

## ARTIFICIAL INTELLIGENCE

**UNIT - I** Introduction: AI problems, Agents and Environments, Structure of Agents, Problem Solving Agents Basic Search Strategies: Problem Spaces, Uninformed Search (Breadth-First, Depth-First Search, Depth-first with Iterative Deepening), Heuristic Search (Hill Climbing, Generic Best-First, A\*), Constraint Satisfaction (Backtracking, Local Search)

### What is Artificial Intelligence?



**Intelligence is the capability of someone to understand a problem, gather data related to it and take a decision to solve it.** Humans are intelligent. Animals are intelligent too, but quite lesser than humans. Are machines intelligent too?

Some of them are, and that ability of machines to make decisions is called Artificial Intelligence. Whenever people hear the term AI, they immediately make a mental picture of "The Terminator". First of all, HE is not AI, his CPU or brain is AI, i.e. **"The Terminator HAS Artificial Intelligence"**

In today's world, technology is growing very fast, and we are getting in touch with different new technologies day by day.

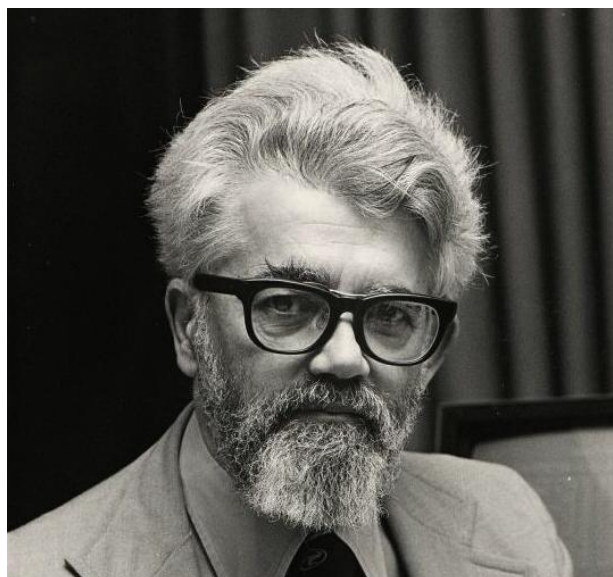
Here, one of the booming technologies of computer science is Artificial Intelligence which is ready to create a new revolution in the world by making intelligent machines. The Artificial Intelligence is now all around us. It is currently working with a variety of subfields, ranging from general to specific, **such as self-driving cars, playing chess, proving theorems, playing music, Painting, etc.**

AI is one of the fascinating and universal fields of Computer science which has a great scope in future. AI holds a tendency to cause a machine to work as a human.

Artificial Intelligence is composed of two words **Artificial** and **Intelligence**, where **Artificial** defines "*man-made*," and **intelligence** defines "*thinking power*", hence **AI means "a man-made thinking power."**

**"It is a branch of computer science by which we can create intelligent machines which can behave like a human, think like humans, and able to make decisions."**

According to the father of Artificial Intelligence, **John McCarthy**, it is "*The science and engineering of making intelligent machines, especially intelligent computer programs*".



Artificial Intelligence is a way of **making a computer, a computer-controlled robot, or a software think intelligently**, in the similar manner the intelligent humans think.

AI is accomplished by studying how human brain thinks and how humans learn, decide, and work while trying to solve a problem, and then using the outcomes of this study as a basis of developing intelligent software and systems.

### Why Artificial Intelligence?

Before Learning about Artificial Intelligence, we should know that what is the importance of AI and why should we learn it. Following are some main reasons to learn about AI:

- With the help of AI, you can create such software or devices which **can solve real-world problems very easily and with accuracy** such as health issues, marketing, traffic issues, etc.
- With the help of AI, you can create your **personal virtual Assistant**, such as Cortana, Google Assistant, Siri, etc.
- With the help of AI, you can build such **Robots** which can work in an environment where **survival of humans can be at risk**.

