

Outline

Search
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Problem solving by
searching

Search Algorithms

Uninformed
Search

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Breadth-first search

Requirements
& Reading
Material



CSE 433

Artificial Intelligence

4th year, Computer Engineering

Fall 2012, Lecture #2

Hazem Shehata

Dept. of Computer & Systems Engineering
Zagazig University

September 24th, 2012

Credits to Dr. Mohamed El Abd for the slides

Adminstrivia

Notes

- Tutorials:
 - Starting this week (Eng. Amr).

Course Info:

- Website:
<http://www.hshehata.name.eg/courses/cse433>

Adminstrivia

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- Tutorials:
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- Office hours:
 - Need to be determined!

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Adminstrivia

Notes

- Tutorials:
 - Starting this week (Eng. Amr).
- Office hours:
 - Need to be determined!
- Assignment #1:
 - Programming assignment
 - To be released next week.
 - Work in groups of two.

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2 Uninformed Search

3 Requirements & Reading Material

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Problem solving by searching

Introduction

- Intelligent agents try to maximize their performance measure.

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Introduction

- Intelligent agents try to maximize their performance measure.
- An agent performs *actions* to get from its *initial* state to a *goal*.

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Introduction

- Intelligent agents try to maximize their performance measure.
- An agent performs *actions* to get from its *initial* state to a *goal*.
- The process of looking for a sequence of actions to reach a goal is called **search**.

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Introduction

- Intelligent agents try to maximize their performance measure.
- An agent performs *actions* to get from its *initial* state to a *goal*.
- The process of looking for a sequence of actions to reach a goal is called **search**.
- A search algorithm takes a *problem* as an input and returns a *solution* in the form of an action sequence.

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Introduction

- Intelligent agents try to maximize their performance measure.
- An agent performs *actions* to get from its *initial* state to a *goal*.
- The process of looking for a sequence of actions to reach a goal is called **search**.
- A search algorithm takes a *problem* as an input and returns a *solution* in the form of an action sequence.
- Search is central in many AI systems:
 - Theorem proving, VLSI layout, Game playing, Navigation, *etc.*

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Problem solving by searching

Requirements of searching

- Define the problem:
 - Represent the search space by states.
 - Define the actions the agent can perform.
 - Define the costs associated with the defined actions.

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Requirements of searching

- Define the problem:
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 - Define the actions the agent can perform.
 - Define the costs associated with the defined actions.
- Define a goal: What is the agent searching for?

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Requirements of searching

- Define the problem:
 - Represent the search space by states.
 - Define the actions the agent can perform.
 - Define the costs associated with the defined actions.
- Define a goal: What is the agent searching for?
- Define the solution:
 - The goal itself?
 - The path (i.e. sequence of actions) to get to the goal?

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Assumptions

- Goal-based agent.

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Assumptions

- Goal-based agent.
- Environment:

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Assumptions

- Goal-based agent.
- Environment:
 - Fully observable.

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Problem solving by searching

Assumptions

- Goal-based agent.
- Environment:
 - Fully observable.
 - Deterministic.

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Assumptions

- Goal-based agent.
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Problem solving by searching

Assumptions

- Goal-based agent.
- Environment:
 - Fully observable.
 - Deterministic.
 - Sequential.
 - Static.

Problem solving by searching

Assumptions

- Goal-based agent.
- Environment:
 - Fully observable.
 - Deterministic.
 - Sequential.
 - Static.
 - Discrete.

Problem solving by searching

Assumptions

- Goal-based agent.
- Environment:
 - Fully observable.
 - Deterministic.
 - Sequential.
 - Static.
 - Discrete.
 - Single agent.

Problem solving by searching

Formulating problems

- A problem can be defined formally by five components:

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Formulating problems

- A problem can be defined formally by five components:
 - 1 The **initial state** that the agent starts in.
 - INITIAL-STATE : **STATE**

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Formulating problems

- A problem can be defined formally by five components:
 - 1 The **initial state** that the agent starts in.
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 - 2 The possible **actions** available at each state.
 - ACTIONS : **STATE** \rightarrow **ACTION SET**

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 - 3 The **transition model** describing what each action does.
 - RESULT : **STATE** \times **ACTION** \rightarrow **STATE**

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 - RESULT : **STATE** \times **ACTION** \rightarrow **STATE**
 - 4 The **goal test** that detects the goal state.
 - GOAL-TEST : **STATE** \rightarrow **BOOLEAN**

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 - GOAL-TEST : **STATE** \rightarrow **BOOLEAN**
 - 5 The **path cost** expressed in terms of step cost.
 - STEP-COST : **STATE** \times **ACTION** \rightarrow **REAL**⁺.

