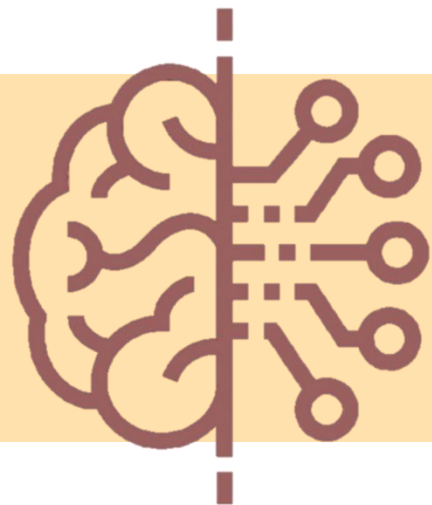


Exhaustive Search Algorithm

(Exhaustive – Uninformed - Blind Search)



Artificial Intelligence

*School of Computing
Universiti Teknologi Malaysia*

Outline

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1. Selection of a Search Strategy

- Breadth-first
- Depth-first
- Comparison of both search strategy

2. Using State Space to Represent Reasoning

- And/or graph
- Hypergraph

Selection of a Search Strategy



- Breadth-first
- Depth-first
- Comparison of both search strategy

Selection of a Search Strategy

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Most of the effort is often spent on the selection of an appropriate search strategy for a given problem

- ✓ Uninformed search (blind / exhaustive search)
 - number of steps, path cost unknown
 - knows when it reaches a goal
- ✓ Informed search (heuristic search)
 - has background information about the problem
 - map, costs of actions

Search Strategy : **The order**

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Uninformed Search

- Breadth-first
- Depth-first
- Iterative deepening
- Uniform-cost search
- Depth-limited search
- Bi-directional search
- Constraint satisfaction

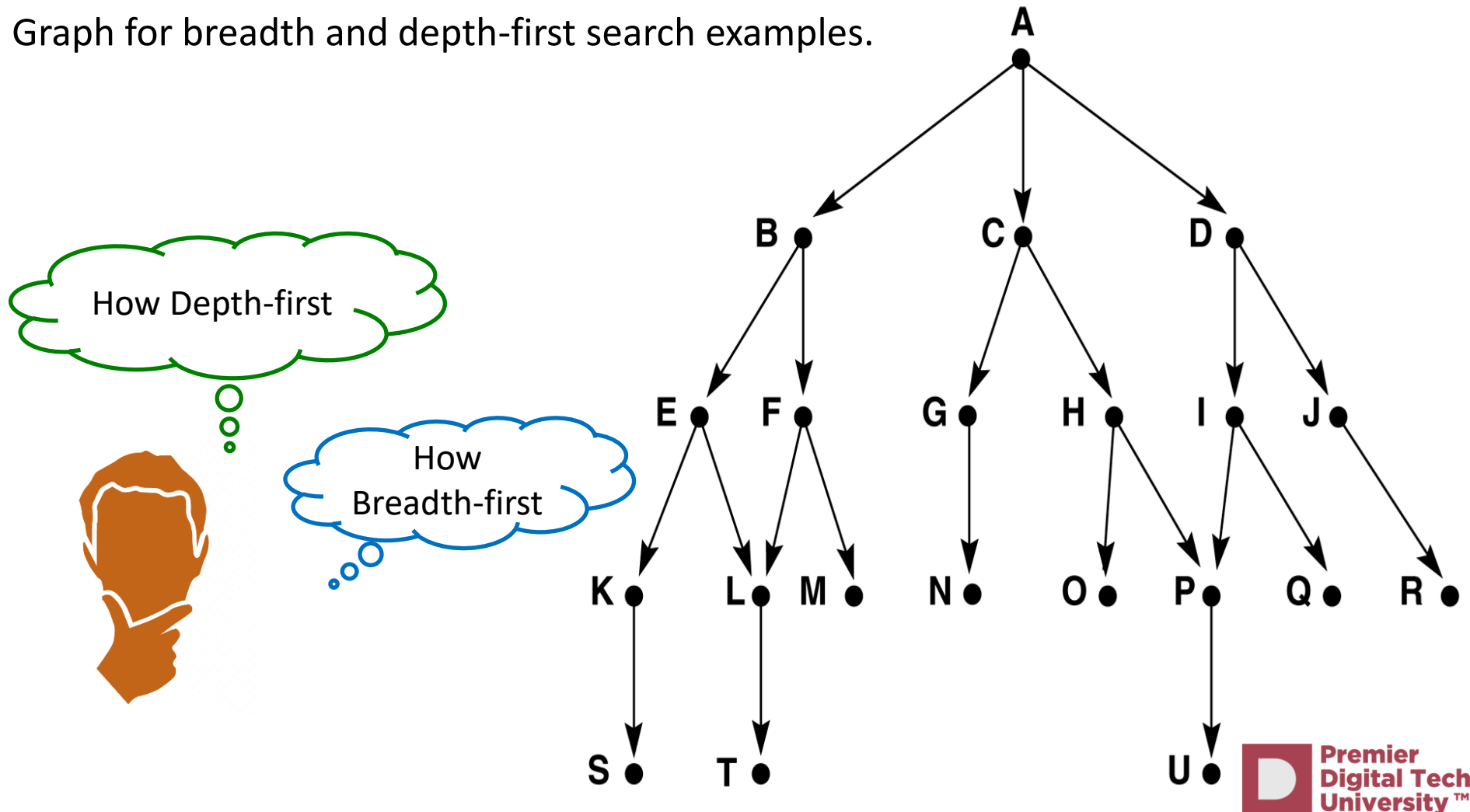
Informed Search

- Best-first search
- Search with heuristics
- Memory-bounded search
- Iterative improvement search

Search Strategy

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Graph for breadth and depth-first search examples.



Search Strategy : Breadth-First

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- 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

Solution is found

Search Strategy : Breadth-First

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Function Breadth-first search algorithm

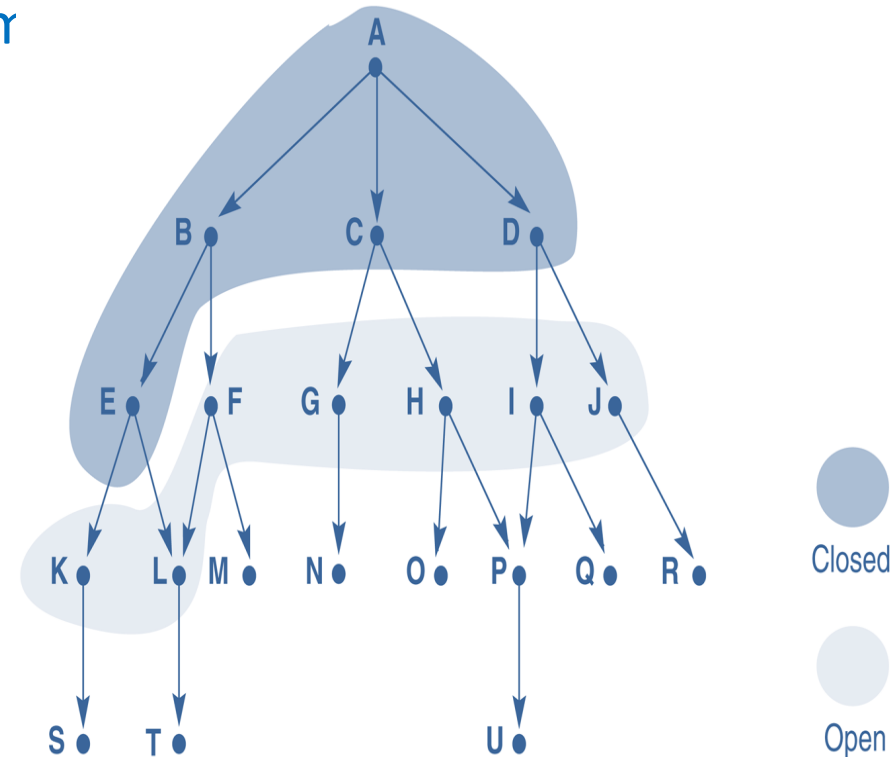
```
function breadth_first_search;  
  
begin  
    open := [Start];                                     % initialize  
    closed := [ ];  
    while open ≠ [ ] do                                  % states remain  
        begin  
            remove leftmost state from open, call it X;  
            if X is a goal then return SUCCESS           % goal found  
            else begin  
                generate children of X;  
                put X on closed;  
                discard children of X if already on open or closed;  
                put remaining children on right end of open % loop check  
                                                    % queue  
            end  
        end  
    end  
    return FAIL                                         % no states left  
end.
```


Search Strategy : Breadth-First

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Function Breadth-first search algorithm

1. **open** = [A]; **closed** = []
2. **open** = [B,C,D]; **closed** = [A]
3. **open** = [C,D,E,F]; **closed** = [B,A]
4. **open** = [D,E,F,G,H]; **closed** = [C,B,A]
5. **open** = [E,F,G,H,I,J]; **closed** = [D,C,B,A]
6. **open** = [F,G,H,I,J,K,L]; **closed** = [E,D,C,B,A]
7. **open** = [G,H,I,J,K,L,M] (as L is already on open); **closed** = [F,E,D,C,B,A]
8. **open** = [H,I,J,K,L,M,N]; **closed** = [G,F,E,D,C,B,A]
9. and so on until either U is found or **open** = []

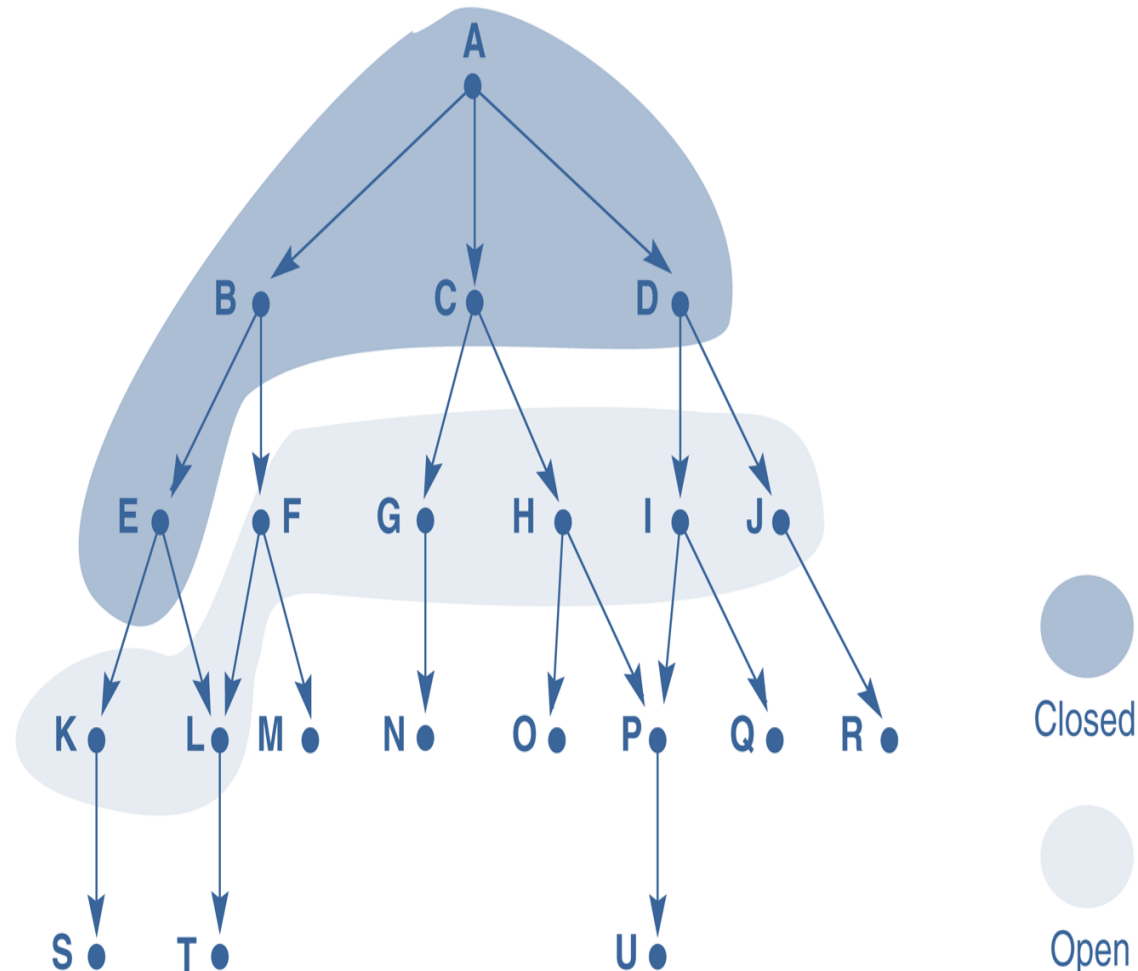


Search Strategy : Breadth-First

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Function Breadth-first search algorithm

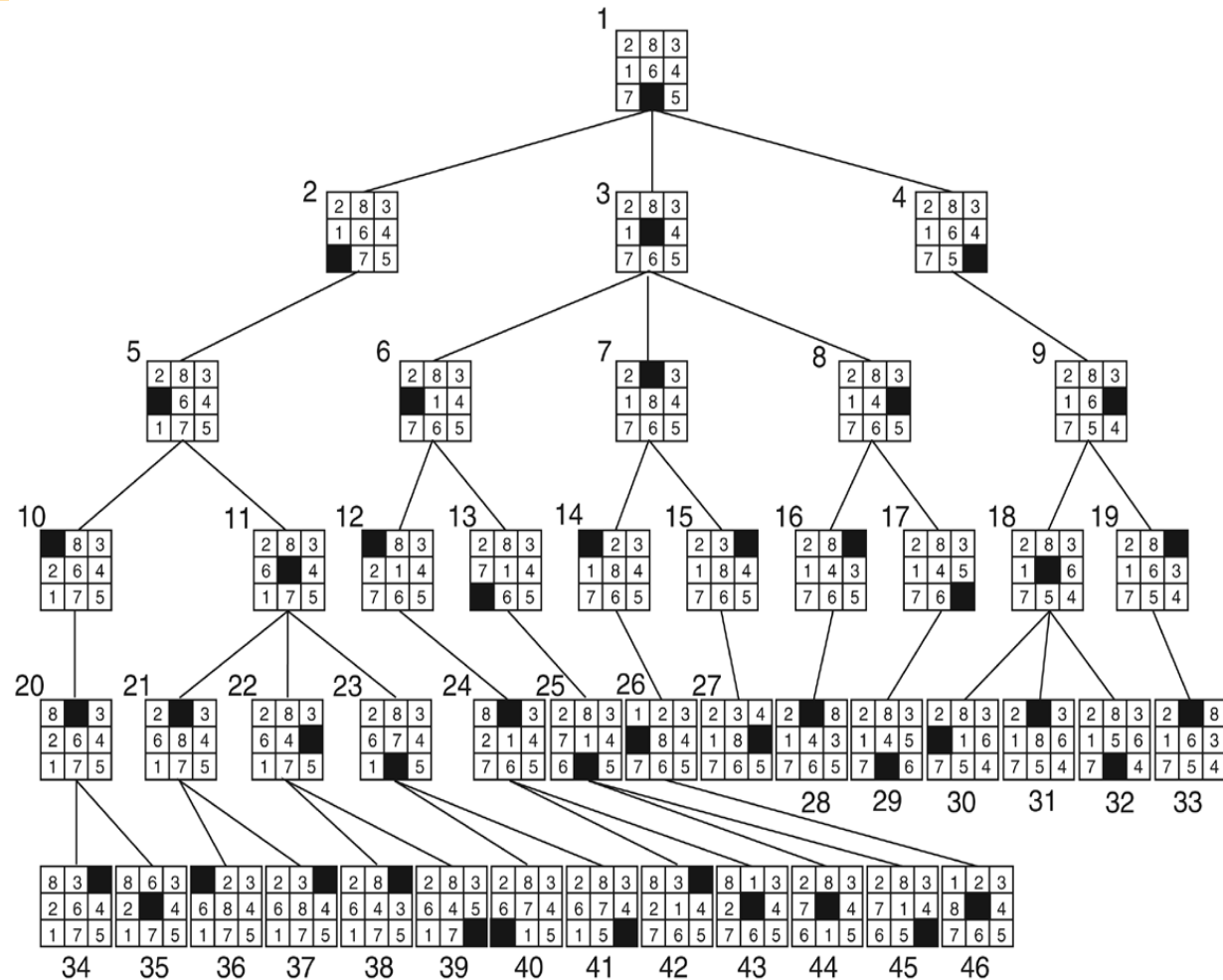
- States on open and closed are highlighted.
- Explore level by level
- Use list open in backtrack – states not yet evaluated
- Use list close in backtrack – states already evaluated
- Which state is **removed** from open determines the **order of search**- BFS **adds** at the **right list** and removes from the left (queue-FIFO)