### Goals of AI

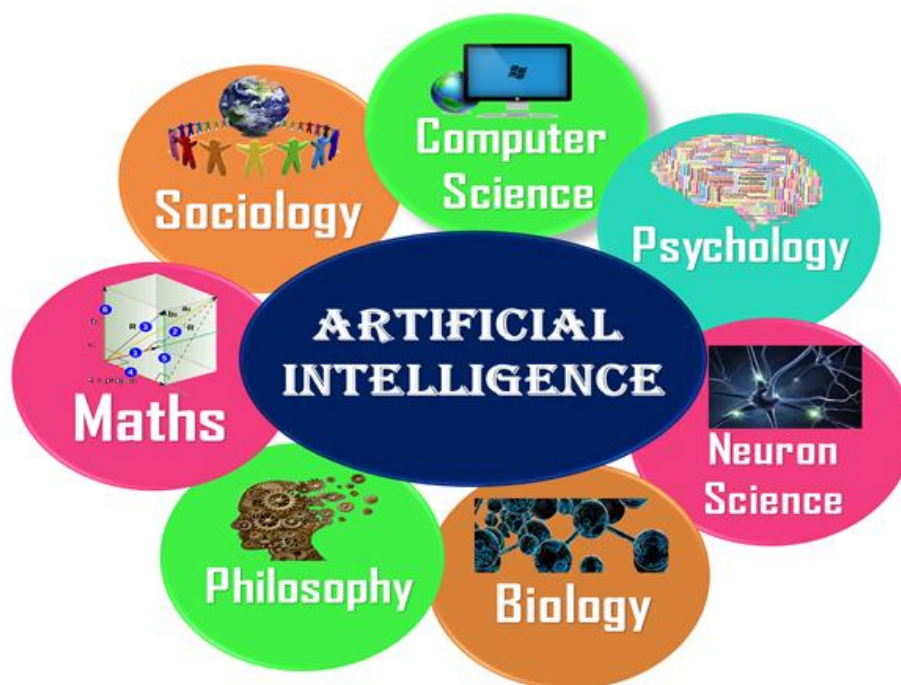
1. Replicate human intelligence
2. Solve Knowledge-intensive tasks
3. An intelligent connection of perception and action
4. Building a machine which can perform tasks that requires human intelligence such as:
  - Proving a theorem
  - Playing chess
  - Plan some surgical operation
  - Driving a car in traffic
5. Creating some system which can exhibit intelligent behavior, learn new things by itself, demonstrate, explain, and can advise to its user.

## What Comprises to Artificial Intelligence?

Artificial Intelligence is not just a part of computer science even it's so vast and requires lots of other factors which can contribute to it. To create the AI first we should know that how intelligence is composed, so the Intelligence is an intangible part of our brain which is a combination of **Reasoning, learning, problem-solving perception, language understanding, etc.**

To achieve the above factors for a machine or software Artificial Intelligence requires the following discipline:

- Mathematics
- Biology
- Psychology
- Sociology
- Computer Science
- Neurons Study
- Statistics



## Advantages of Artificial Intelligence

Following are some main advantages of Artificial Intelligence:

- **High Accuracy with less errors:** AI machines or systems are prone to less errors and high accuracy as it takes decisions as per pre-experience or information.
- **High-Speed:** AI systems can be of very high-speed and fast-decision making, because of that AI systems can beat a chess champion in the Chess game.
- **High reliability:** AI machines are highly reliable and can perform the same action multiple times with high accuracy.
- **Useful for risky areas:** AI machines can be helpful in situations such as defusing a bomb, exploring the ocean floor, where to employ a human can be risky.
- **Digital Assistant:** AI can be very useful to provide digital assistant to the users such as AI technology is currently used by various E-commerce websites to show the products as per customer requirement.
- **Useful as a public utility:** AI can be very useful for public utilities such as a self-driving car which can make our journey safer and hassle-free, facial recognition for security purpose, Natural language processing to communicate with the Machine in human-language, etc.



