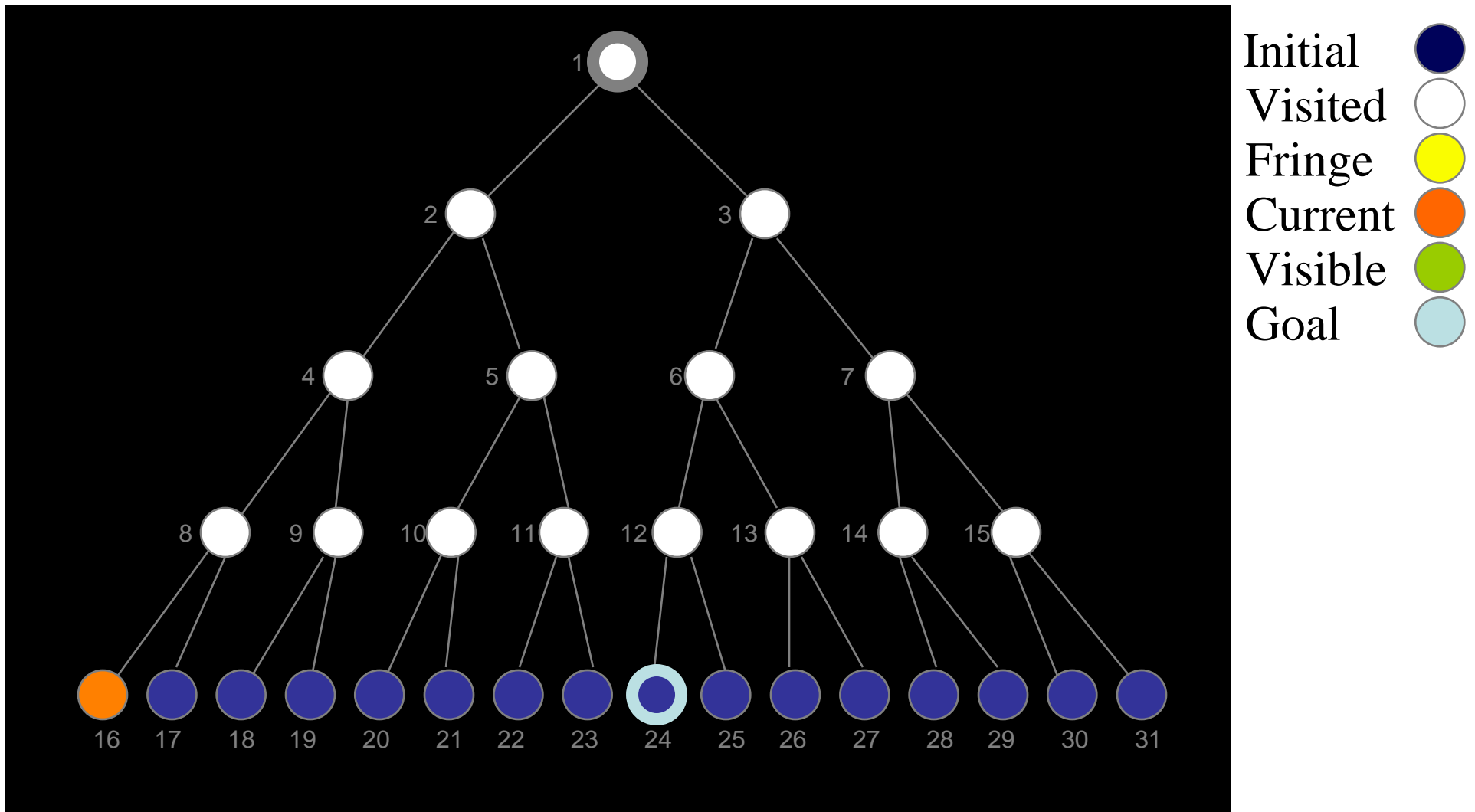
Fringe: [15,16,17,18,19,20,21,22,23,24,25,26,27] + [28,29]