Search Strategy : Breadth-First

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Breadth-first search of the 8-puzzle, showing order in which states were removed from open



Goal

Search Strategy : Depth-First

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Function Depth-first search algorithm

```

begin
  open := [Start];                                     % initialize
  closed := [ ];
  while open ≠ [ ] do                                  % states remain
    begin
      remove leftmost state from open, call it X;
      if X is a goal then return SUCCESS                % goal found
      else begin
        generate children of X;
        put X on closed;
        discard children of X if already on open or closed;
        put remaining children on left end of open      % loop check
                                                         % stack
      end
    end
  end;
  return FAIL
end.
                                                         % no states left

```

Search Strategy : Depth-First

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Function Depth-first search algorithm

1. **open = [A]; closed = []**
2. **open = [B,C,D]; closed = [A]**
3. **open = [E,F,C,D]; closed = [B,A]**
4. **open = [K,L,F,C,D]; closed = [E,B,A]**
5. **open = [S,L,F,C,D]; closed = [K,E,B,A]**
6. **open = [L,F,C,D]; closed = [S,K,E,B,A]**
7. **open = [T,F,C,D]; closed = [L,S,K,E,B,A]**
8. **open = [F,C,D]; closed = [T,L,S,K,E,B,A]**
9. **open = [M,C,D], as L is already on closed; closed = [F,T,L,S,K,E,B,A]**
10. **open = [C,D]; closed = [M,F,T,L,S,K,E,B,A]**
11. **open = [G,H,D]; closed = [C,M,F,T,L,S,K,E,B,A]**

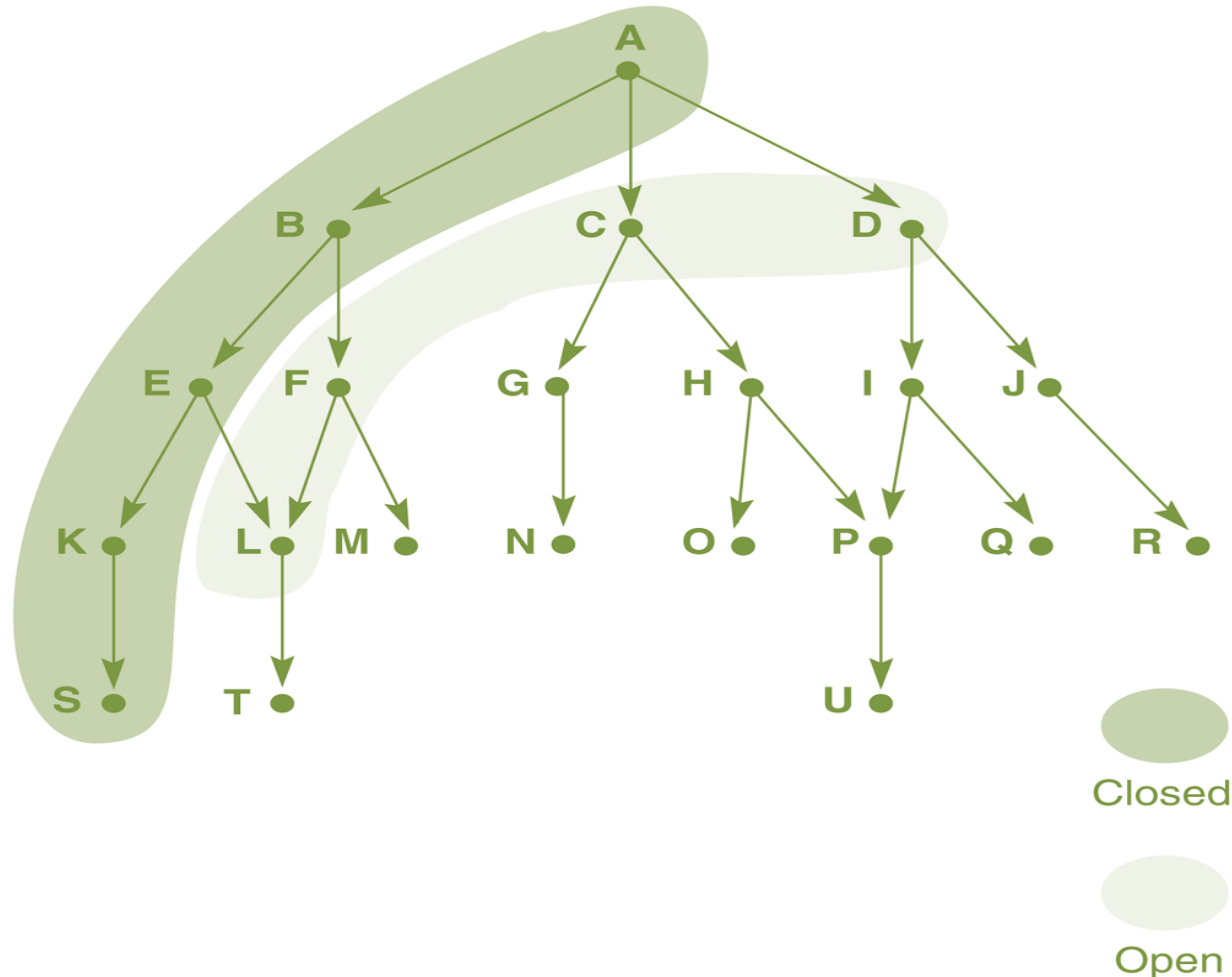
Search Strategy : Depth-First

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Function Depth-first search algorithm

States on open and closed are highlighted.

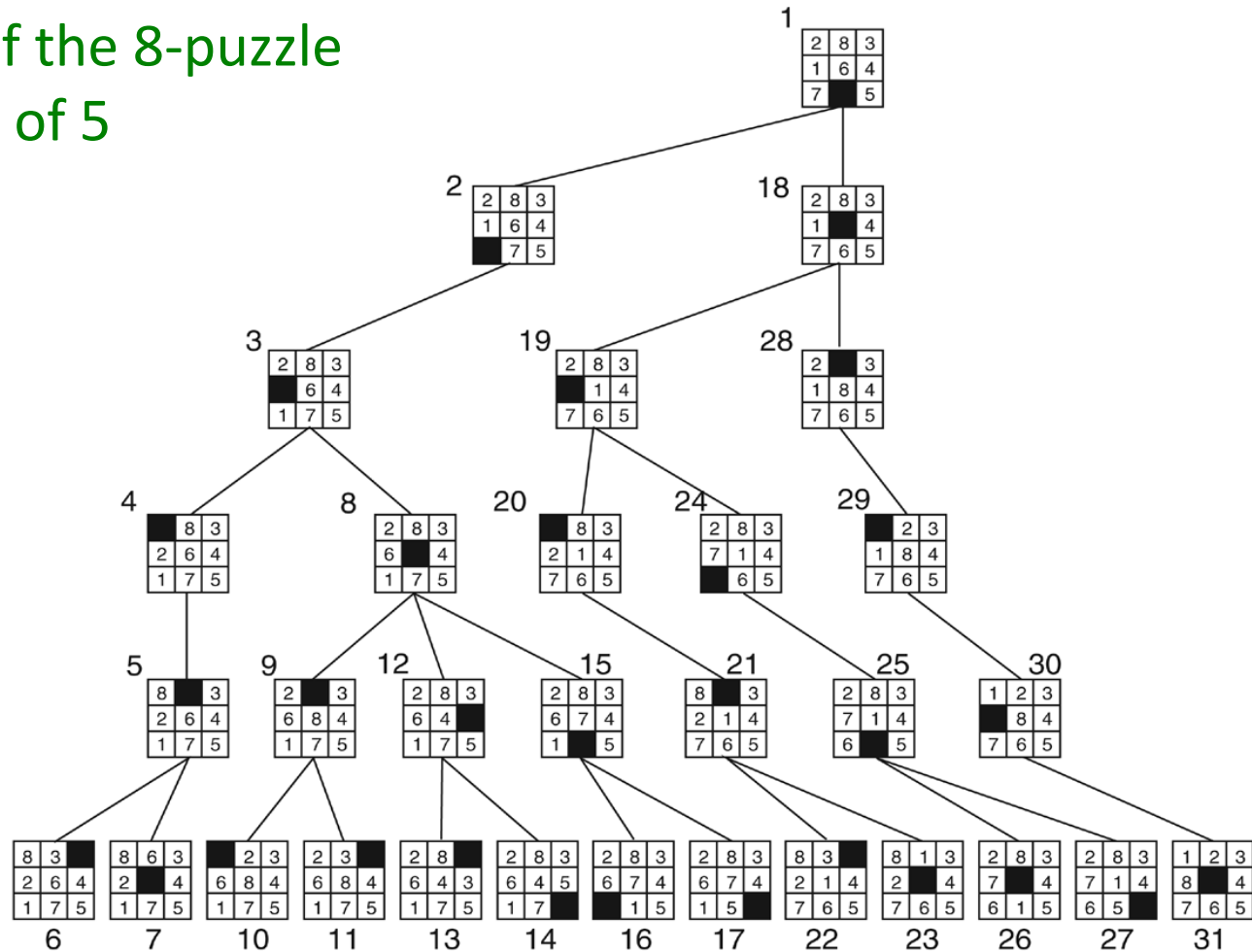
- Child and descendants are evaluated before siblings
- Goes deeper into search space whenever possible
- Which state is removed from open determines the order of search- DFS **adds** and **removes** from the **left** end (stack-LIFO)



Search Strategy : Depth-First

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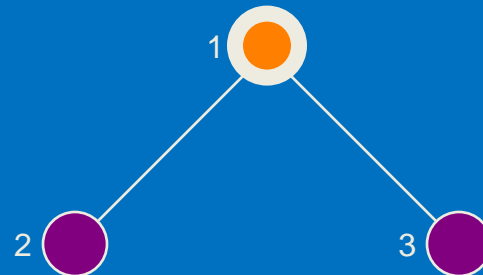
Depth-first search of the 8-puzzle with a depth bound of 5



Goal

Breadth-First Snapshot 1

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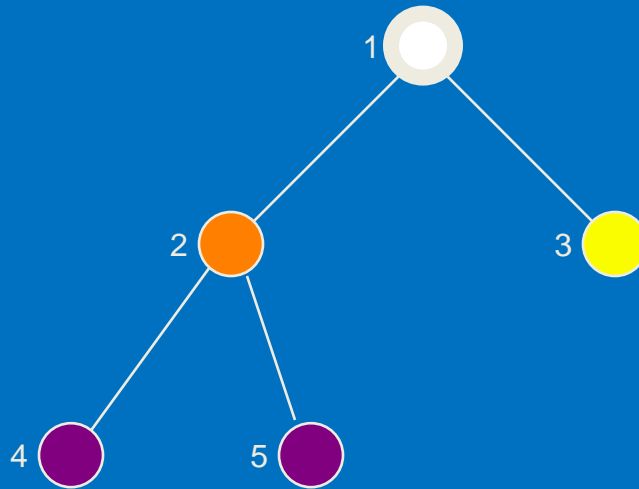
Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

Fringe =
nodes
waiting in
queue to
be
explored

Fringe: [] + [2,3]

Breadth-First Snapshot 2

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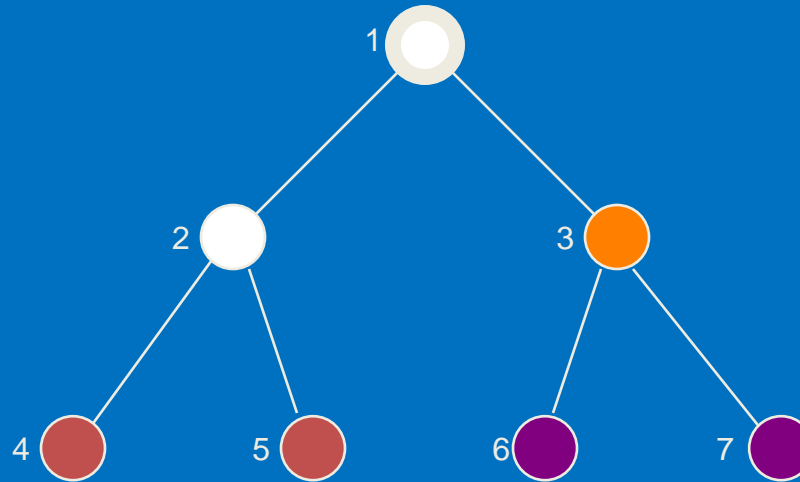
Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

Fringe =
nodes
waiting in
queue to
be
explored

Fringe: [3] + [4,5]

Breadth-First Snapshot 3

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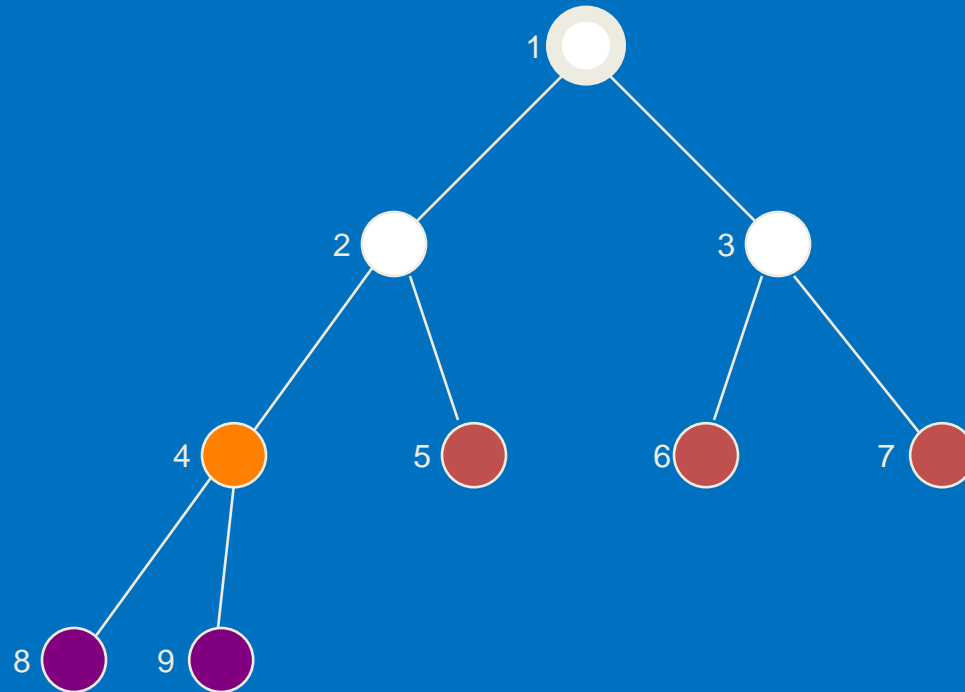
Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 



Fringe =
nodes
waiting in
queue to
be
explored

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

Breadth-First Snapshot 4

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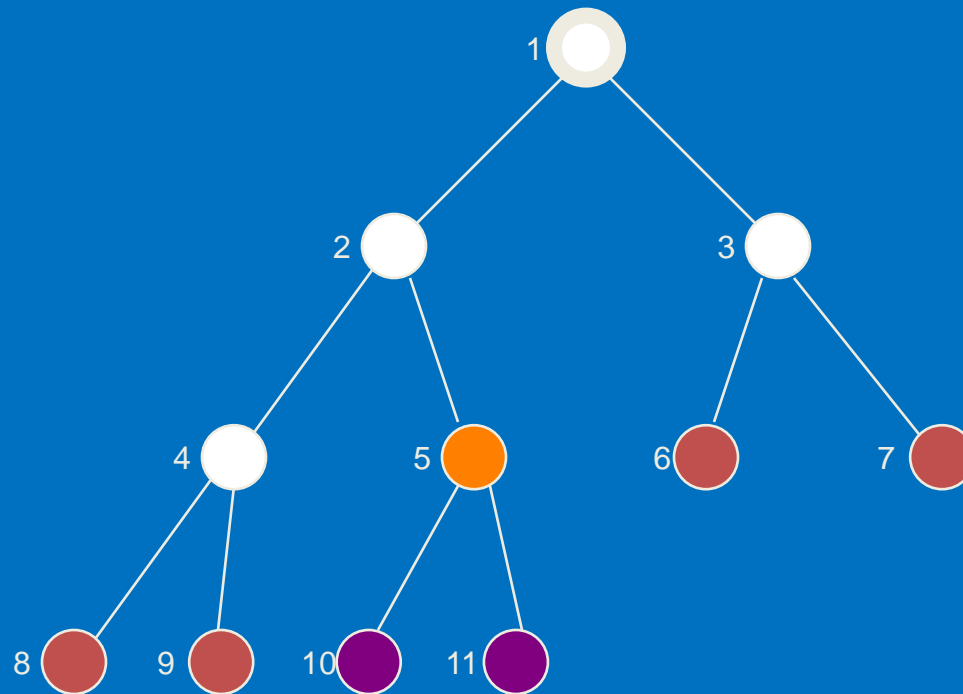