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- A problem can be defined formally by five components:
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 - GOAL-TEST : STATE \rightarrow BOOLEAN
 - 5 The **path cost** expressed in terms of step cost.
 - STEP-COST : STATE \times ACTION \rightarrow REAL⁺.
- This is known as a **STATE-SPACE** problem formulation.

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A puzzle example

6	2	
7	1	8
4	5	3

	1	2
3	4	5
6	7	8

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6	2	
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- **Initial state:** any arrangement of tiles.

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- **Path cost:** each step costs 1, so path cost is the number of steps along the path.

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A puzzle search tree

6	2	
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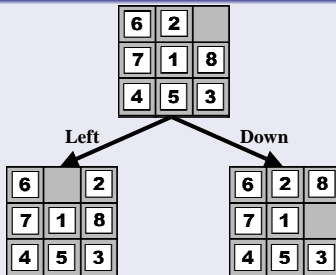
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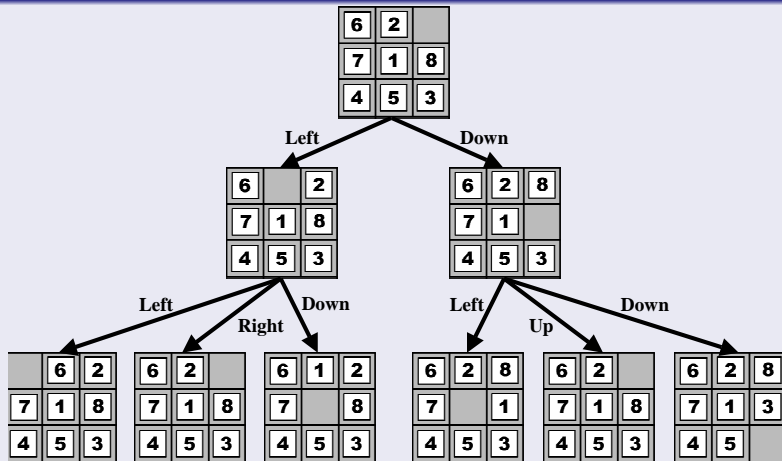
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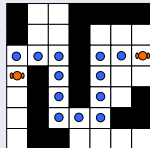
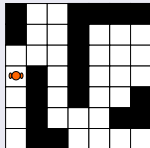
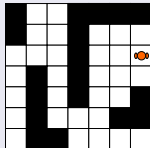
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A puzzle search tree



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A robot navigation example



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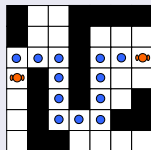
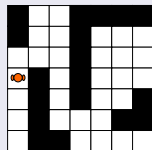
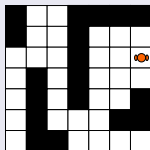
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A robot navigation example



- **Initial state:** the robot is at a certain location.

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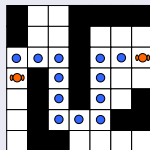
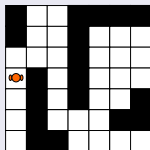
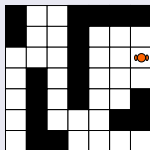
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A robot navigation example



- **Initial state:** the robot is at a certain location.
- **Actions:** the robot moves left, right, up or down, while avoiding obstacles.

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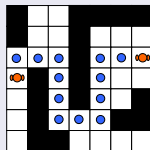
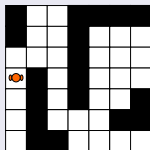
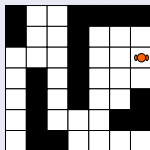
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A robot navigation example



- **Initial state:** the robot is at a certain location.
- **Actions:** the robot moves left, right, up or down, while avoiding obstacles.
- **Transition model:** given a state and action, return a state representing a neighboring location.

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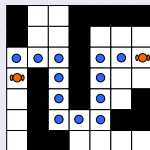
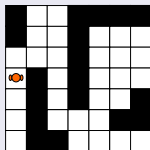
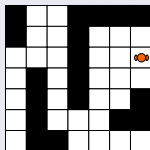
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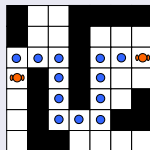
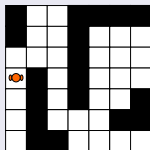
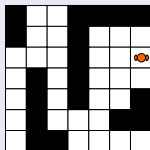
A robot navigation example



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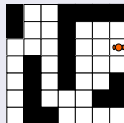
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A robot navigation search tree