## Application of AI

Artificial Intelligence has various applications in today's society. It is becoming essential for today's time because it can solve complex problems with an efficient way in multiple industries, such as Healthcare, entertainment, finance, education, etc. AI is making our daily life more comfortable and fast.

Following are some sectors which have the application of Artificial Intelligence:



### 1. AI in Astronomy

- Artificial Intelligence can be very useful to solve complex universe problems. AI technology can be helpful for understanding the universe such as how it works, origin, etc.

### 2. AI in Healthcare

- In the last, five to ten years, AI becoming more advantageous for the healthcare industry and going to have a significant impact on this industry.
- Healthcare Industries are applying AI to make a better and faster diagnosis than humans. AI can help doctors with diagnoses and can inform when patients are worsening so that medical help can reach to the patient before hospitalization.

### **3. AI in Gaming**

- AI can be used for gaming purpose. The AI machines can play strategic games like chess, where the machine needs to think of a large number of possible places.

### **4. AI in Finance**

- AI and finance industries are the best matches for each other. The finance industry is implementing automation, chatbot, adaptive intelligence, algorithm trading, and machine learning into financial processes.

### **5. AI in Data Security**

- The security of data is crucial for every company and cyber-attacks are growing very rapidly in the digital world. AI can be used to make your data more safe and secure. Some examples such as AEG bot, AI2 Platform, are used to determine software bug and cyber-attacks in a better way.

### **6. AI in Social Media**

- Social Media sites such as Facebook, Twitter, and Snapchat contain billions of user profiles, which need to be stored and managed in a very efficient way. AI can organize and manage massive amounts of data. AI can analyze lots of data to identify the latest trends, hashtag, and requirement of different users.

### **7. AI in Travel & Transport**

- AI is becoming highly demanding for travel industries. AI is capable of doing various travel related works such as from making travel arrangement to suggesting the hotels, flights, and best routes to the customers. Travel industries are using AI-powered chatbots which can make human-like interaction with customers for better and fast response.

### **8. AI in Automotive Industry**

- Some Automotive industries are using AI to provide virtual assistant to their user for better performance. Such as Tesla has introduced TeslaBot, an intelligent virtual assistant.

- Various Industries are currently working for developing self-driven cars which can make your journey more safe and secure.

## **9. AI in Robotics:**

- Artificial Intelligence has a remarkable role in Robotics. Usually, general robots are programmed such that they can perform some repetitive task, but with the help of AI, we can create intelligent robots which can perform tasks with their own experiences without pre-programmed.
- Humanoid Robots are best examples for AI in robotics, recently the intelligent Humanoid robot named as **Erica and Sophia** has been developed which can talk and behave like humans.

## **10. AI in Entertainment**

- We are currently using some AI based applications in our daily life with some entertainment services such as **Netflix or Amazon**. With the help of ML/AI algorithms, these services **show the recommendations** for programs or shows.

## **11. AI in Agriculture**

- Agriculture is an area which requires various resources, labor, money, and time for best result. Now a day's agriculture is becoming digital, and AI is emerging in this field. Agriculture is applying AI as **agriculture robotics, solid and crop monitoring, predictive analysis**. AI in agriculture can be very helpful for farmers.

## **12. AI in E-commerce**

- AI is providing a competitive edge to the e-commerce industry, and it is becoming more demanding in the e-commerce business. AI is helping **shoppers to discover associated products with recommended size, color, or even brand.**