Breadth-First Snapshot 15



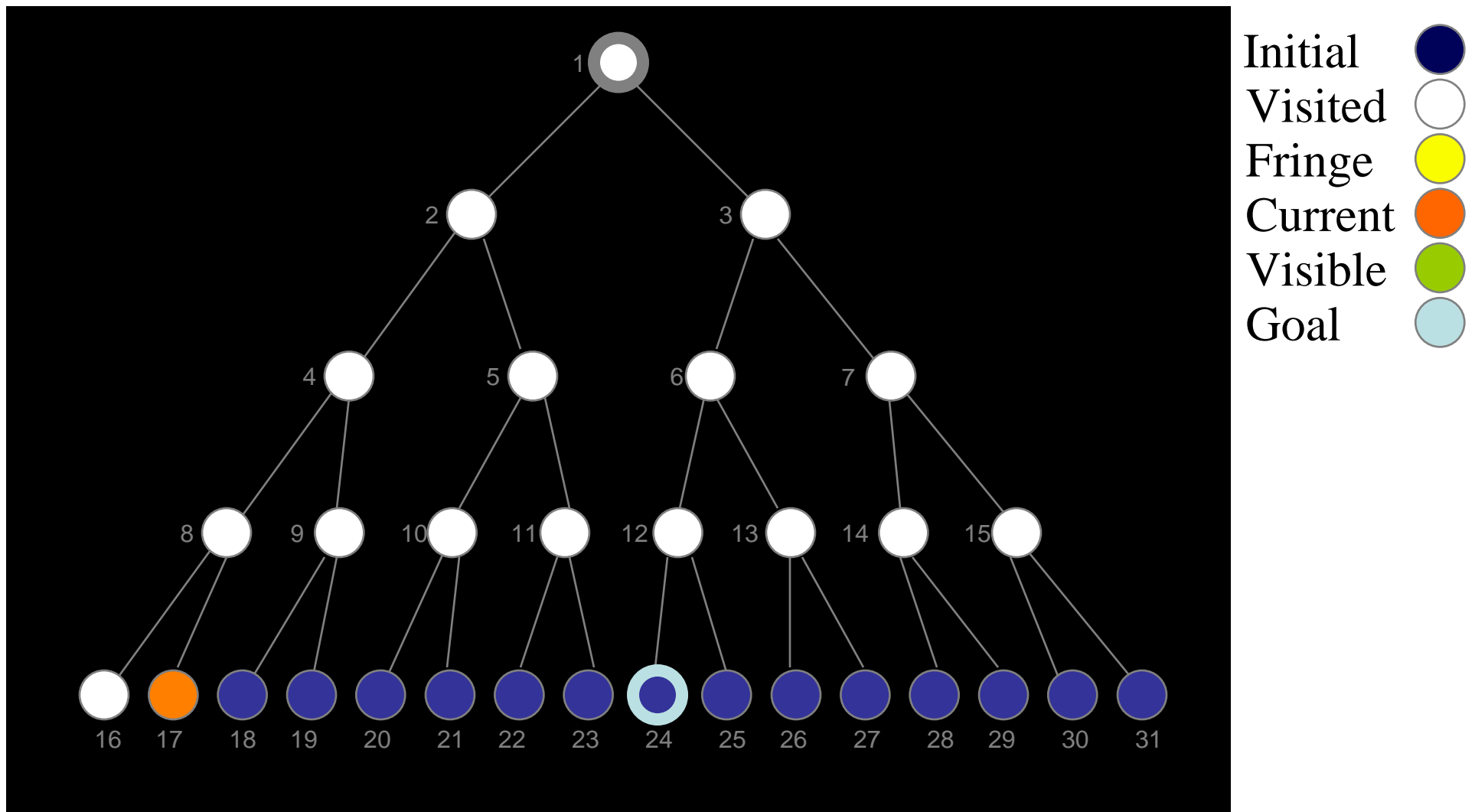
Fringe: [15,16,17,18,19,20,21,22,23,24,25,26,27,28,29] + [30,31]

Breadth-First Snapshot 16



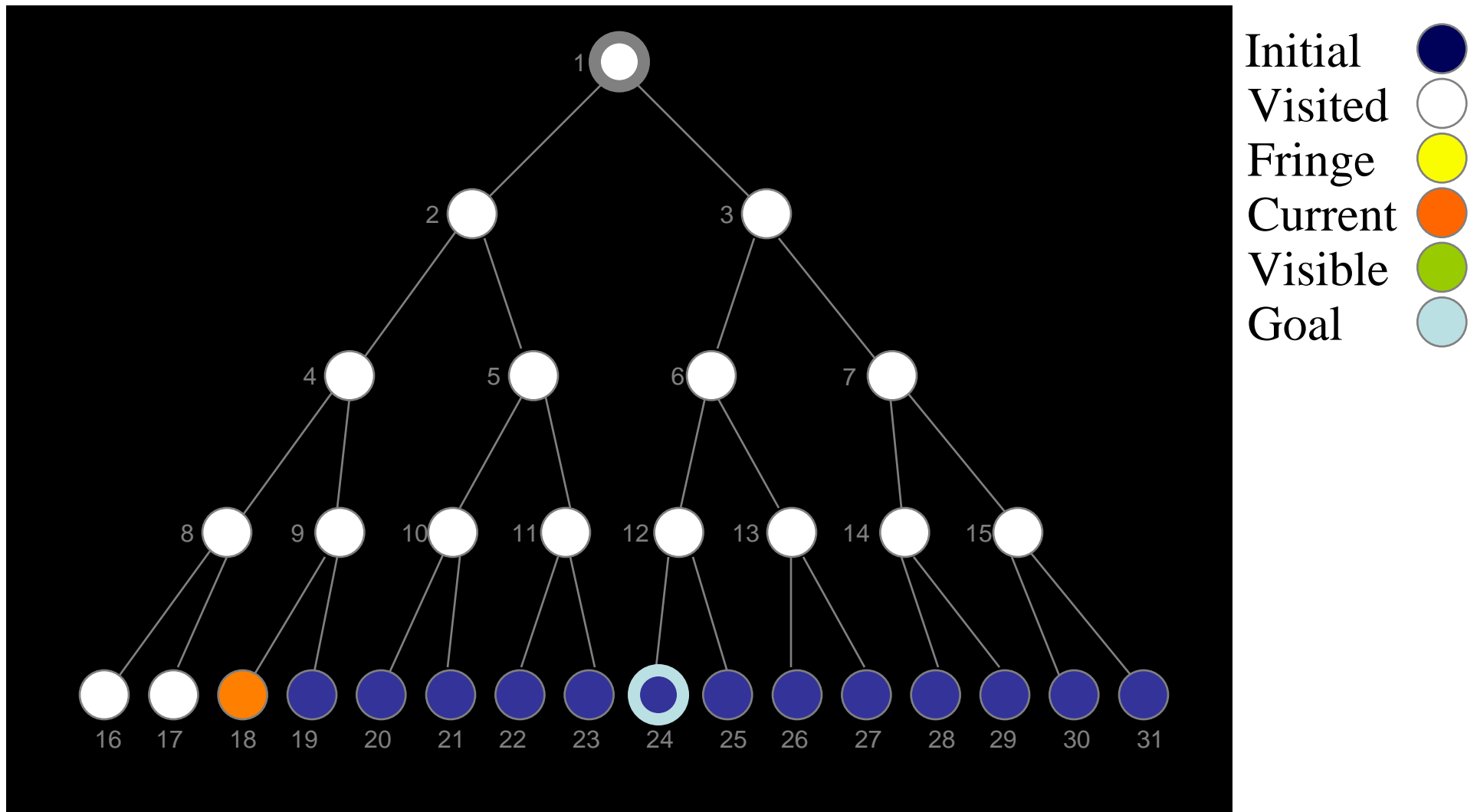
Fringe: [17,18,19,20,21,22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 17