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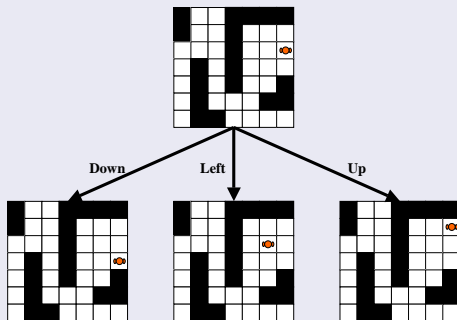
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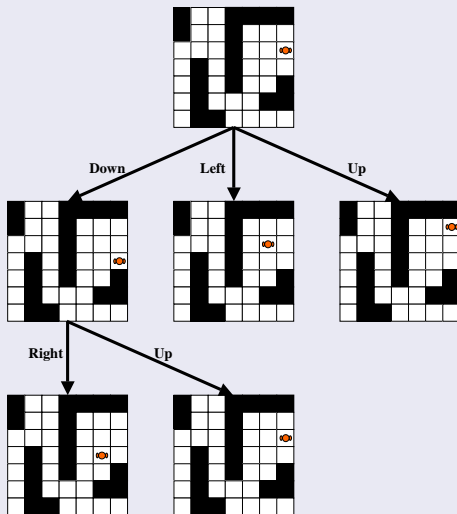
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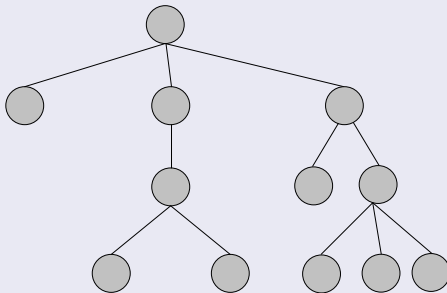
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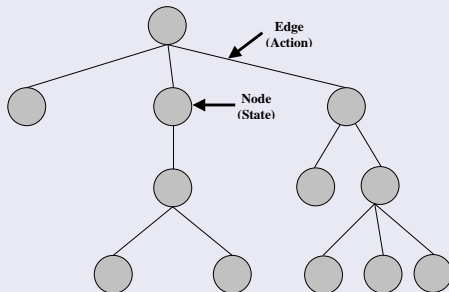
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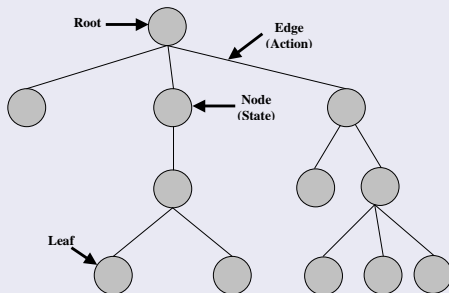
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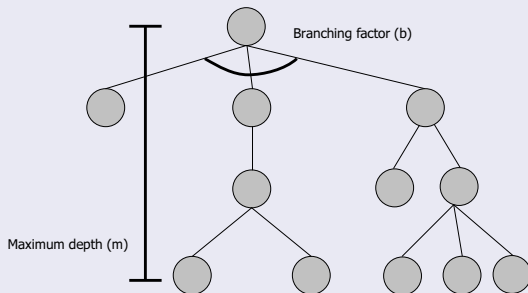
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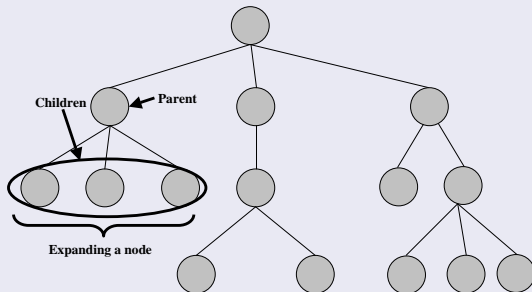
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General tree-search algorithm

TREE-SEARCH(*problem*) **returns** a solution, or failure

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General tree-search algorithm

TREE-SEARCH(*problem*) **returns** a solution, or failure
initialize the frontier using the initial state of a *problem*

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General tree-search algorithm

```
TREE-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  loop do
    if the frontier is empty then return failure
```

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General tree-search algorithm

```
TREE-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
```

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General tree-search algorithm

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TREE-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
```

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TREE-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    expand the chosen node, adding the resulting node to the frontier
  end
```