Initial 
Visited 
Fringe 
Current 
Visible 
Goal 


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

Breadth-First Snapshot 5

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Initial 

Visited 

Fringe 

Current 

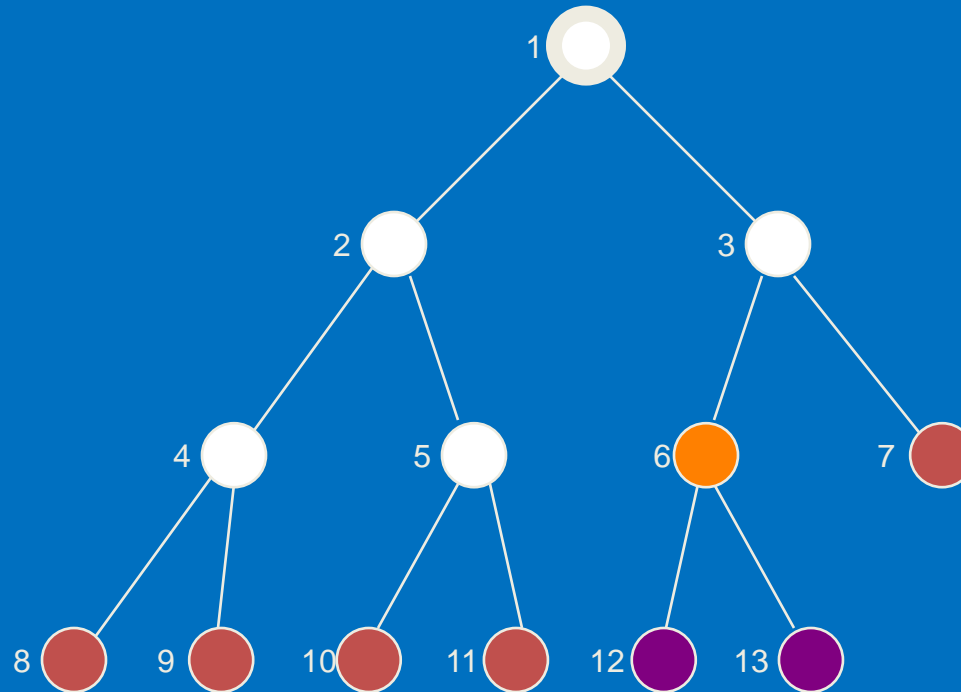
Visible 


Goal 

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

Breadth-First Snapshot 6

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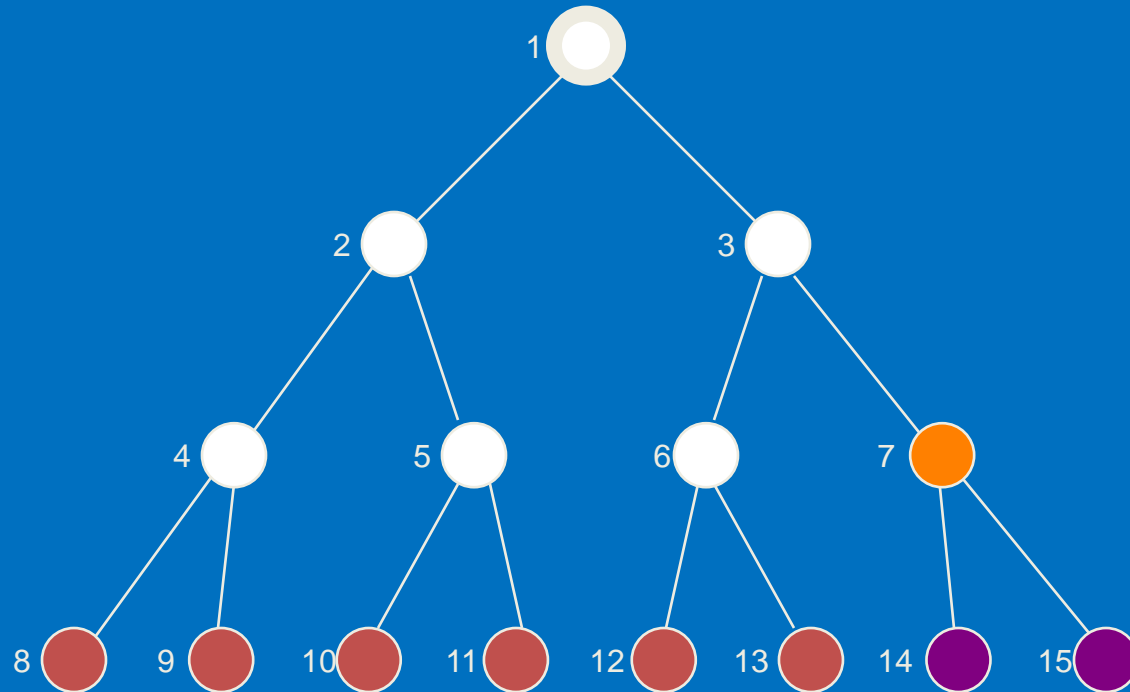


Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 7

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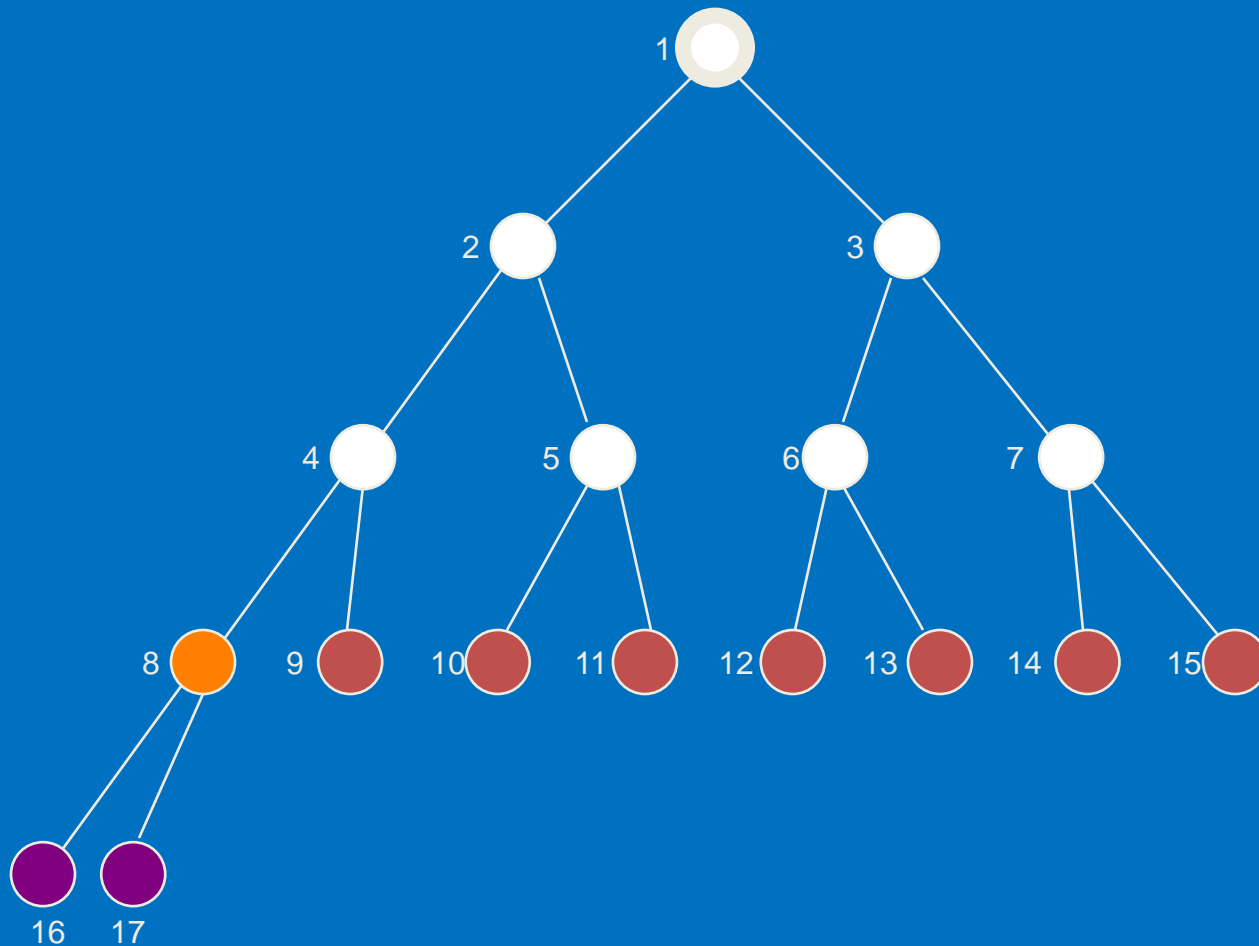


Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 8

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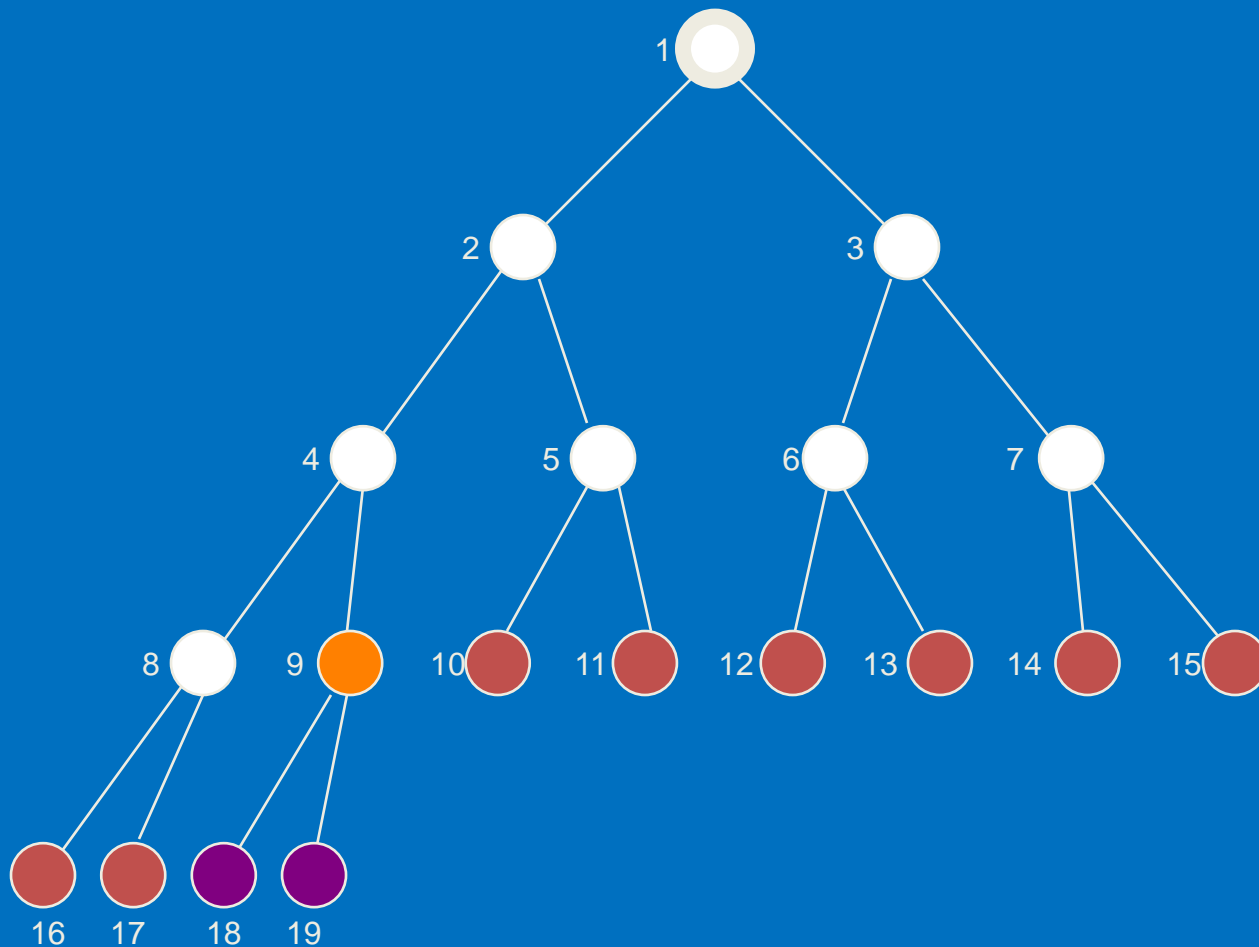


Initial
Visited
Fringe
Current
Visible
Goal

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

Breadth-First Snapshot 9

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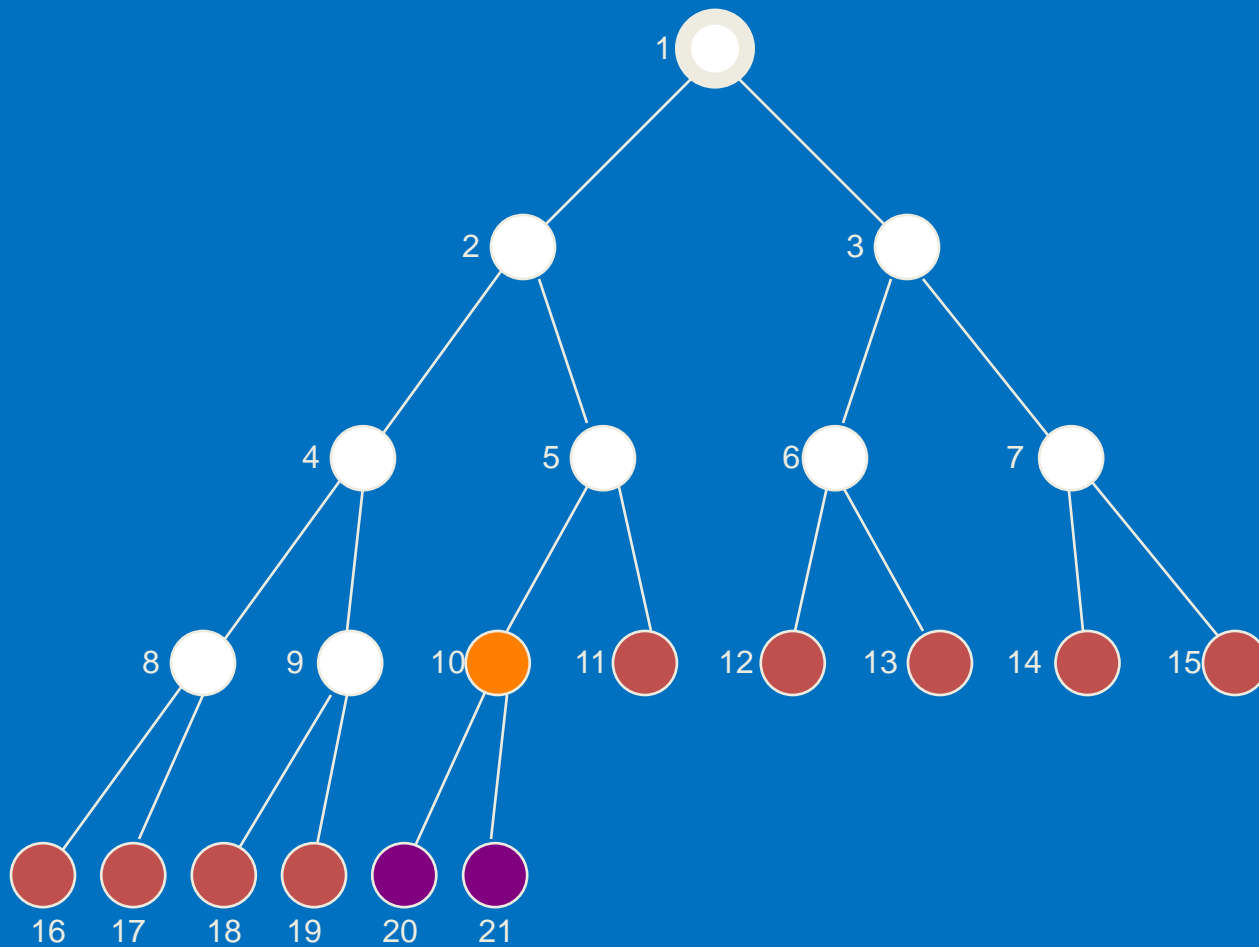


Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 10

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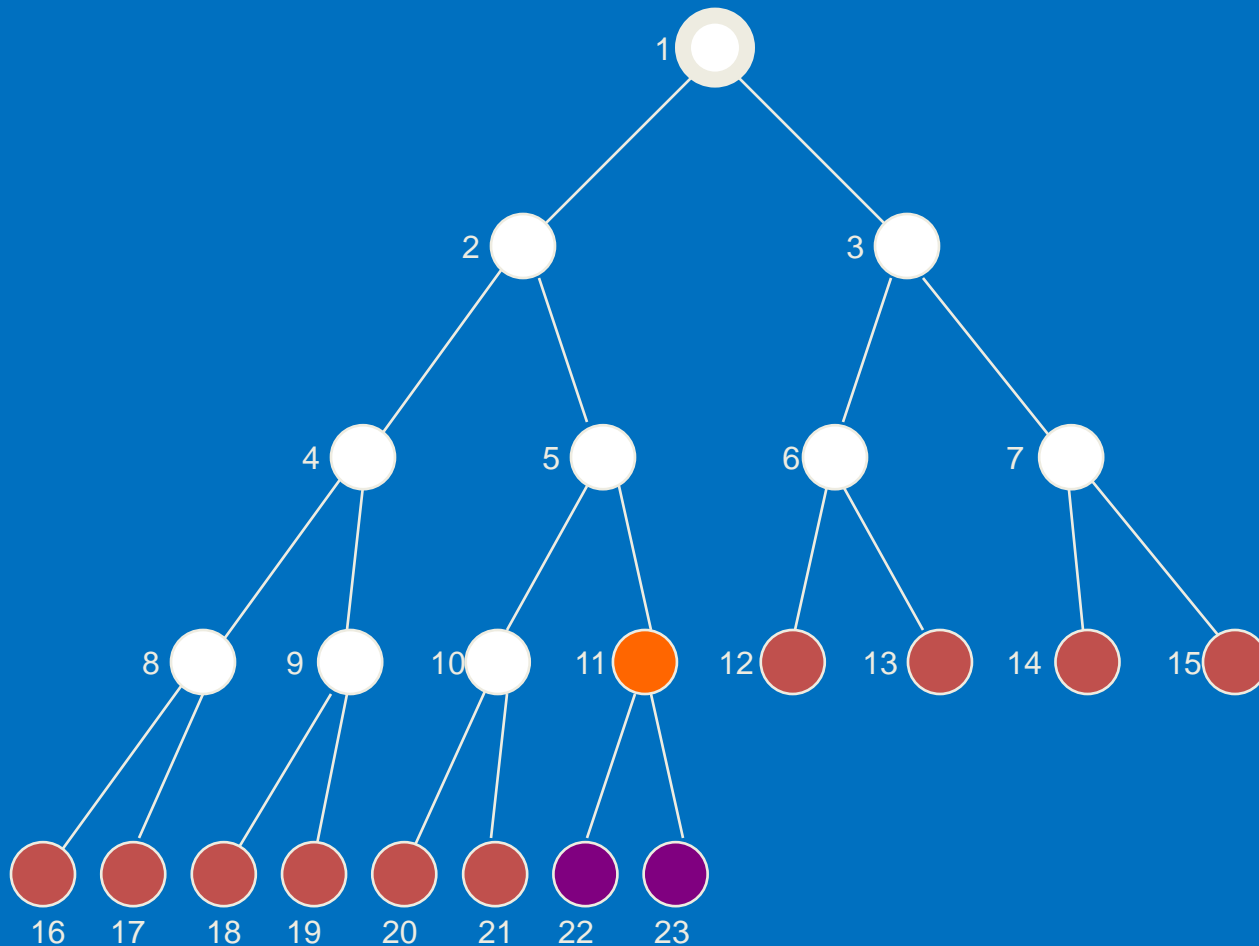






Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 11

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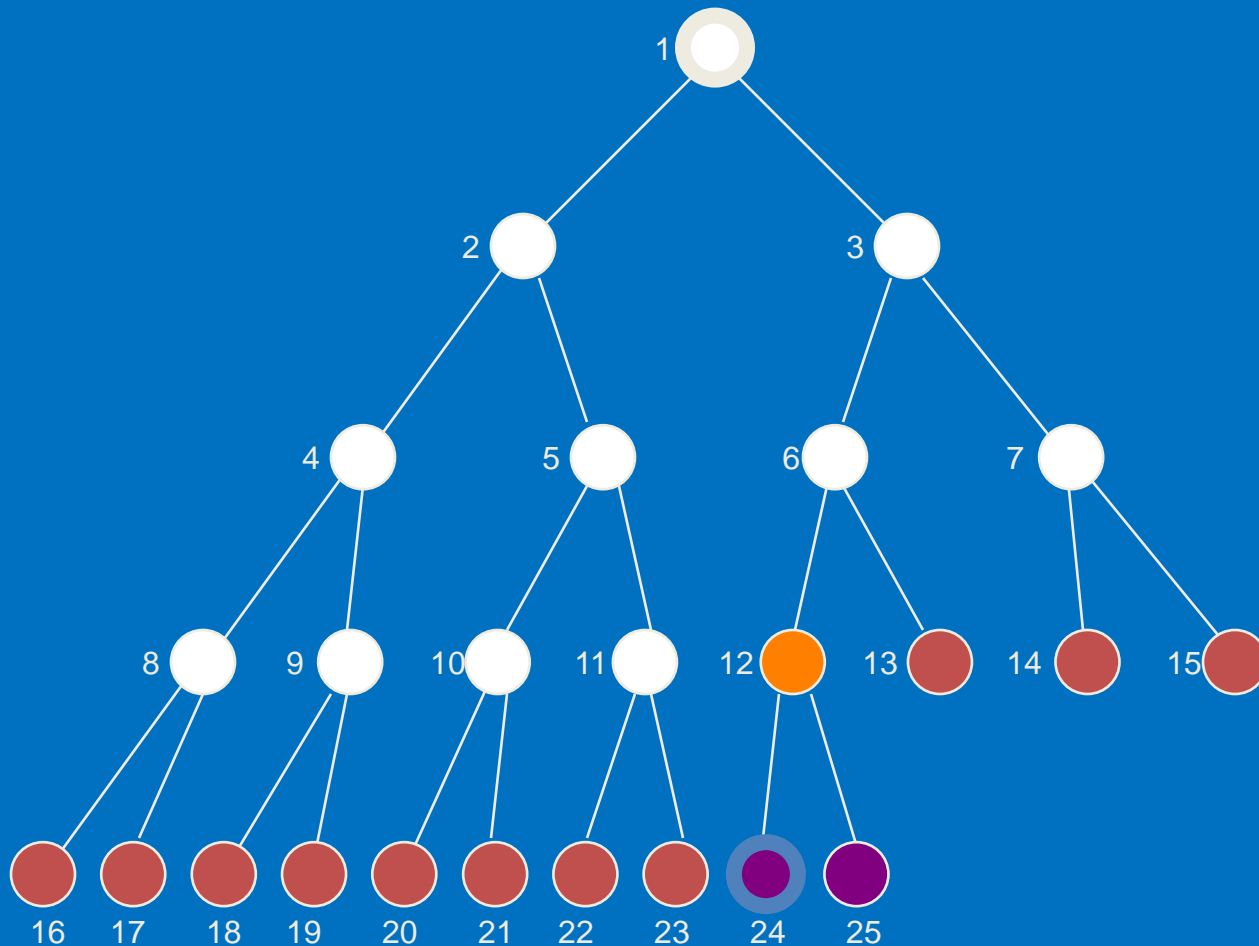


Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 



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

Breadth-First Snapshot 12

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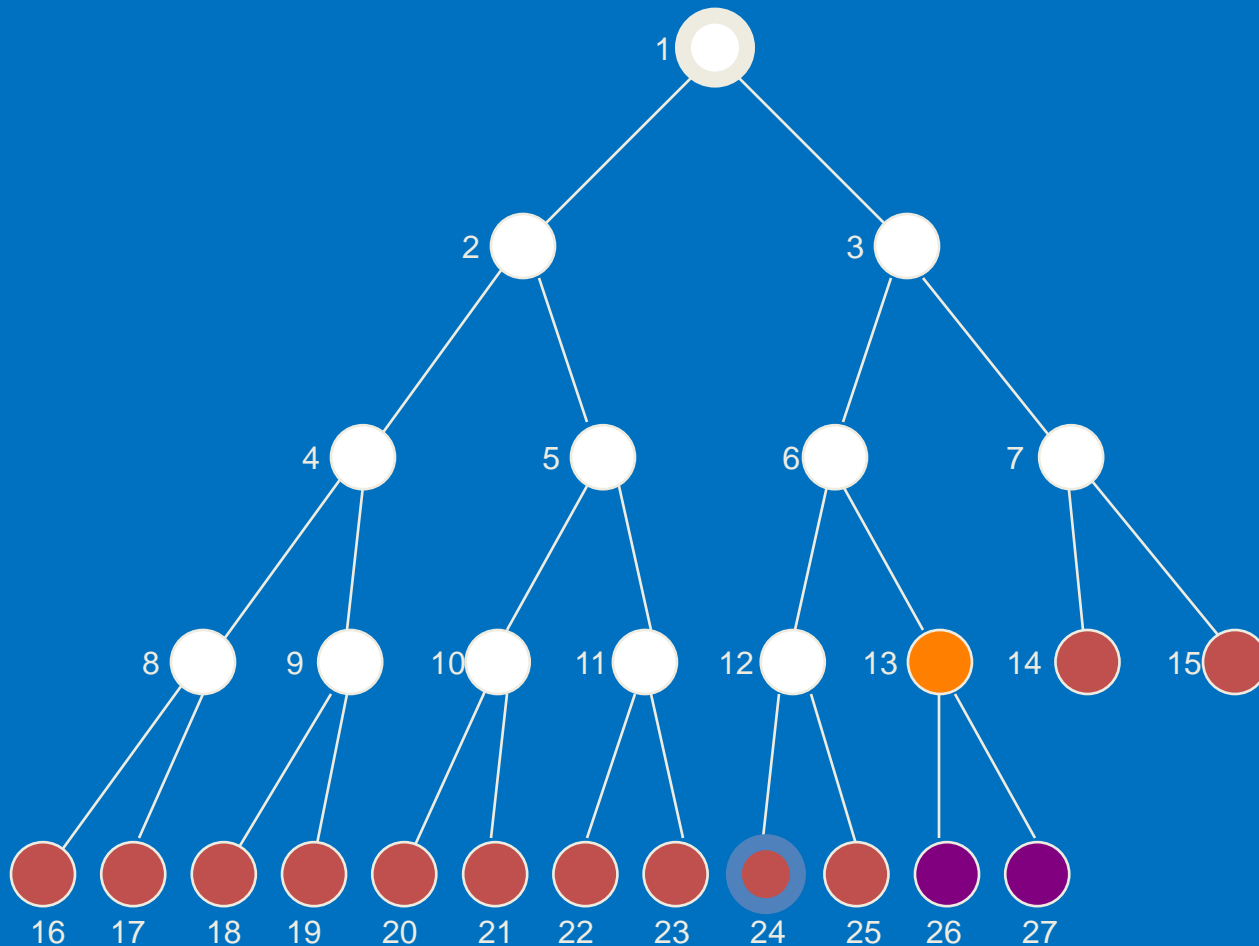
Fringe: [13,14,15,16,17,18,19,20,21] + [22,23]

Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 13

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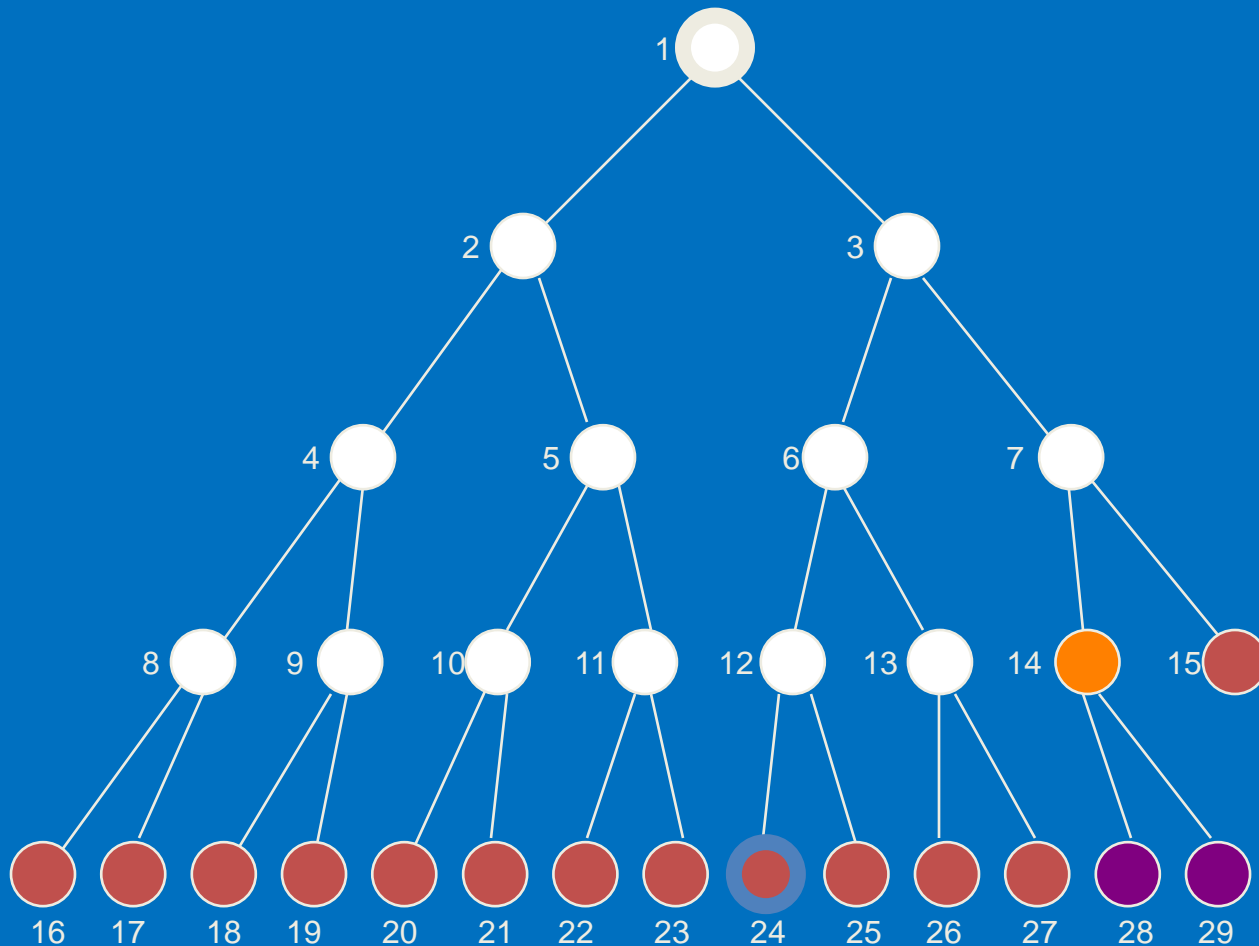


- Initial 
- Visited 
- Fringe 
- Current 
- Visible 
- Goal 

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

Breadth-First Snapshot 14

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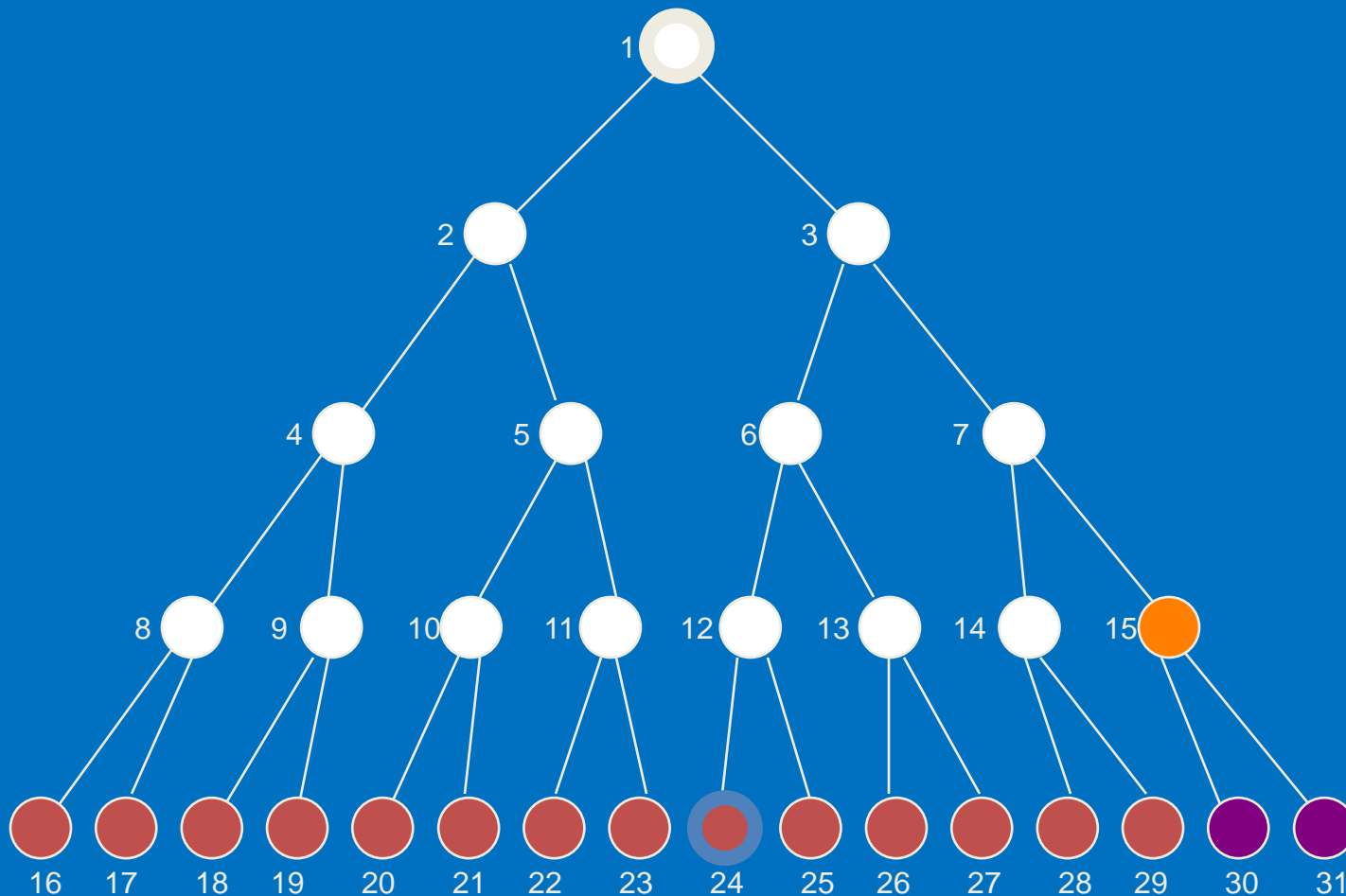