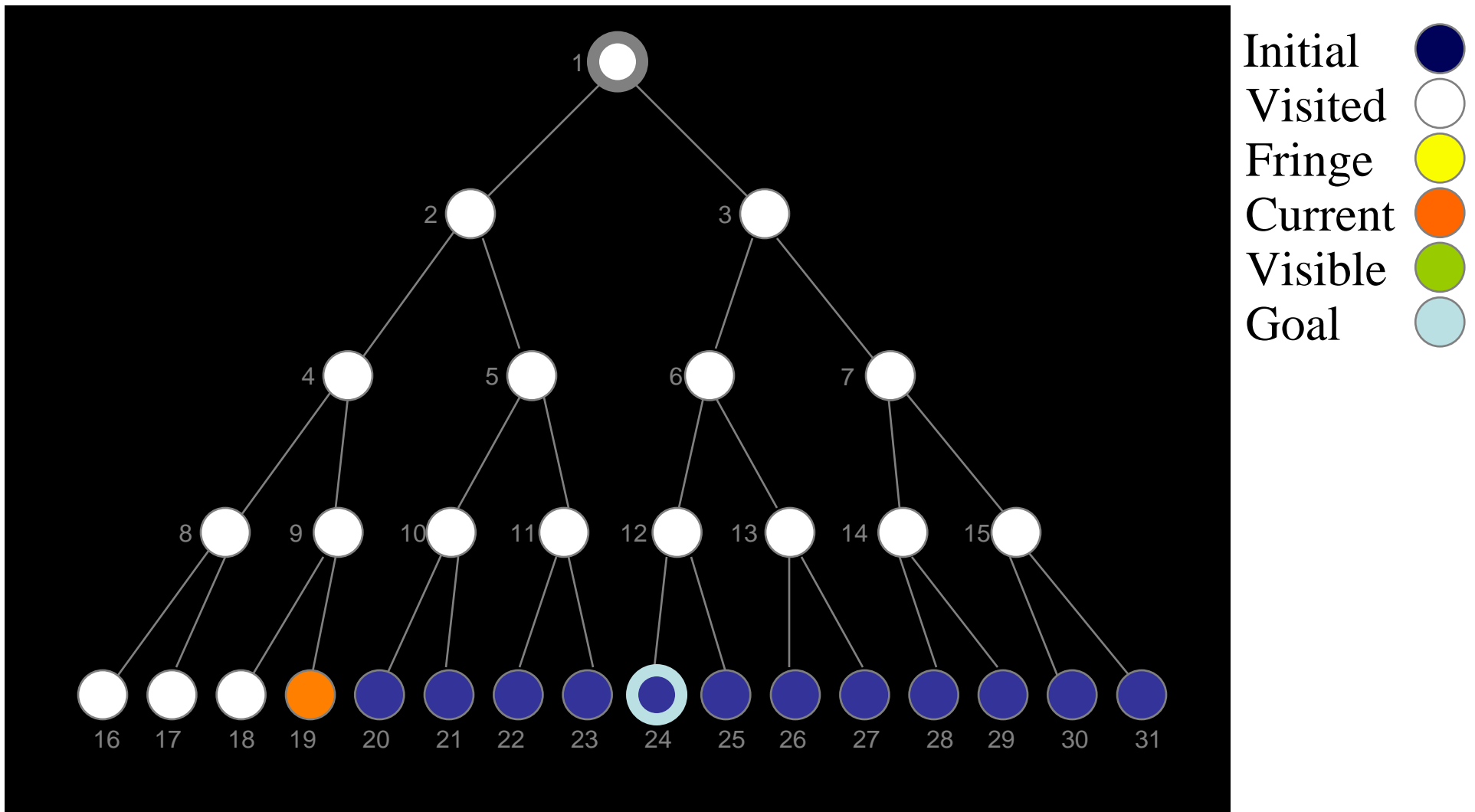
Fringe: [18,19,20,21,22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 18