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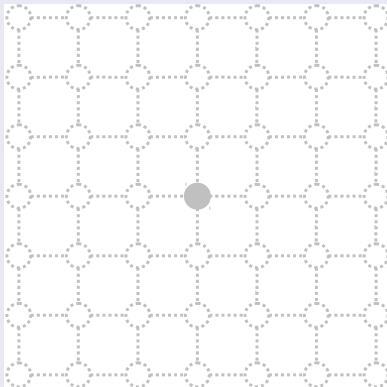
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Tree-Search on a rectangular grid problem



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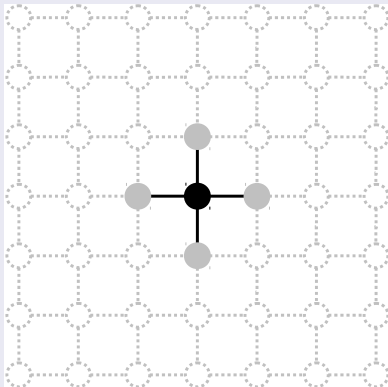
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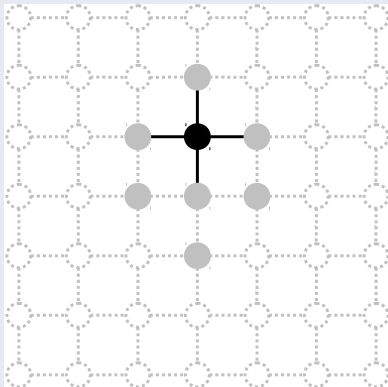
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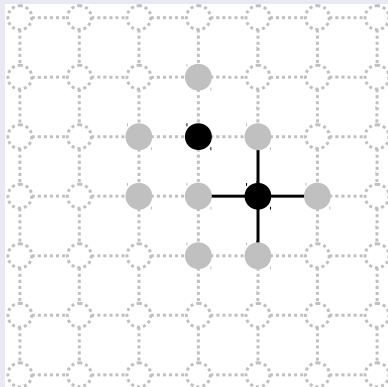
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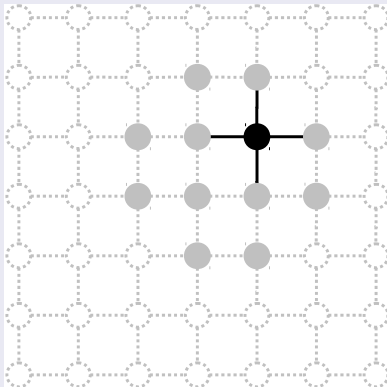
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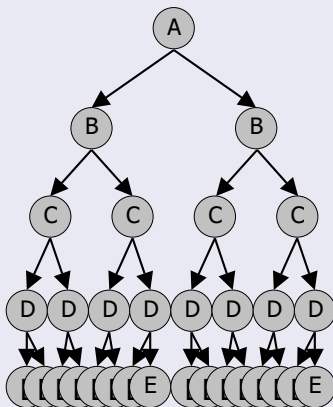
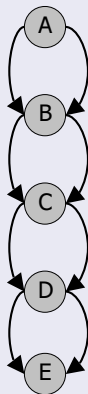
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Multiple paths to the same state



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Repeated states

- Unavoidable in problems where:
 - Actions are reversible (*e.g.*, , rectangular grid problems).
 - Multiple paths to the same state are possible.

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Repeated states

- Unavoidable in problems where:
 - Actions are reversible (*e.g.*, , rectangular grid problems).
 - Multiple paths to the same state are possible.
- Can greatly increase the number of nodes in a tree or even make a finite tree infinite.

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Repeated states

- Unavoidable in problems where:
 - Actions are reversible (*e.g.*, , rectangular grid problems).
 - Multiple paths to the same state are possible.
- Can greatly increase the number of nodes in a tree or even make a finite tree infinite.
- Can be solved by augmenting the tree search algorithm with a data structure called the **explored set** (a.k.a., the closed list) to keep track of the explored states.

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Repeated states

- Unavoidable in problems where:
 - Actions are reversible (*e.g.*, , rectangular grid problems).
 - Multiple paths to the same state are possible.
- Can greatly increase the number of nodes in a tree or even make a finite tree infinite.
- Can be solved by augmenting the tree search algorithm with a data structure called the **explored set** (a.k.a., the closed list) to keep track of the explored states.
- The tree search algorithm becomes a graph search algorithm.