Initial
Visited
Fringe
Current
Visible
Goal

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

Breadth-First Snapshot 15

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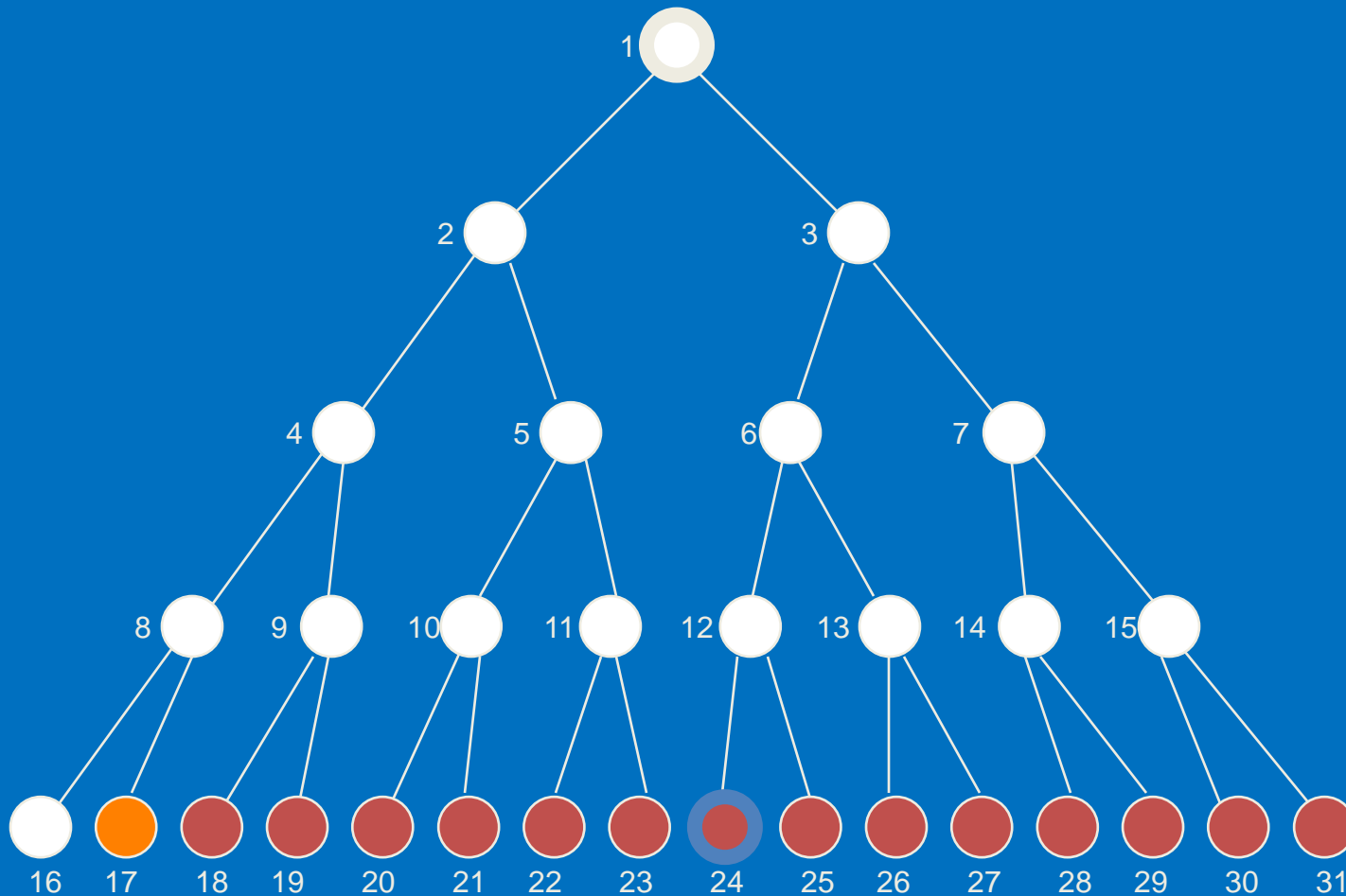


Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Breadth-First Snapshot 17

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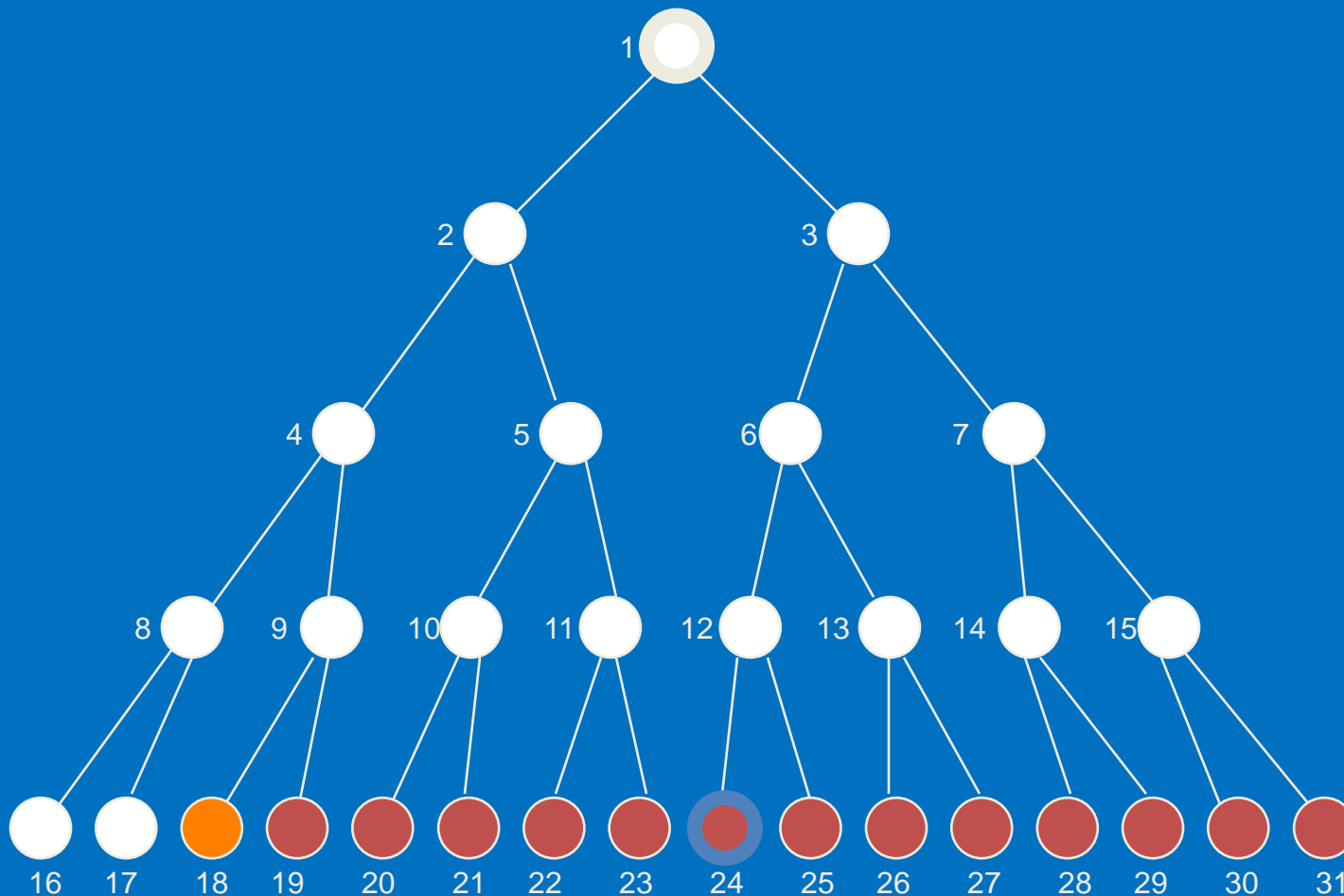


Fringe: [18,19,20,21,22,23,24,25,26,27,28,29,30,31]

Initial
Visited
Fringe
Current
Visible
Goal

Breadth-First Snapshot 18

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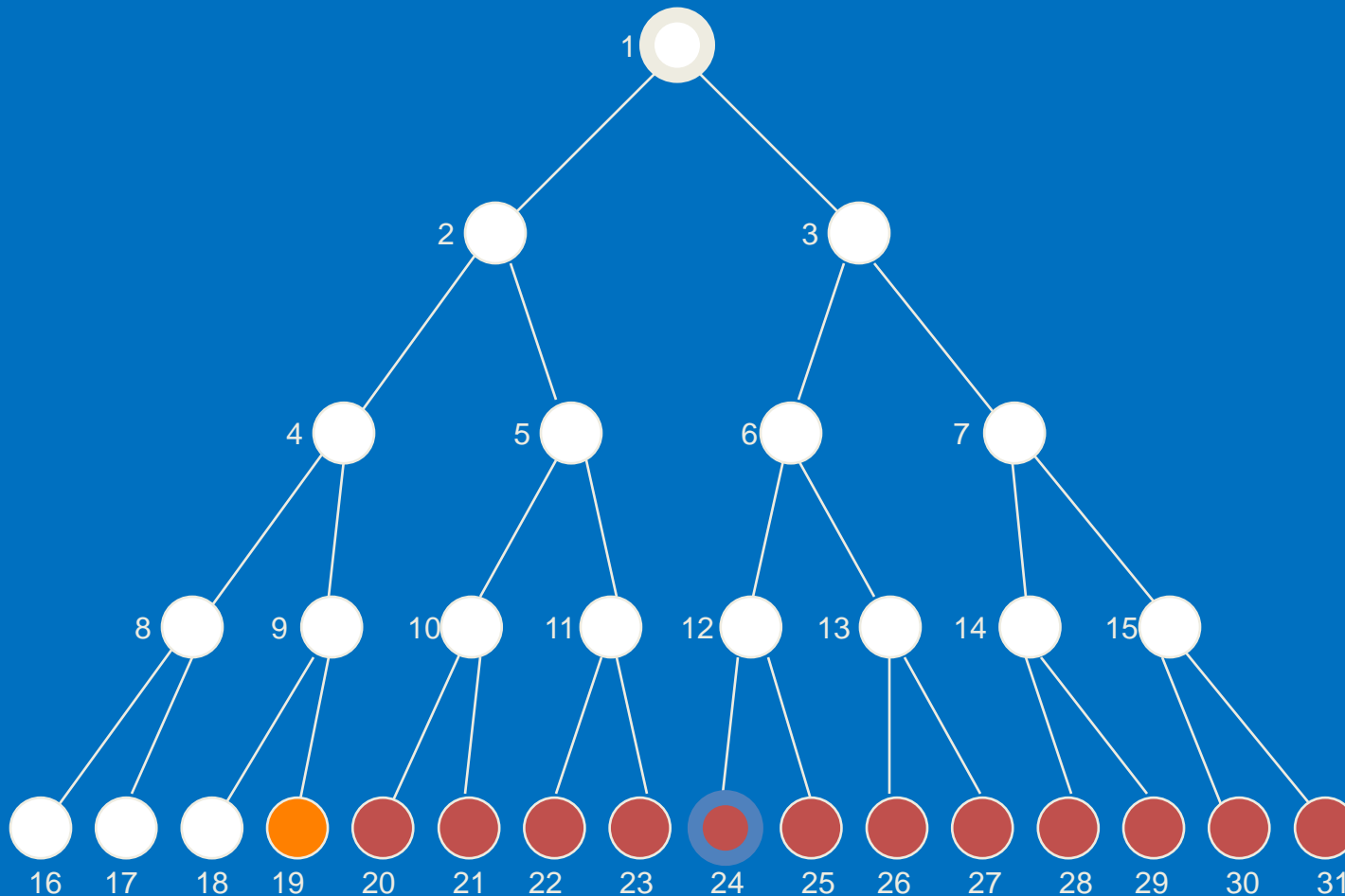


Initial
Visited
Fringe
Current
Visible
Goal

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

Breadth-First Snapshot 19

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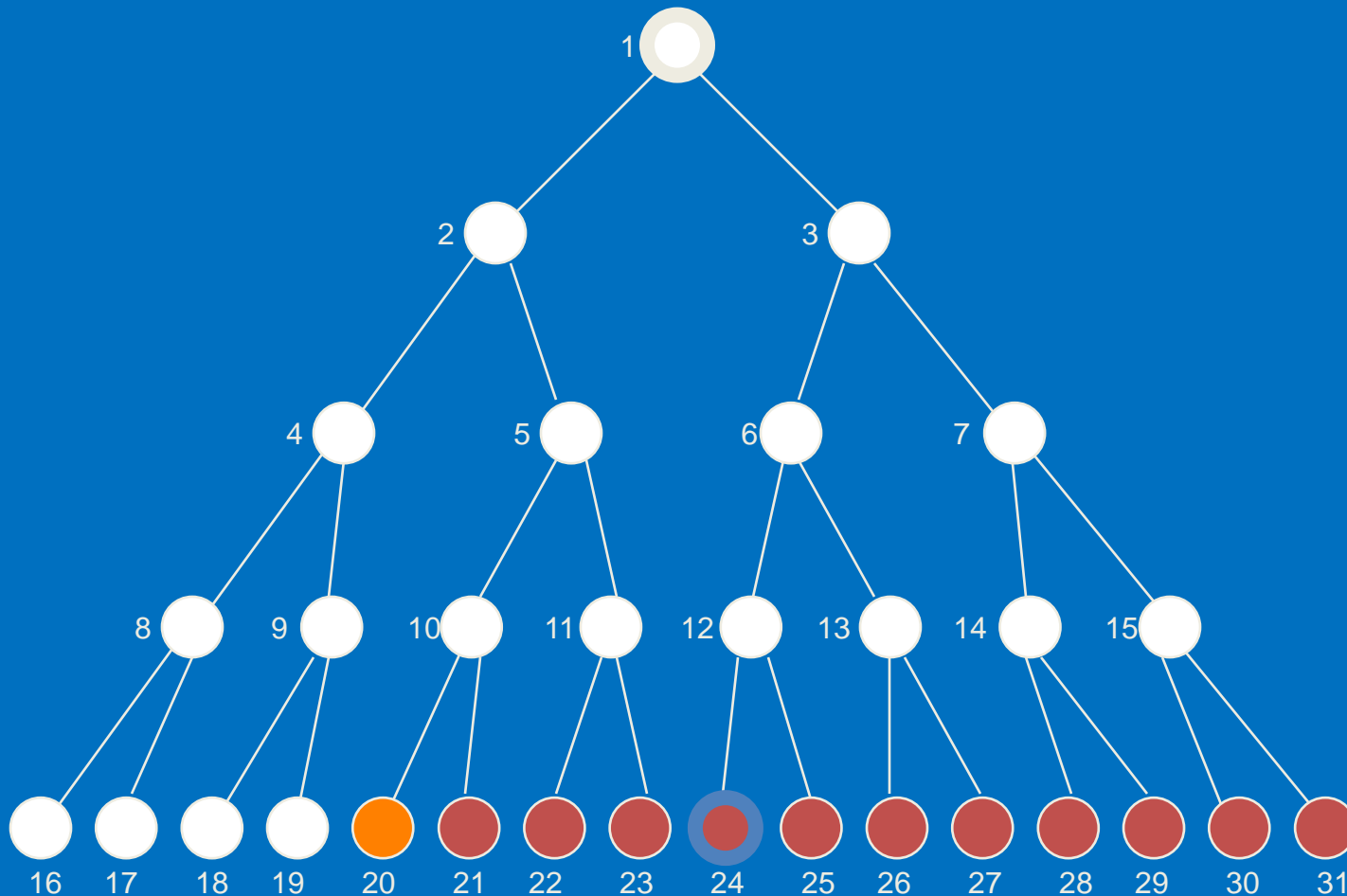