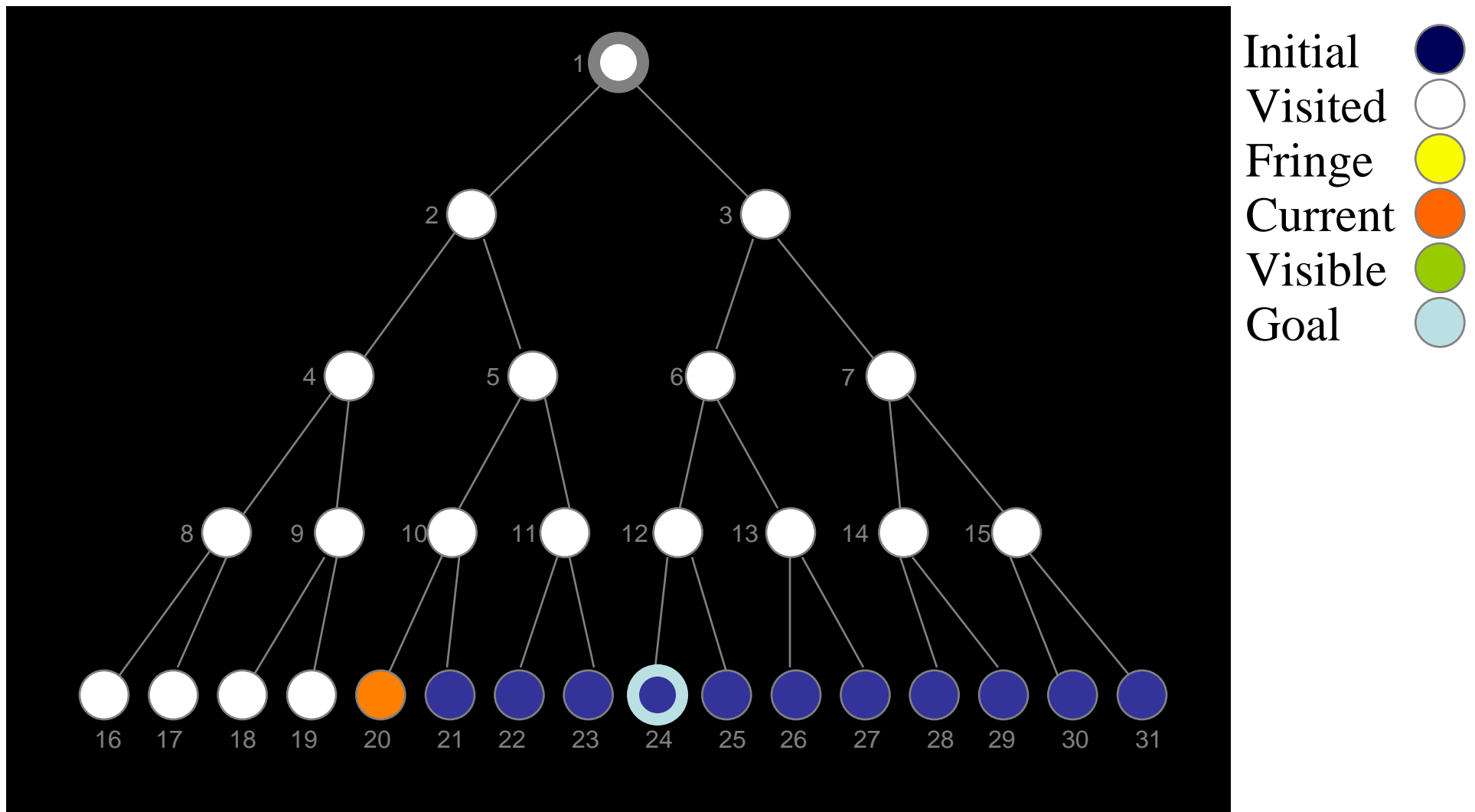
Fringe: [19,20,21,22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 19