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General graph-search algorithm

GRAPH-SEARCH(*problem*) **returns** a solution, or failure
initialize the frontier using the initial state of a *problem*

...

loop do

if the frontier is empty **then return** failure

 choose a leaf node and remove it from the frontier

if the node contains a goal state **then return** the corresponding solution

 ...

 expand the chosen node, adding the resulting node to the frontier

 ...

end

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General graph-search algorithm

```
GRAPH-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  initialize the explored set to be empty
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    ...
    expand the chosen node, adding the resulting node to the frontier
    ...
  end
```

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General graph-search algorithm

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GRAPH-SEARCH(problem) returns a solution, or failure
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  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    add the node to the explored set
    expand the chosen node, adding the resulting node to the frontier
    ...
  end
```

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General graph-search algorithm

```
GRAPH-SEARCH(problem) returns a solution, or failure
  initialize the frontier using the initial state of a problem
  initialize the explored set to be empty
  loop do
    if the frontier is empty then return failure
    choose a leaf node and remove it from the frontier
    if the node contains a goal state then return the corresponding solution
    add the node to the explored set
    expand the chosen node, adding the resulting node to the frontier
    only if not in the frontier and not in the explored set
  end
```

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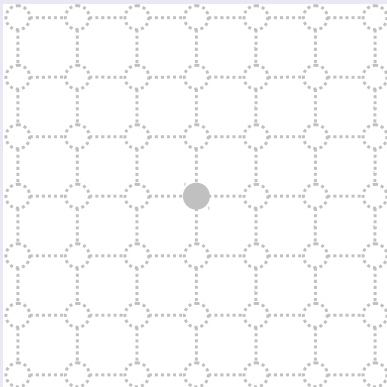
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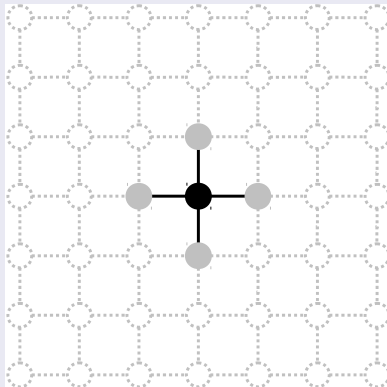
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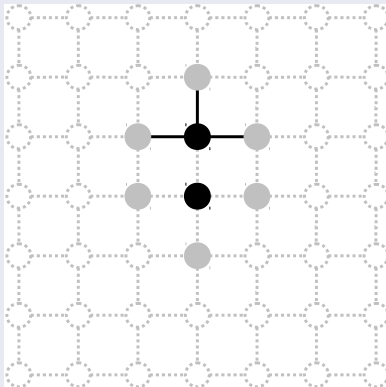
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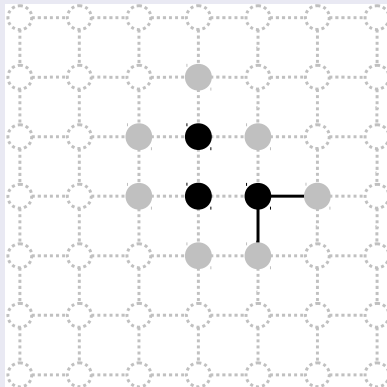
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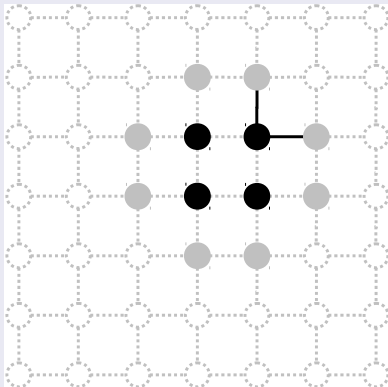
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Properties of search algorithms

- The method in which a search algorithm **traverses** the tree is known as the ***search strategy***.

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Properties of search algorithms

- The method in which a search algorithm **traverses** the tree is known as the ***search strategy***.
- The ***search strategy*** is defined by the method used by the algorithm for ***choosing*** the next node from the frontier (a.k.a., fringe or open list).

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Properties of search algorithms

- **Completeness:**

Is the algorithm guaranteed to find a goal node, if one exists?