Fringe: [20,21,22,23,24,25,26,27,28,29,30,31]

Initial
Visited
Fringe
Current
Visible
Goal

Breadth-First Snapshot 20

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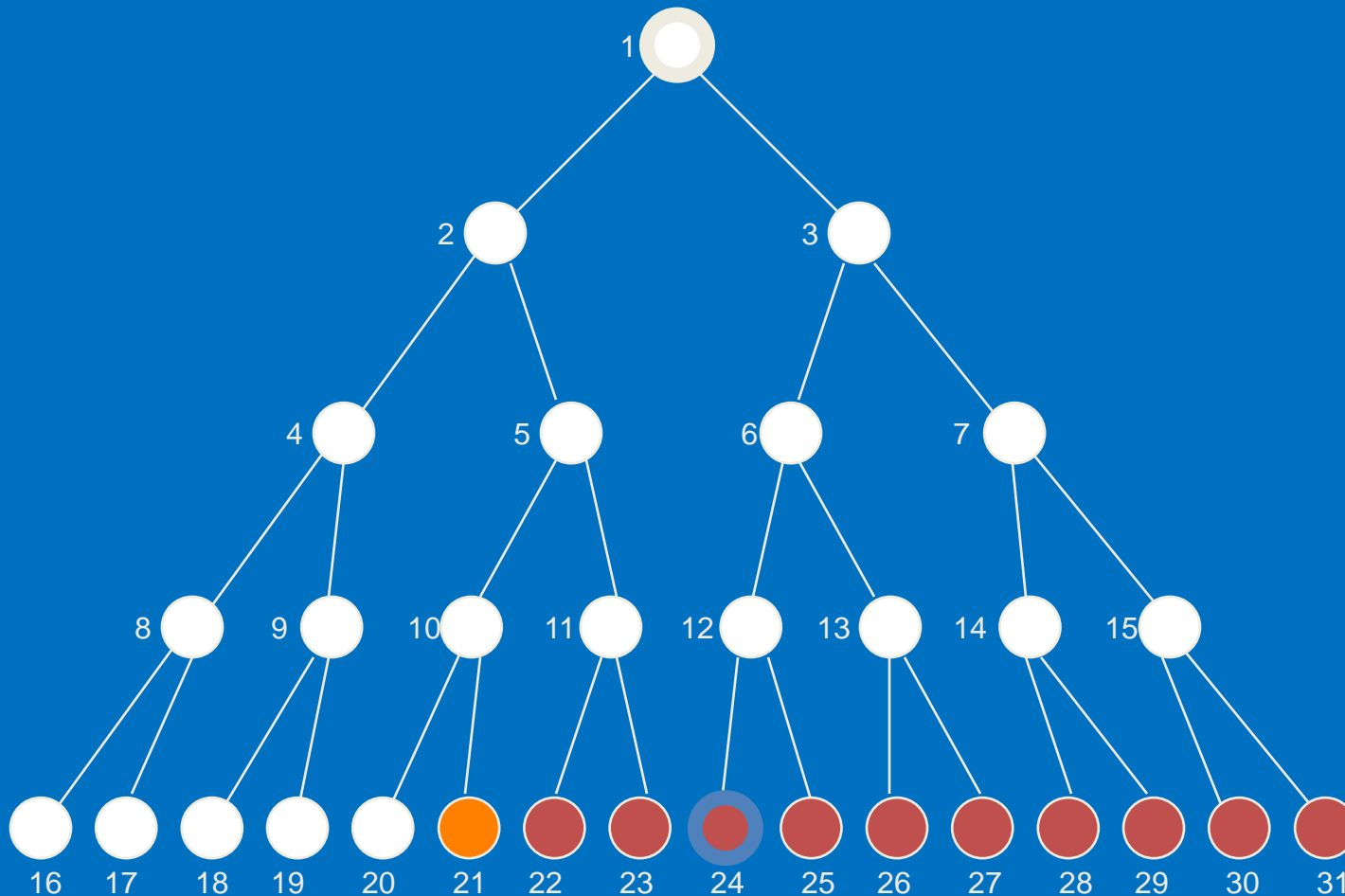


Fringe: [21,22,23,24,25,26,27,28,29,30,31]

Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

Breadth-First Snapshot 21

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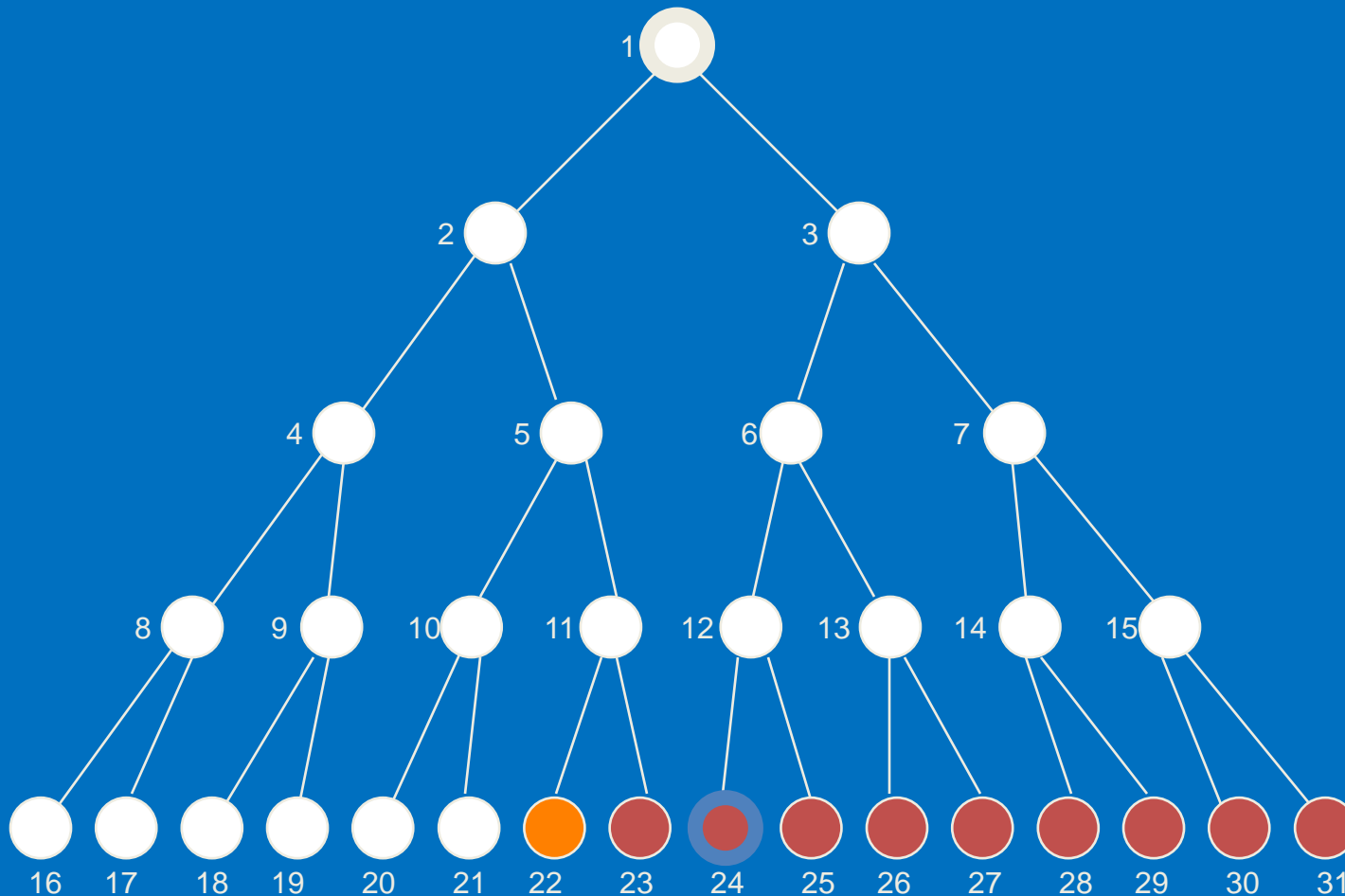


Fringe: [22,23,24,25,26,27,28,29,30,31]

Initial
Visited
Fringe
Current
Visible
Goal

Breadth-First Snapshot 22

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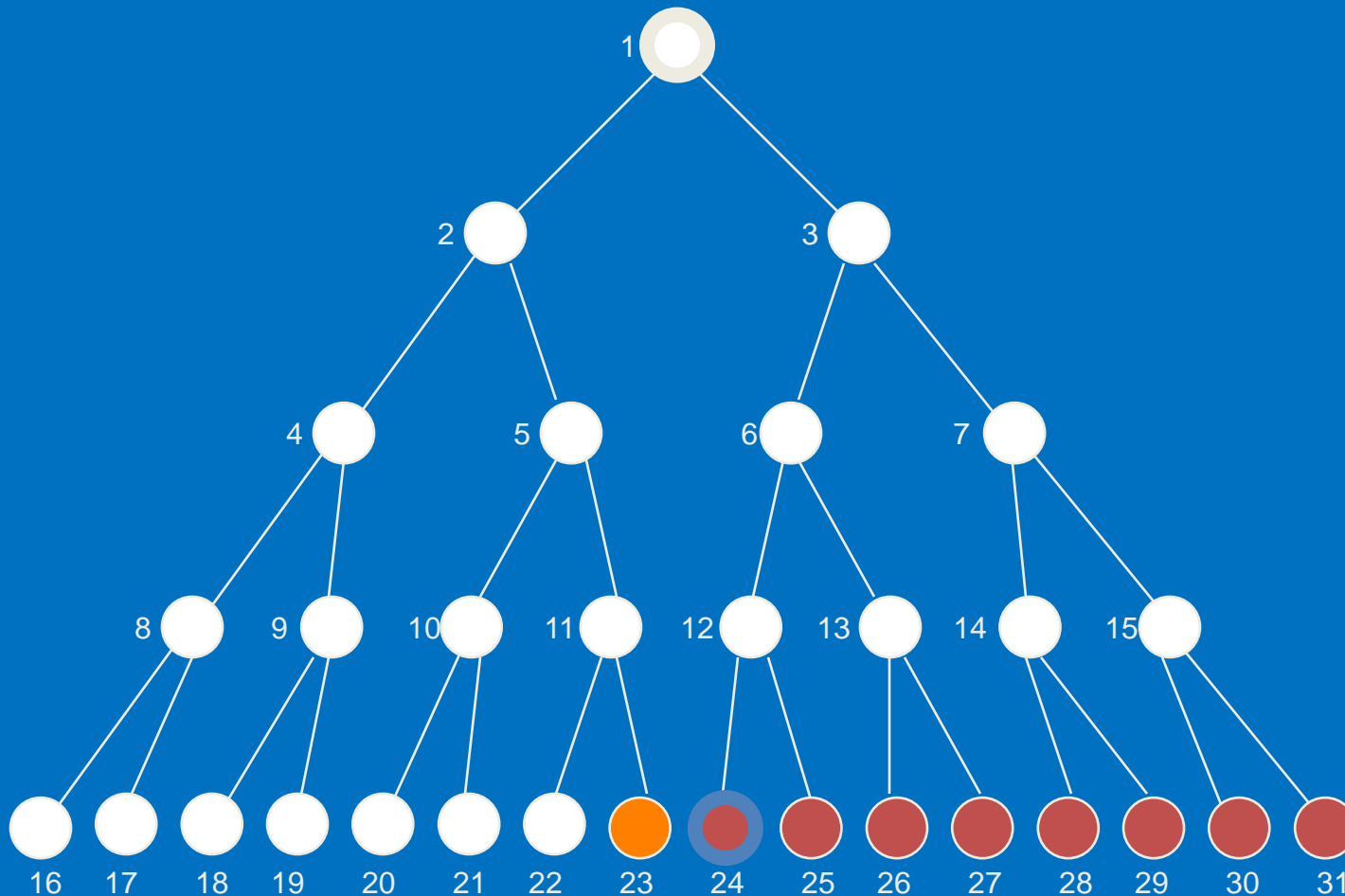


Initial
Visited
Fringe
Current
Visible
Goal

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

Breadth-First Snapshot 23

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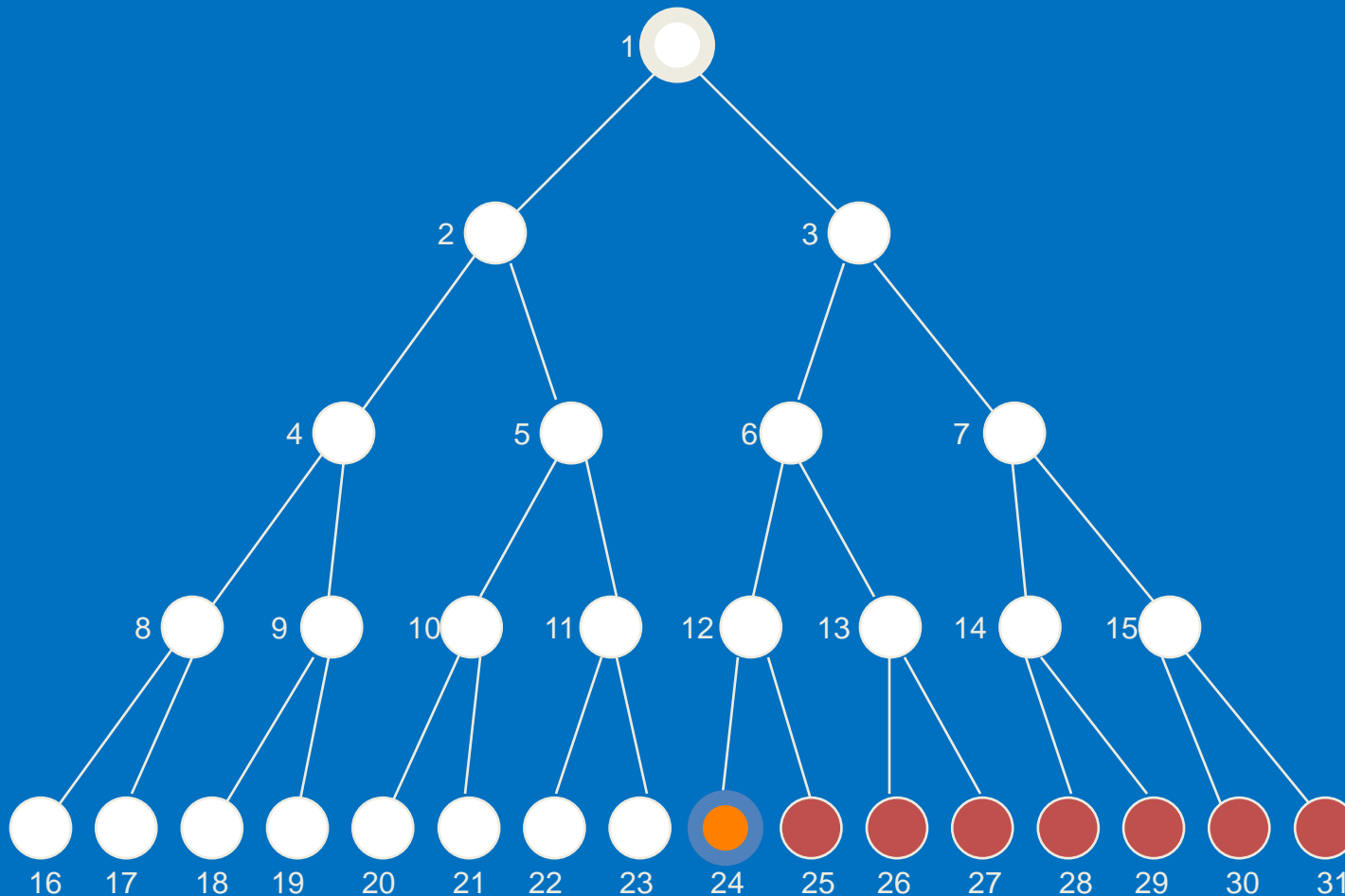
Initial
Visited
Fringe
Current
Visible
Goal