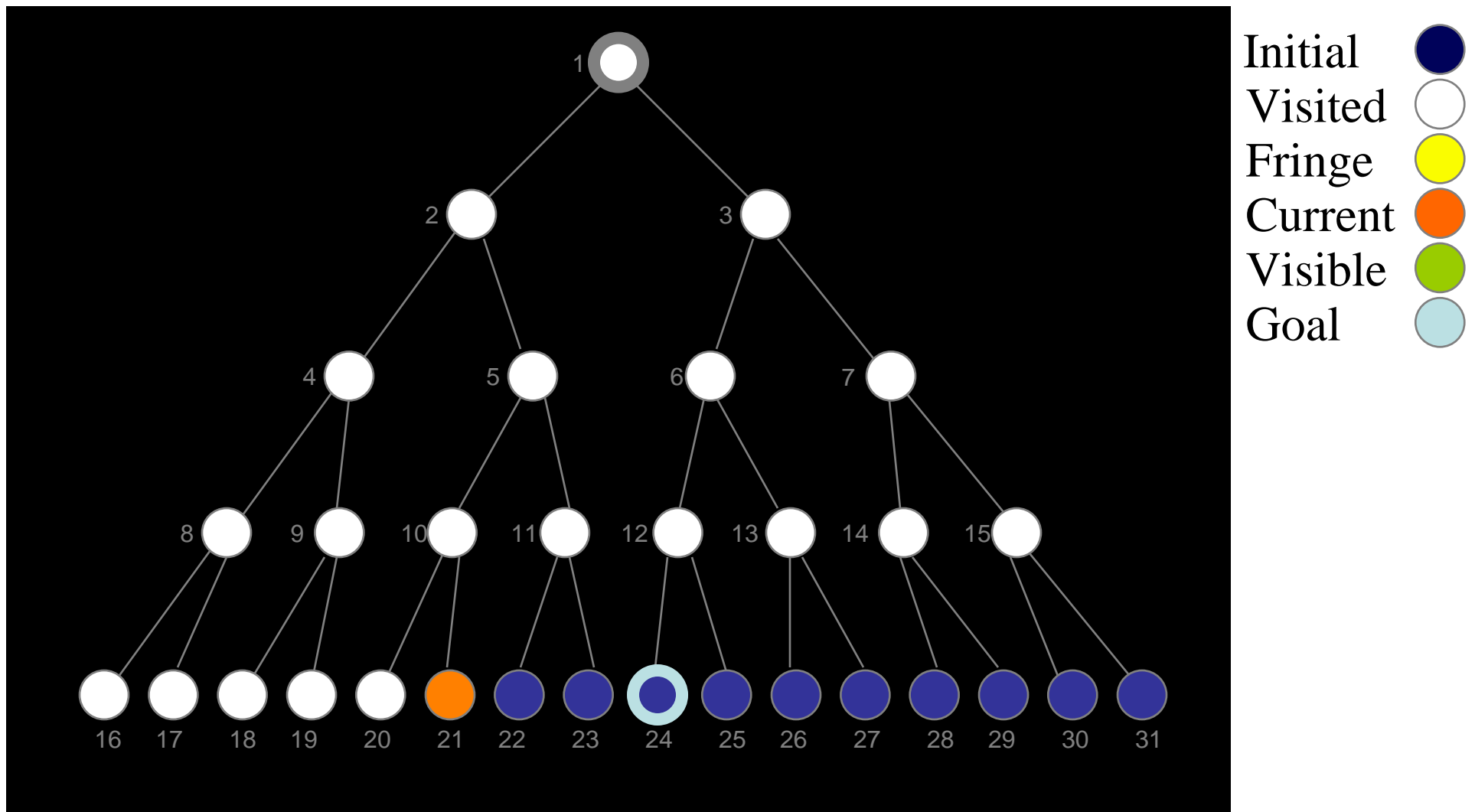
Fringe: [20,21,22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 20