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Properties of search algorithms

- **Completeness:**

Is the algorithm guaranteed to find a goal node, if one exists?

- **Optimality:**

Is the algorithm guaranteed to find the best goal node, i.e. the one with the cheapest path cost?

Search Algorithms

Properties of search algorithms

- **Completeness:**

Is the algorithm guaranteed to find a goal node, if one exists?

- **Optimality:**

Is the algorithm guaranteed to find the best goal node, i.e. the one with the cheapest path cost?

- **Time complexity:**

How many nodes are generated?

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Properties of search algorithms

- **Completeness:**

Is the algorithm guaranteed to find a goal node, if one exists?

- **Optimality:**

Is the algorithm guaranteed to find the best goal node, i.e. the one with the cheapest path cost?

- **Time complexity:**

How many nodes are generated?

- **Space complexity:**

What is the maximum number of nodes stored in memory?

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Properties of search algorithms

Time and space complexities are measured in terms of:

- Branching factor, b ,

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Properties of search algorithms

Time and space complexities are measured in terms of:

- Branching factor, b ,
- Depth of least cost solution , d ,

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Properties of search algorithms

Time and space complexities are measured in terms of:

- Branching factor, b ,
- Depth of least cost solution , d ,
- Maximum depth of the search tree, m ,

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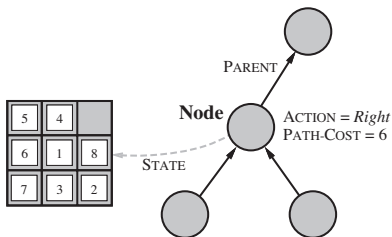
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Search Algorithms

Infrastructure for search algorithms

- Special data structures are needed to represent: the **problem**, the **nodes**, the **frontier**, and the **explored** states.



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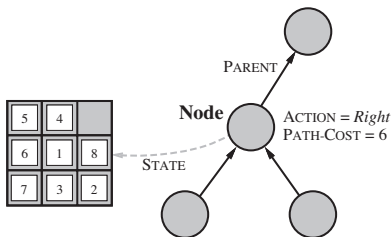
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Search Algorithms

Infrastructure for search algorithms

- Special data structures are needed to represent: the **problem**, the **nodes**, the **frontier**, and the **explored** states.
- Each node n has the following components:
 - $n.STATE$, $n.PARENT$, $n.ACTION$, $n.PATH-COST$,
 $n.CHILD-NODE(problem, action)$, and $n.SOLUTION()$



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Infrastructure for search algorithms

- Each problem p has the following components:
 - p .INITIAL-STATE, p .ACTIONS($state$), p .RESULT($state$, $action$), p .GOAL-TEST($state$), p .STEP-COST($state$, $action$).

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Infrastructure for search algorithms

- Each problem p has the following components:
 - p .INITIAL-STATE, p .ACTIONS($state$), p .RESULT($state$, $action$), p .GOAL-TEST($state$), p .STEP-COST($state$, $action$).