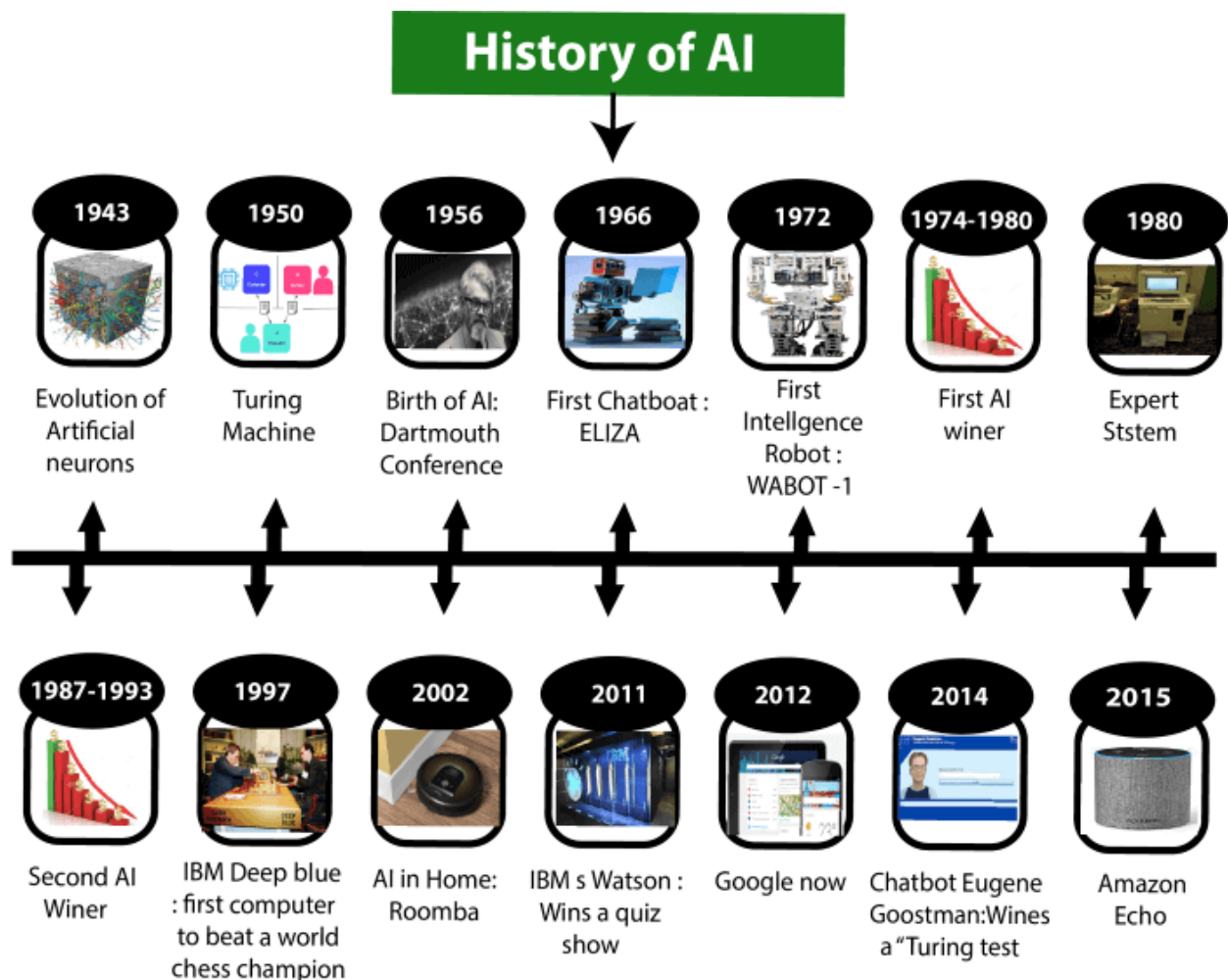
## **13. AI in education:**

- **AI can automate grading** so that the tutor can have more time to teach. AI chatbot can communicate with students as a teaching assistant.
- AI in the future can be work as a personal virtual tutor for students, which will be accessible easily at any time and any place.



## History of Artificial Intelligence

Artificial Intelligence is not a new word and not a new technology for researchers. This technology is much older than you would imagine. Even there are the myths of Mechanical men in Ancient Greek and Egyptian Myths. Following are some milestones in the history of AI which defines the journey from the AI generation to till date development.



### Maturation of Artificial Intelligence (1943-1952)

- **Year 1943:** The first work which is now recognized as AI was done by Warren McCulloch and Walter pits in 1943. They proposed a model of **artificial neurons**.
- **Year 1949:** Donald Hebb demonstrated an updating rule for modifying the connection strength between neurons. His rule is now called **Hebbian learning**.