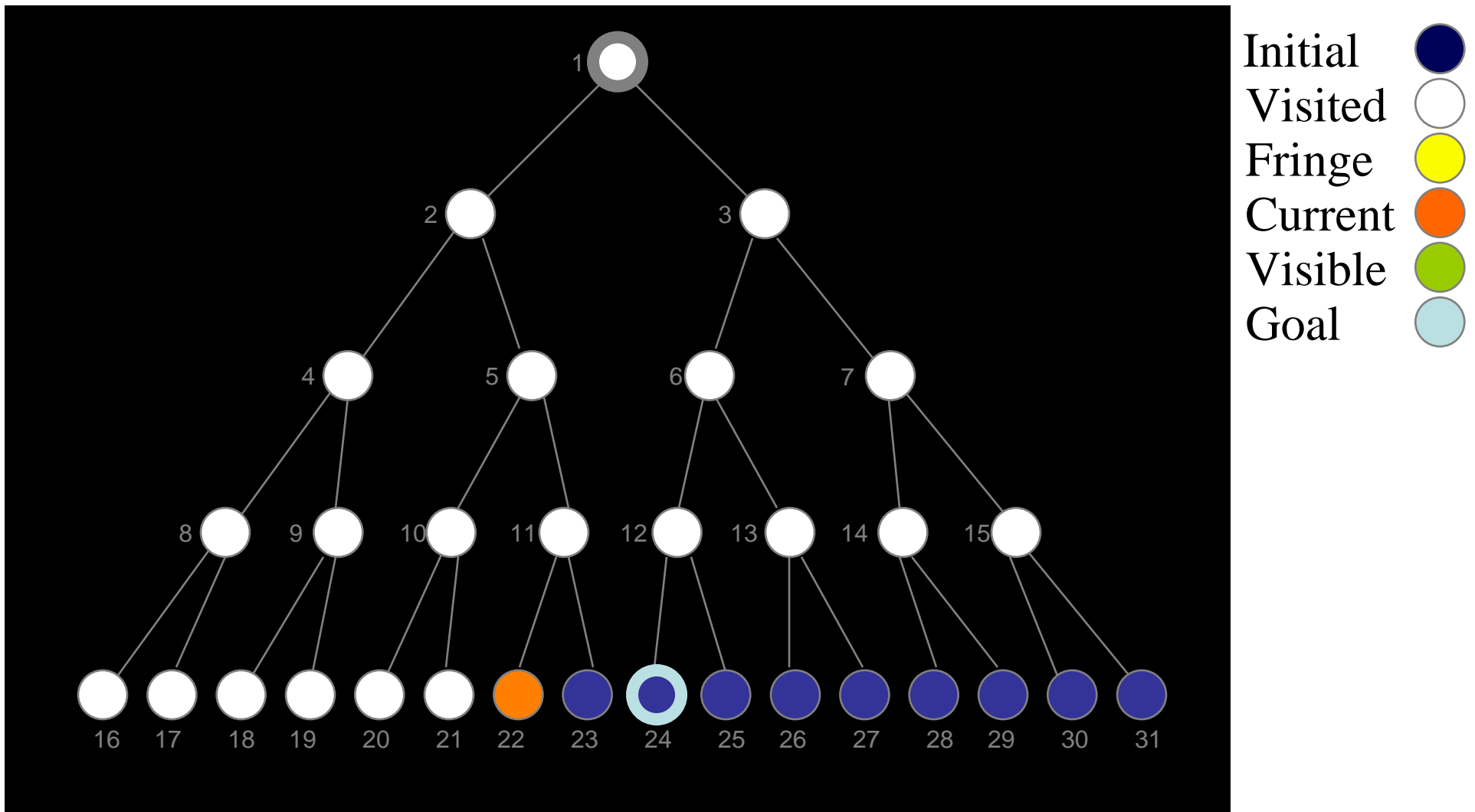
Fringe: [21,22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 21



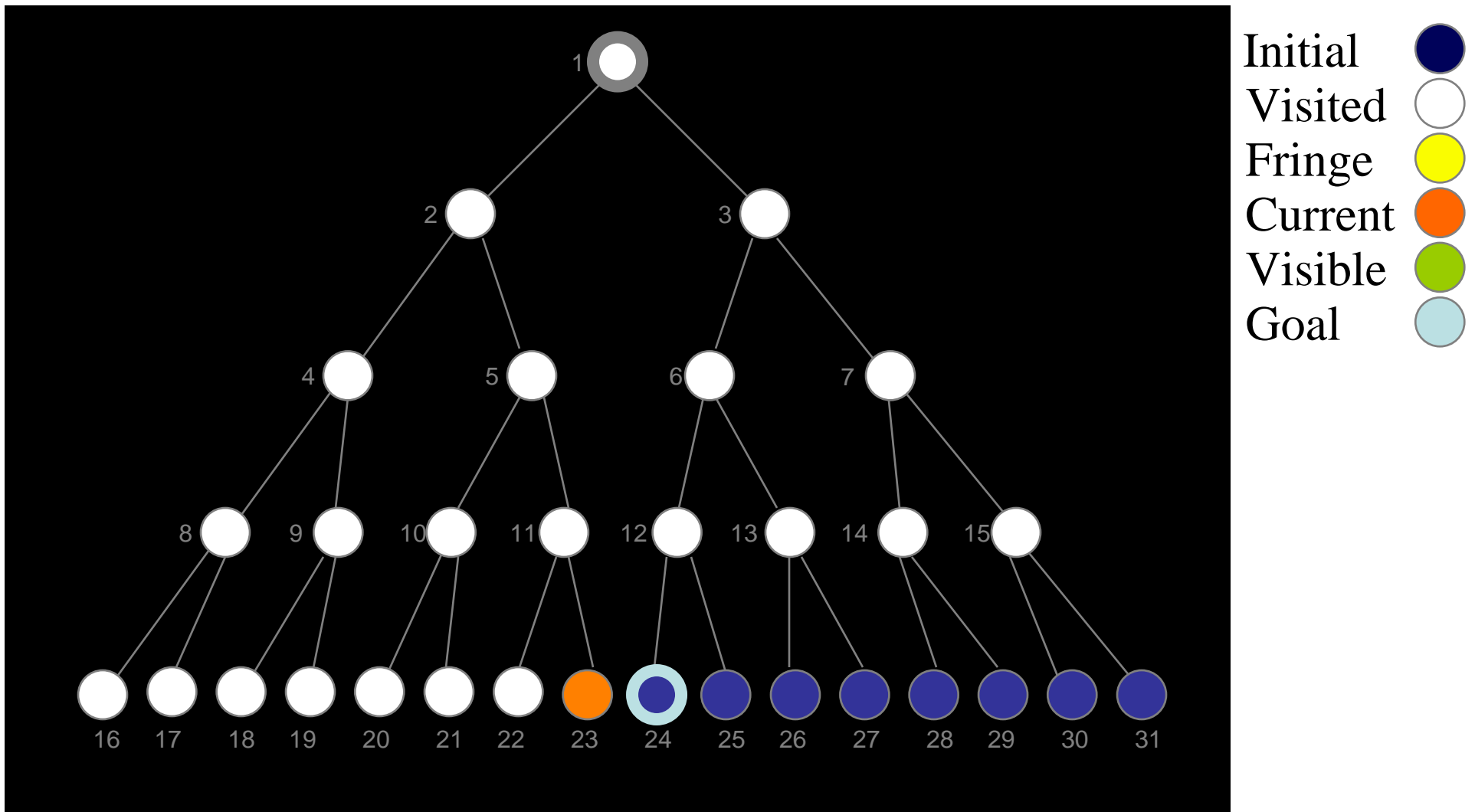
Fringe: [22,23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 22