- Frontier f is represented as a (FIFO, LIFO, or priority) queue that has the following components:
 - f .EMPTY?(), f .INSERT($element$), and f .POP()

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Infrastructure for search algorithms

- Each problem p has the following components:
 - p .INITIAL-STATE, p .ACTIONS($state$), p .RESULT($state$, $action$), p .GOAL-TEST($state$), p .STEP-COST($state$, $action$).
- Frontier f is represented as a (FIFO, LIFO, or priority) queue that has the following components:
 - f .EMPTY?(), f .INSERT($element$), and f .POP()
- Explored states are kept track of using a data structure that acts as a set.

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Types of search algorithms

- **Uninformed Search:**

Only has the information provided by the problem formulation (initial state, available actions, transition model, goal test, and step/path cost),

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Types of search algorithms

- **Uninformed Search:**

Only has the information provided by the problem formulation (initial state, available actions, transition model, goal test, and step/path cost),

- **Informed Search:**

Has additional information that allows it to judge the promise of an action, i.e. the estimated cost from a state to a goal.

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Uninformed Search algorithms

- Breadth-first search (BFS),
- Uniform-cost search,
- Depth-first search (DFS),
- Depth-limited search,
- Iterative deepening search (IDS),

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- The frontier is implemented as a FIFO queue,
- The tree is traversed on a level-by-level basis.

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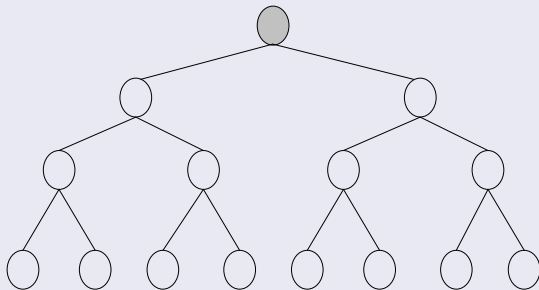
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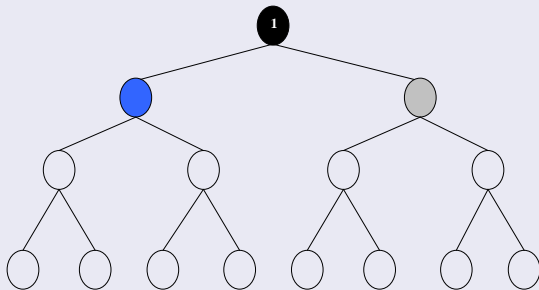
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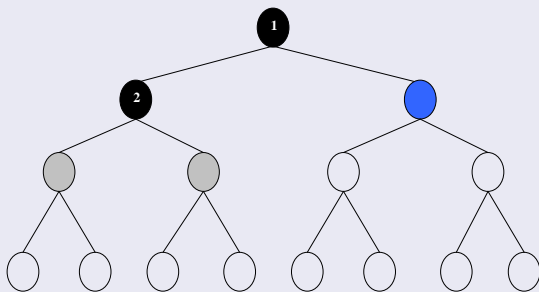
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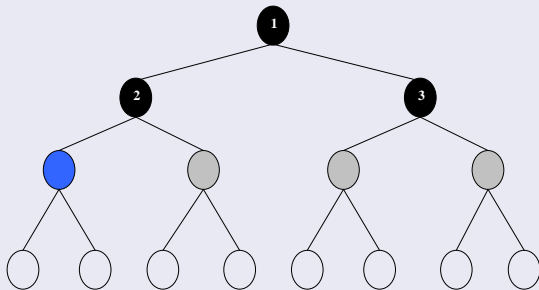
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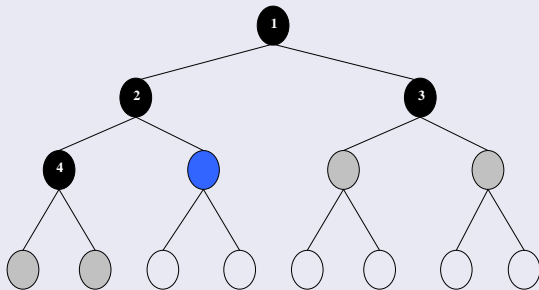
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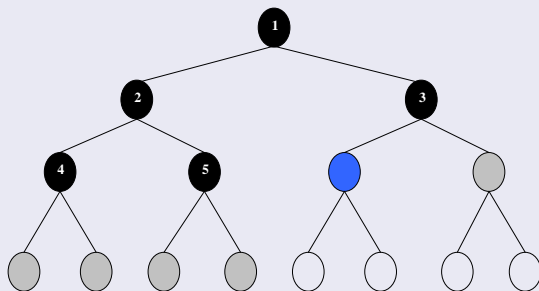
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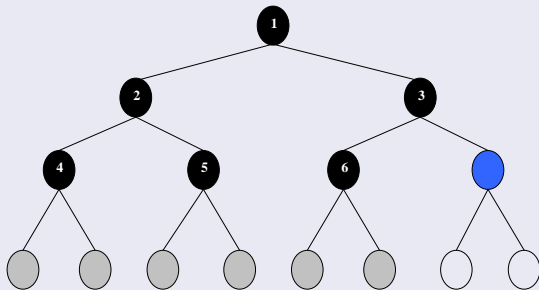
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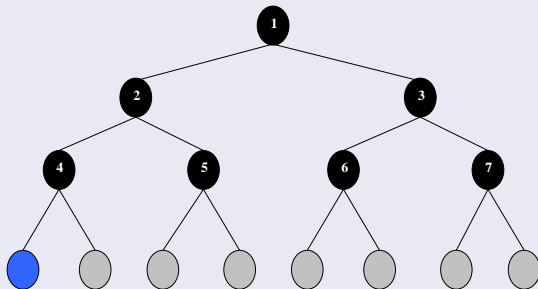
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Breadth-first search (tree version)

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure

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Breadth-first search (tree version)

function BREADTH-FIRST-SEARCH(*problem*) **returns** a solution, or failure
node \leftarrow a node with STATE=*problem*.INITIAL-STATE, PATH-COST=0

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Breadth-first search (tree version)

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure  
  node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0  
  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
```