Fringe =
nodes
waiting in
queue to
be
explored



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

Breadth-First Snapshot 24

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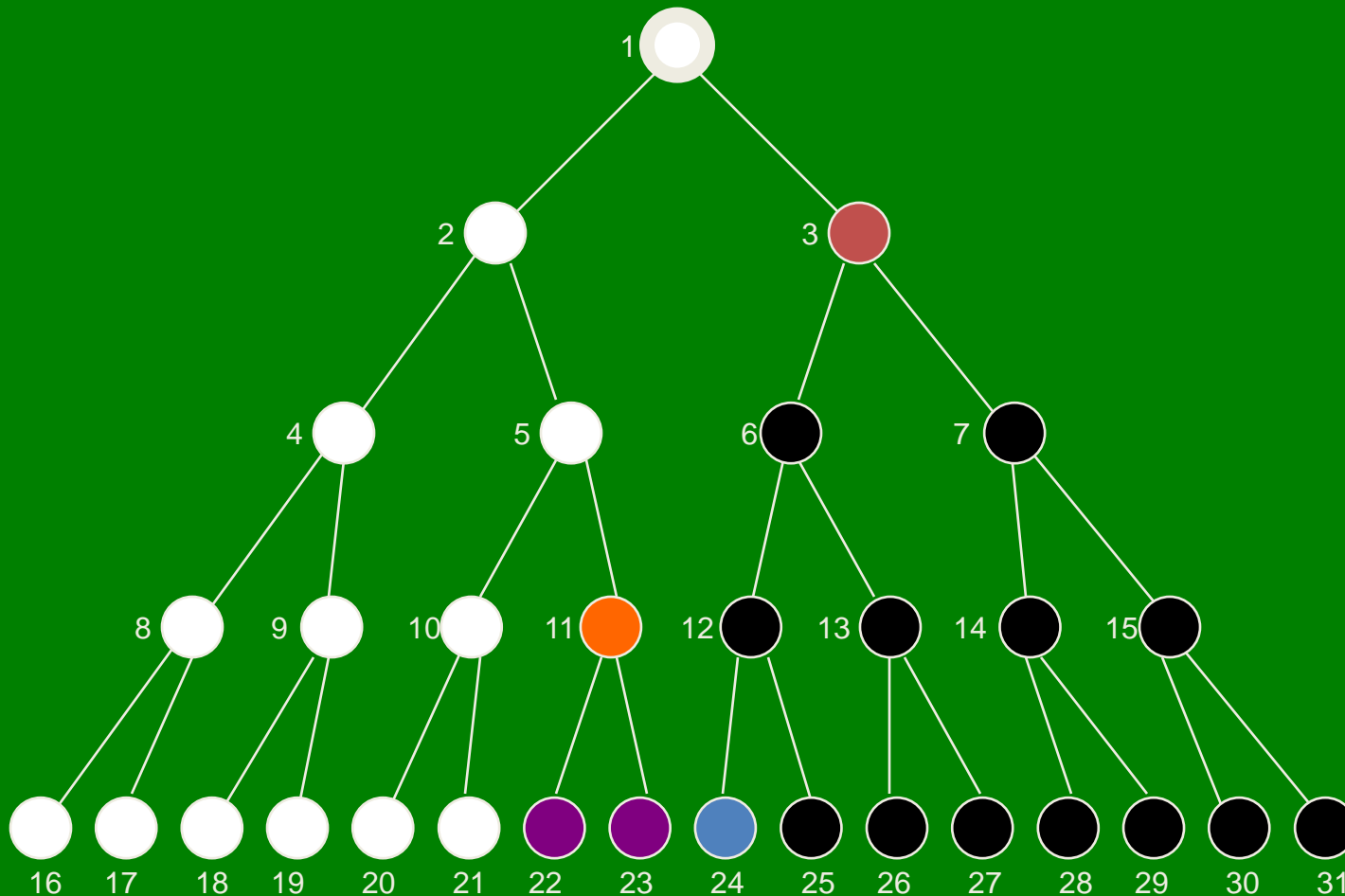
Fringe: [25,26,27,28,29,30,31]

Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

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

Depth-First Snapshot

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Fringe: [3] + [22,23]

Initial 
 Visited 
 Fringe 
 Current 
 Visible 
 Goal 

Fringe =
nodes
waiting in
queue to
be
explored

Activity 1: Depth-First vs. Breadth-First

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- 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

Question 1: Give reasons why Depth First search uses less space than breadth first?

- Breadth-first is more careful by checking all alternatives
 - Complete and optimal
 - Under most circumstances
 - But ..Very memory-intensive !!

Question 2: Give a reason why Breadth First search uses very memory-intensive?

Revision (5): Exhaustive Search

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The following state space graph below (Figure 1) represents the gas piping network. The node in the graph denotes the gas gate while the arc denotes the pipe that connects the entrance to the gate. Based on this scenario, answer the following questions:

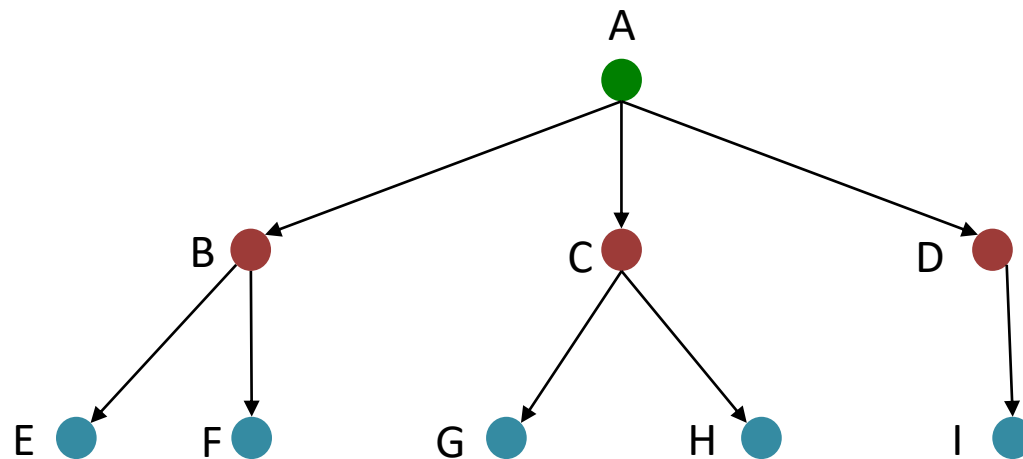


Figure 1. Gas piping network

1. Using graph theory, identify the suitable node/nodes for each description in Table below.

Description	Node (Gas gate)
Start node	A
The child node of A	
The parent node of G, H	
The child node of B	
The parent node of I	

Revision (5): Exhaustive Search

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2. Based on Figure 1, let node A is a start node, and the goal node is E. Perform a **breadth-first search**, then list down the order of nodes to be visited (OPEN and CLOSED list) from the starting node to the goal node in Table below.

Iteration	OPEN	CLOSED
0		
1		
2		

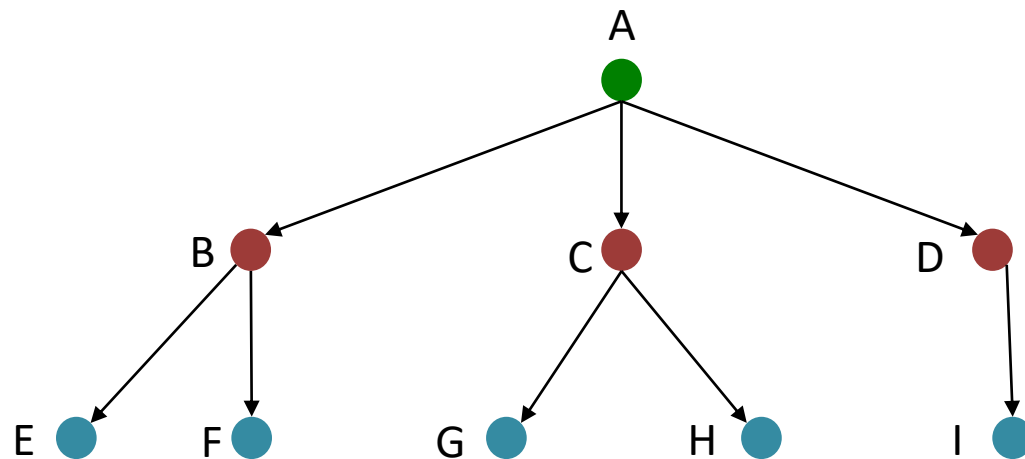


Figure 1. Gas piping network

3. Produce the sequence of nodes for the gas can be flowed from gate A to gate E.

Revision (5): Exhaustive Search

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2. Based on Figure 1, let node A is a start node, and the goal node is E. Perform a breadth-first search, then list down the order of nodes to be visited (OPEN and CLOSED list) from the starting node to the goal node in Table below.

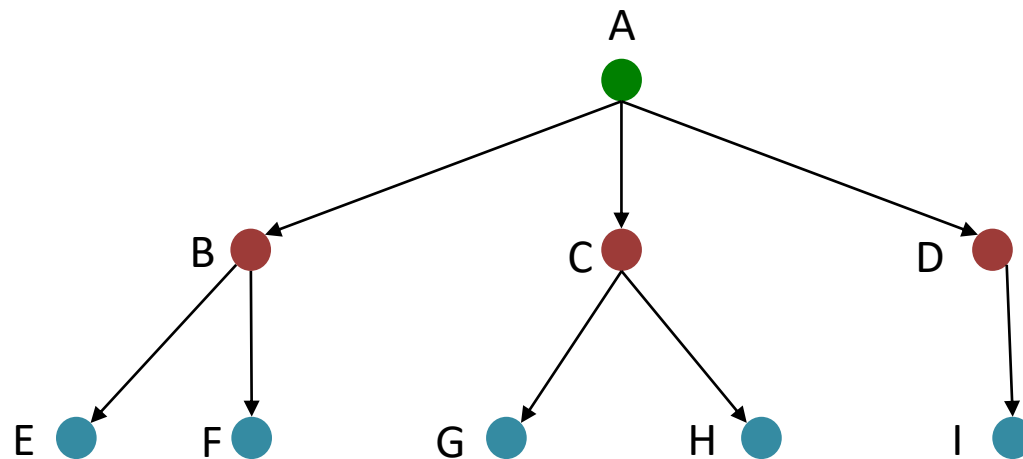


Figure 1. Gas piping network

Iteration	OPEN	CLOSED
0	A	[]
1	B,C,D	A
2	C,D,E,F	B,A
3	D,E,F,G,H	C,B,A
4	E,F,G,H,I	D,C,B,A
5	E is found	

Revision (5): Exhaustive Search

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1. Based on Figure 1, let node A is a start node, and the goal node is E. Perform a **depth-first search**, then list down the order of nodes to be visited (OPEN and CLOSED list) from the starting node to the goal node in Table below.

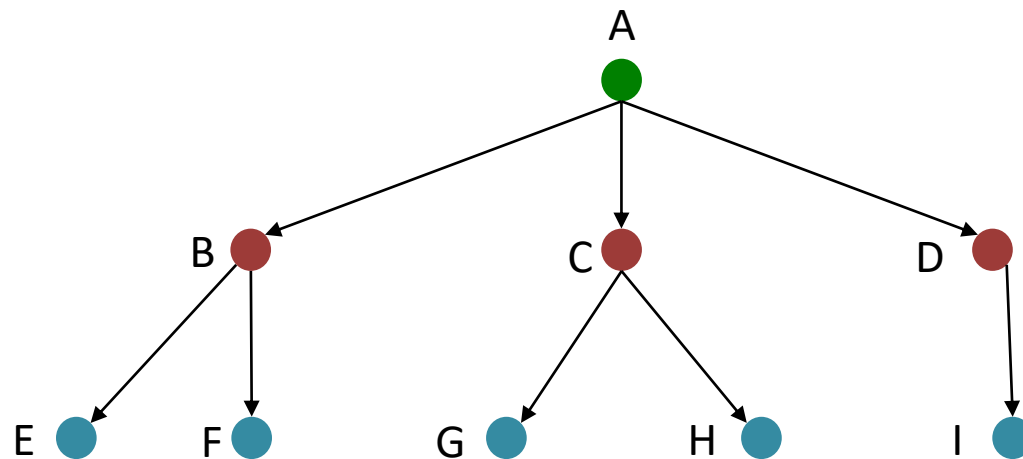


Figure 1. Gas piping network

Iteration	OPEN	CLOSED
0		
1		
2		
3		
4		
5		

2. Produce the sequence of nodes for the gas can be flowed from gate A to gate E.

Revision (5): Exhaustive Search

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3. Based on Figure 1, let node A is a start node, and the goal node is E. Perform a depth-first search, then list down the order of nodes to be visited (OPEN and CLOSED list) from the starting node to the goal node in Table below.

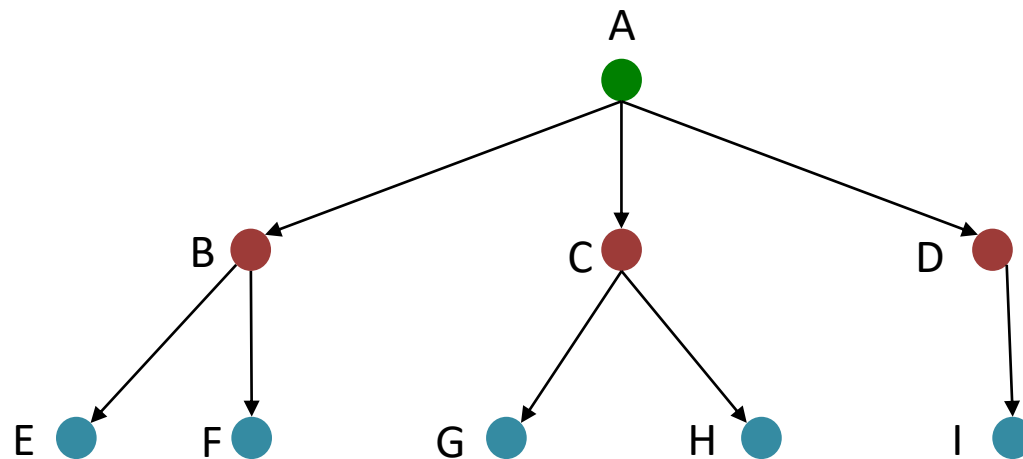


Figure 1. Gas piping network

Iteration	OPEN	CLOSED
0	A	[]
1	B,C,D	A
2	E,F,C,D	B,A
3	E is found	
4		
5		



Using State Space to Represent Reasoning

- And/or graph
- Hypergraph

Using State Space to Represent Reasoning : **Predicate calculus**

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- Predicate calculus – map nodes/some states of a graph onto state space
- Inference rules – describe the arc between states
- Eg. Is expression a logical consequence of given assertion?
Use search to solve
- Guarantee correctness of conclusion derived- **a formal proof** of integrity of solution

Draw a graph: **Propositional calculus**

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Example: Define a graph from propositional calculus to view the logical relationships.

$q \rightarrow p$

$r \rightarrow p$

$v \rightarrow q$

$s \rightarrow r$

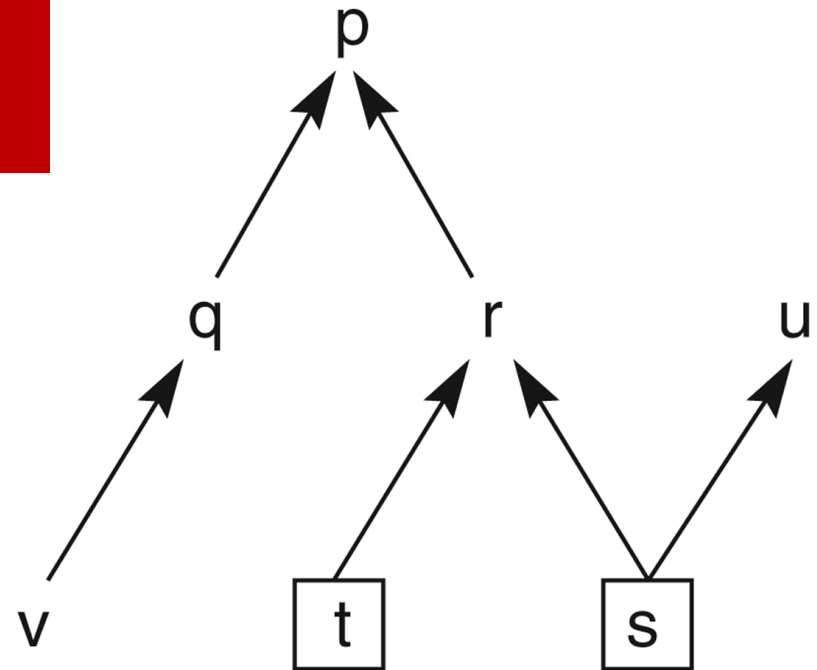
$t \rightarrow r$

$s \rightarrow u$

s

t

Translate into
graph?



- State space graph of a set of implications in the propositional calculus.
- Reasoning:- How to infer p using modus ponens?