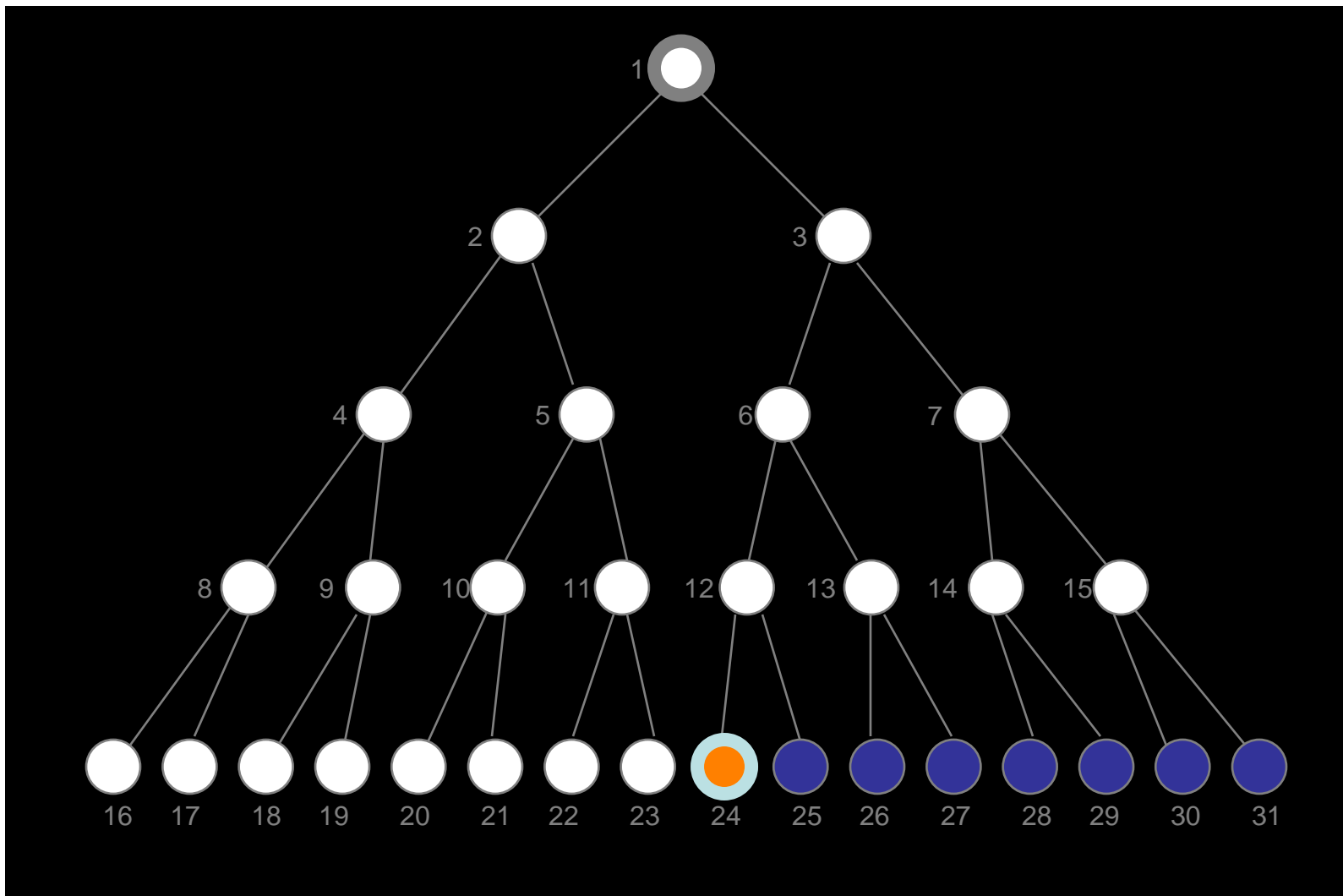
Fringe: [23,24,25,26,27,28,29,30,31]

Breadth-First Snapshot 23



Fringe: [24,25,26,27,28,29,30,31]

Breadth-First Snapshot 24



- Initial ●
- Visited ○
- Fringe ●
- Current ●
- Visible ●
- Goal ●

Note:
The goal test is positive for this node, and a solution is found in 24 steps.