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Breadth-first search (tree version)

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function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure  
  node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0  
  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()  
  frontier ← a FIFO queue with node as the only element
```

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function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
    node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0
    if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
    frontier ← a FIFO queue with node as the only element
    loop do
```

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Breadth-first search (tree version)

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
    node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0
    if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
    frontier ← a FIFO queue with node as the only element
    loop do
        if frontier.EMPTY?() then return failure
```

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Breadth-first search (tree version)

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
  node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0
  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
  frontier ← a FIFO queue with node as the only element
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()          /* choose shallowest node in frontier */
```

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Breadth-first search (tree version)

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  frontier ← a FIFO queue with node as the only element
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()           /* choose shallowest node in frontier */
    for each action in problem.ACTIONS(node.STATE) do
```

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  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
  frontier ← a FIFO queue with node as the only element
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()           /* choose shallowest node in frontier */
    for each action in problem.ACTIONS(node.STATE) do
      child ← node.CHILD-NODE(problem,varaction)
```

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  frontier ← a FIFO queue with node as the only element
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()           /* choose shallowest node in frontier */
    for each action in problem.ACTIONS(node.STATE) do
      child ← node.CHILD-NODE(problem, action)
      if problem.GOAL-TEST(child.STATE) then return child.SOLUTION()
```

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Breadth-first search (tree version)

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
  node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0
  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
  frontier ← a FIFO queue with node as the only element
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()          /* choose shallowest node in frontier */
    for each action in problem.ACTIONS(node.STATE) do
      child ← node.CHILD-NODE(problem, action)
      if problem.GOAL-TEST(child.STATE) then return child.SOLUTION()
      frontier.INSERT(child)
```

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Breadth-first search (graph version)

```
function BREADTH-FIRST-SEARCH(problem) returns a solution, or failure
  node ← a node with STATE=problem.INITIAL-STATE, PATH-COST=0
  if problem.GOAL-TEST(node.STATE) then return node.SOLUTION()
  frontier ← a FIFO queue with node as the only element
  explored ← an empty set
  loop do
    if frontier.EMPTY?() then return failure
    node ← frontier.POP()          /* choose shallowest node in frontier */
    add node.STATE to explored
    for each action in problem.ACTIONS(node.STATE) do
      child ← node.CHILD-NODE(problem, action)
      if child.STATE is not in explored and not in frontier then
        if problem.GOAL-TEST(child.STATE) then return child.SOLUTION()
        frontier.INSERT(child)
```

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BFS properties:

- Complete (if b is finite).

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 - Guaranteed to return the shallowest goal (depth d).

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- Space complexity = $O(b^d)$.

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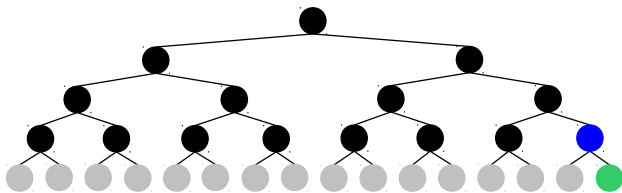
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BFS properties:

- Upper-bound case: when the goal node is the last node at depth d :

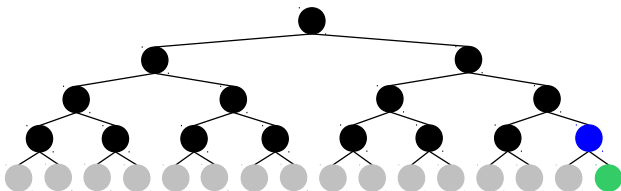


Uninformed Search

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BFS properties:

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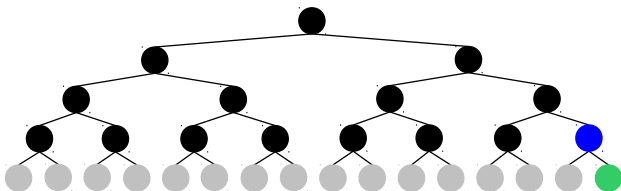


Uninformed Search

Breadth-first search

BFS properties:

- Upper-bound case: when the goal node is the last node at depth d :
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$$b + b^2 + b^3 + \dots + b^d = O(b^d).$$

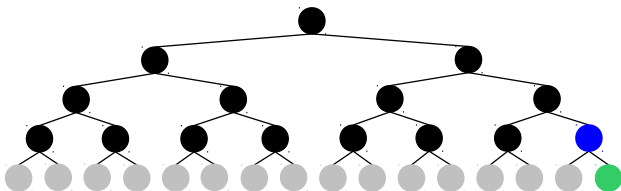


Uninformed Search

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BFS properties:

- Upper-bound case: when the goal node is the last node at depth d :
 - Goal is detected once goal node is generated.
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 $b + b^2 + b^3 + \dots + b^d = O(b^d)$.
 - Space and time complexity: all generated nodes.



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Requirements

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 - What is the goal test?
 - What is the step cost as well as the path cost?

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- Build the search tree up to a given depth.

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- Traverse the search tree according to a given strategy.

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 - What is the goal test?
 - What is the step cost as well as the path cost?
- Build the search tree up to a given depth.
- Traverse the search tree according to a given strategy.
- Answer descriptive questions.

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Reading Material

Which parts of the textbook are covered

- Russell-Norvig, Chapters 3:
 - Pages 64 - 83.