$s, s \rightarrow r$ yields r

$r, r \rightarrow p$ yields p

Activity 2: From propositional calculus to a graph

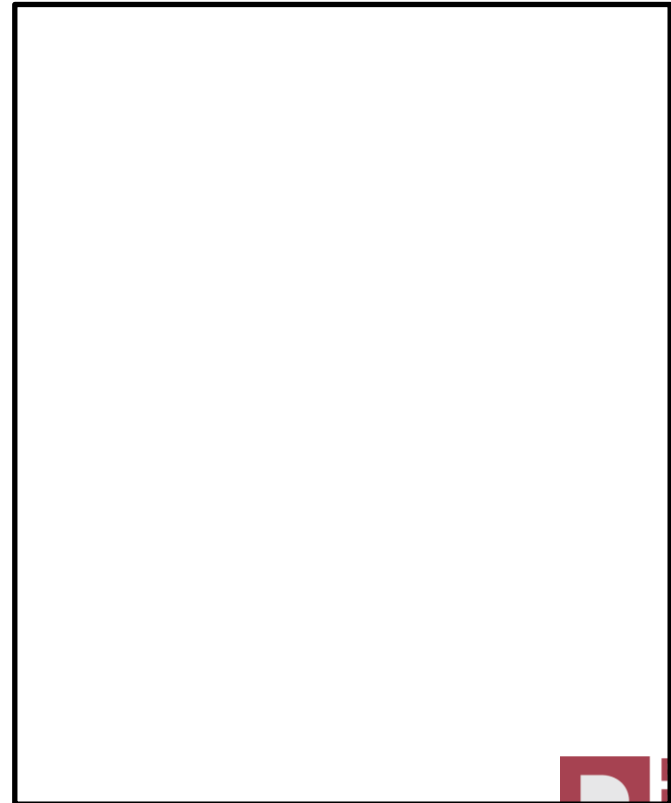
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Give a set of propositional calculus expressions, you are required to draw a graph.

a
b
c
a \rightarrow **e**
c \rightarrow **e**
b \rightarrow **f**
c \rightarrow **f**
f \rightarrow **g**



Draw graph

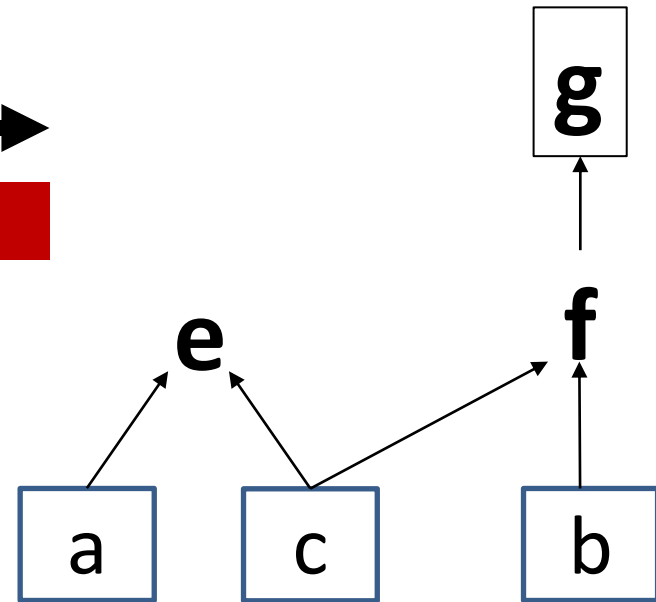


Activity 2: From propositional calculus to a graph

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Give a set of propositional calculus expressions, you are required to draw a graph.

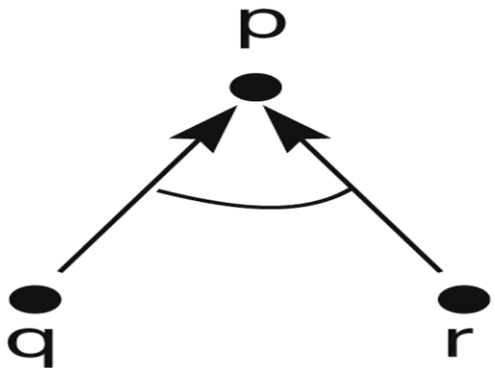
a
b
c
a \rightarrow **e**
c \rightarrow **e**
b \rightarrow **f**
c \rightarrow **f**
f \rightarrow **g**



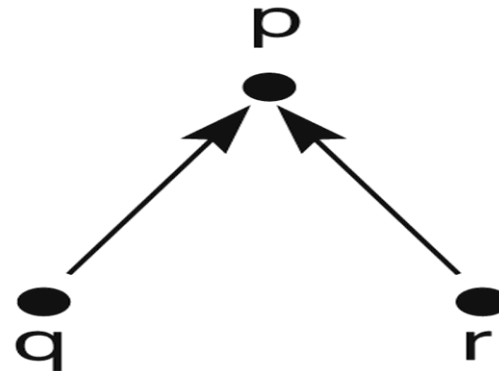
And/or graph

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- To represent logical operators AND and OR in predicate calculus
- extension of basic graph model known as **and/or graph**
- To differ the relationships graphically, curve link indicates operator AND.



$q \wedge r \Rightarrow p$



$q \vee r \Rightarrow p$

Hypergraph

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AND/OR graph is a specialization of a type of graph known as *hypergraph*, which connects nodes by sets of arcs rather than a single arcs

DEFINITION

HYPERGRAPH

A hypergraph consists of:

N, a set of nodes.

H, a set of hyperarcs defined by ordered pairs in which the first element of the pair is a single node from **N** and the second element is a subset of **N**.

An ordinary graph is a special case of hypergraph in which all the sets of descendant nodes have a cardinality of 1.

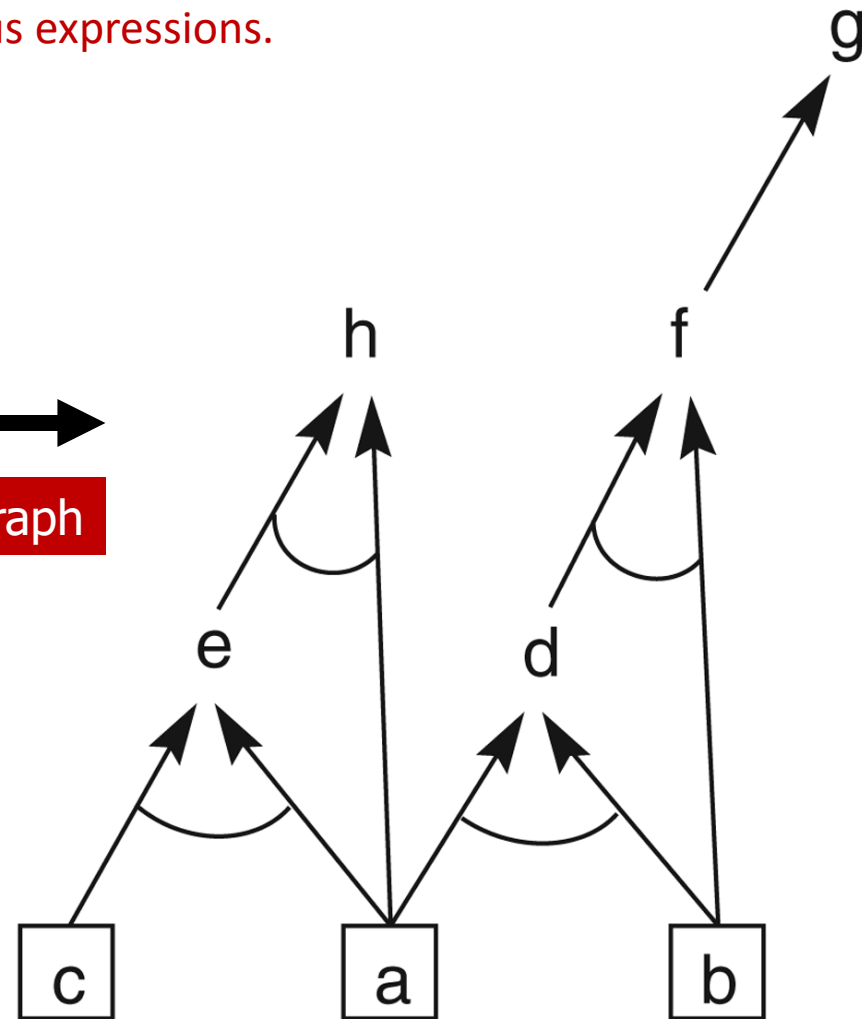
Hypergraph

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eg. And/or graph of a set of propositional calculus expressions.

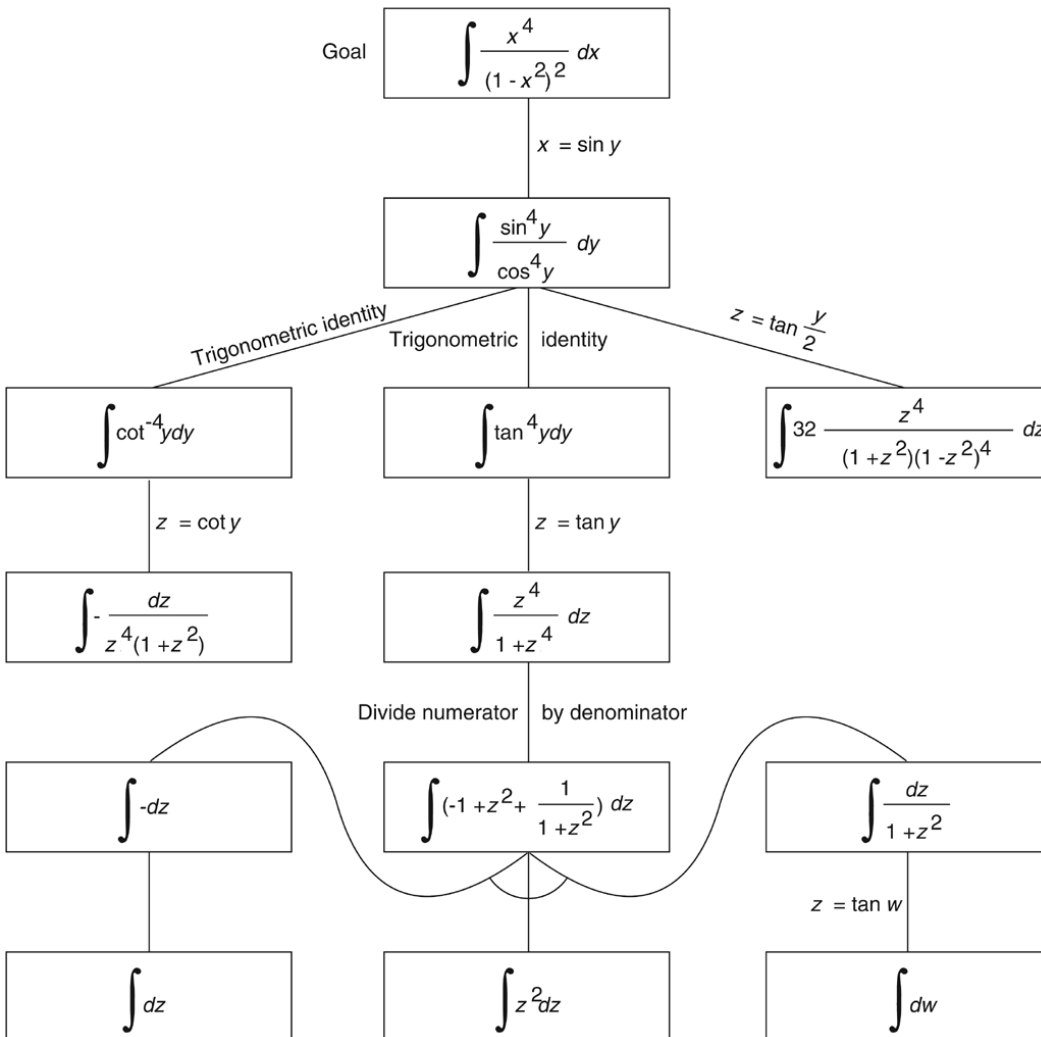
a
b
c
 $a \wedge b \rightarrow d$
 $a \wedge c \rightarrow e$
 $b \wedge d \rightarrow f$
 $f \rightarrow g$

→
 Draw the and/or graph



Hypergraph

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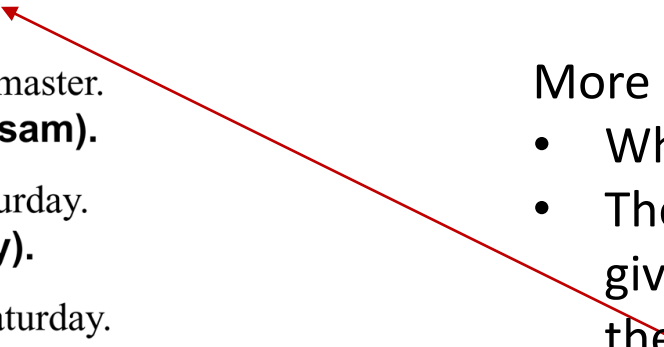


More example:
 And/or graph of part of the state
 space for integrating a function,
 from Nilsson (1971).

Goal-directed search

Hypergraph

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1. Fred is a collie.
collie(fred). 
2. Sam is Fred's master.
master(fred,sam).
3. The day is Saturday.
day(saturday).
4. It is cold on Saturday.
 \neg (**warm(saturday)**).
5. Fred is trained.
trained(fred).
6. Spaniels are good dogs and so are trained collies.
 $\forall X[\text{spaniel}(X) \vee (\text{collie}(X) \wedge \text{trained}(X)) \rightarrow \text{gooddog}(X)]$
7. If a dog is a good dog and has a master then he will be with his master.
 $\forall (X,Y,Z) [\text{gooddog}(X) \wedge \text{master}(X,Y) \wedge \text{location}(Y,Z) \rightarrow \text{location}(X,Z)]$
8. If it is Saturday and warm, then Sam is at the park.
 $(\text{day(saturday)} \wedge \text{warm(saturday)}) \rightarrow \text{location(sam,park)}.$
9. If it is Saturday and not warm, then Sam is at the museum.
 $(\text{day(saturday)} \wedge \neg (\text{warm(saturday)})) \rightarrow \text{location(sam,museum)}.$

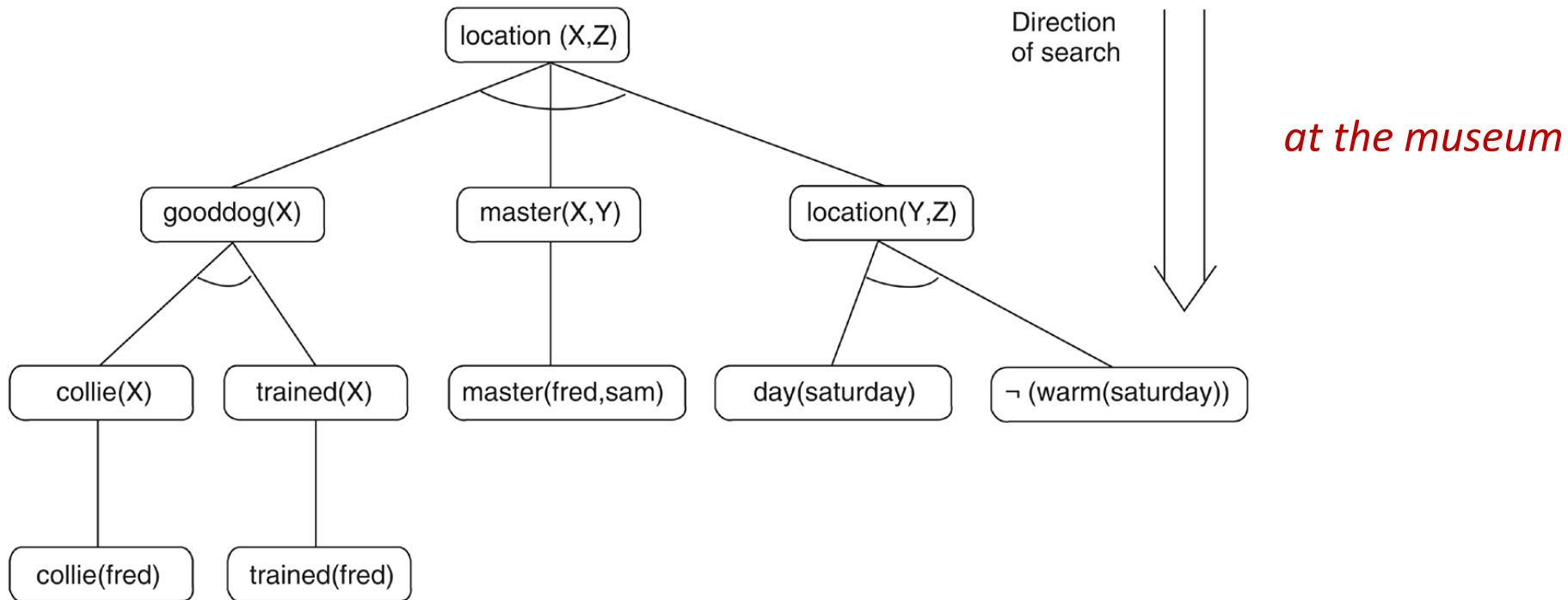
More example:

- Where is Fred??
- The facts and rules of this example are given as English sentences followed by their predicate calculus equivalents:

Hypergraph

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Where is Fred???. The solution subgraph showing that fred is ???



Substitutions = {fred/X, sam/Y, museum/Z}

Goal-driven search using predicate calculus

innovative • entrepreneurial • global