Fringe: [25,26,27,28,29,30,31]

Depth-First

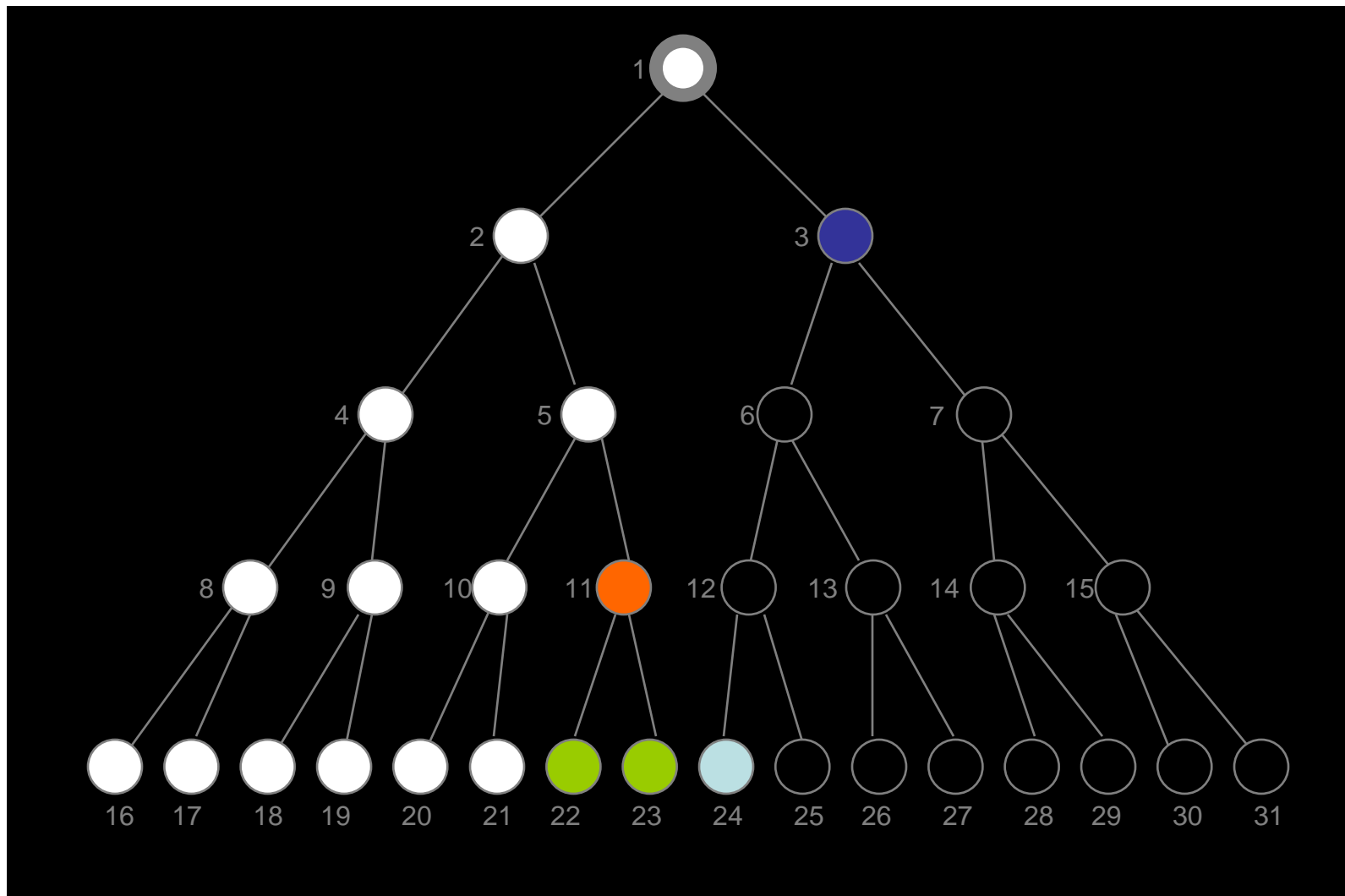
```
function DEPTH-FIRST-SEARCH(problem) returns solution
    return TREE-SEARCH(problem, LIFO-QUEUE())
```

- continues exploring newly generated nodes
 - achieved by the TREE-SEARCH method by appending newly generated nodes at the beginning of the search queue
 - utilizes a Last-In, First-Out (LIFO) queue, or stack

| | |
|------------------|-------------|
| Time Complexity | b^m |
| Space Complexity | $b \cdot m$ |
| Completeness | no |
| Optimality | no |

| | |
|---|---------------------|
| b | branching factor |
| m | maximum path length |

Depth-First Snapshot



- Initial (dark blue circle)
- Visited (white circle)
- Fringe (yellow circle)
- Current (orange circle)
- Visible (green circle)
- Goal (light blue circle)

Fringe: [3] + [22,23]

Depth-First vs. Breadth-First

- depth-first goes off into one branch until it reaches a leaf node
 - not good if the goal is on another branch
 - neither complete nor optimal
 - uses much less space than breadth-first
 - much fewer visited nodes to keep track of
 - smaller fringe
- breadth-first is more careful by checking all alternatives
 - complete and optimal
 - very memory-intensive