- **Year 1950:** The Alan Turing who was an English mathematician and pioneered Machine learning in 1950. Alan Turing publishes "**Computing Machinery and Intelligence**" in which he proposed a test. The test can check the machine's ability to exhibit intelligent behavior equivalent to human intelligence, called a **Turing test**.

### The birth of Artificial Intelligence (1952-1956)

- **Year 1955:** An Allen Newell and Herbert A. Simon created the "first artificial intelligence program" which was named as "**Logic Theorist**". This program had proved 38 of 52 Mathematics theorems, and find new and more elegant proofs for some theorems.
- **Year 1956:** The word "Artificial Intelligence" first adopted by American Computer scientist John McCarthy at the Dartmouth Conference. For the first time, AI coined as an academic field.

At that time high-level computer languages such as FORTRAN, LISP, or COBOL were invented. And the enthusiasm for AI was very high at that time.

### The golden years-Early enthusiasm (1956-1974)

- **Year 1966:** The researchers emphasized developing algorithms which can solve mathematical problems. Joseph Weizenbaum created the first chatbot in 1966, which was named as ELIZA.
- **Year 1972:** The first intelligent humanoid robot was built in Japan which was named as **WABOT-1**.

## WABOT-1 ( )

- Japan (1973)
- Limbs
- Mobility Count
- Mass
- Unique Features





**Saudi Arabian citizen**

### **The first AI winter (1974-1980)**

- The duration between years 1974 to 1980 was the first AI winter duration. AI winter refers to the time period where computer scientist dealt with a severe shortage of funding from government for AI researches.
- During AI winters, an interest of publicity on artificial intelligence was decreased.

### **A boom of AI (1980-1987)**

- **Year 1980:** After AI winter duration, AI came back with "**Expert System**". Expert systems were programmed that emulate the decision-making ability of a human expert.
- In the Year 1980, the first national conference of the American Association of Artificial Intelligence **was held at Stanford University**.

### **The second AI winter (1987-1993)**

- The duration between the years 1987 to 1993 was the second AI Winter duration.
- Again Investors and government stopped in funding for AI research as due to high cost but not efficient result. The expert system such as XCON was very cost effective.

## The emergence of intelligent agents (1993-2011)

- **Year 1997:** In the year 1997, **IBM Deep Blue** beats world chess champion, **Garry Kasparov** (left hand side in the below image), and became the first computer to beat a world chess champion.



- **Year 2002:** for the first time, AI entered the home in the form of **Roomba**, a vacuum cleaner.



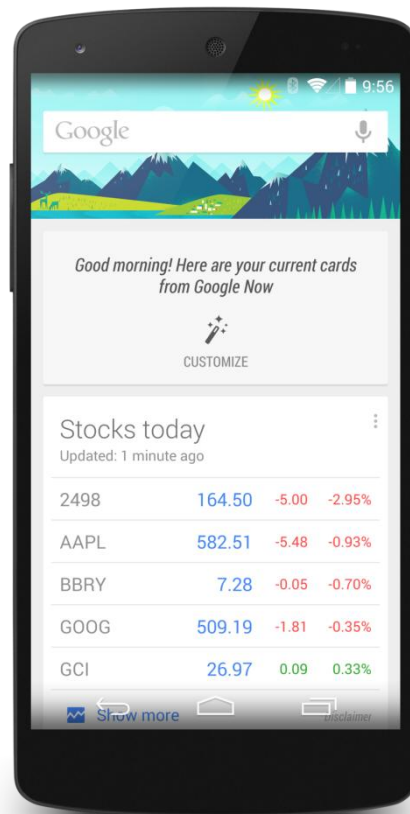
- **Year 2006:** AI came in the Business world till the year 2006. Companies like Facebook, Twitter, and Netflix also started using AI.

## Deep learning, big data and artificial general intelligence (2011-present)

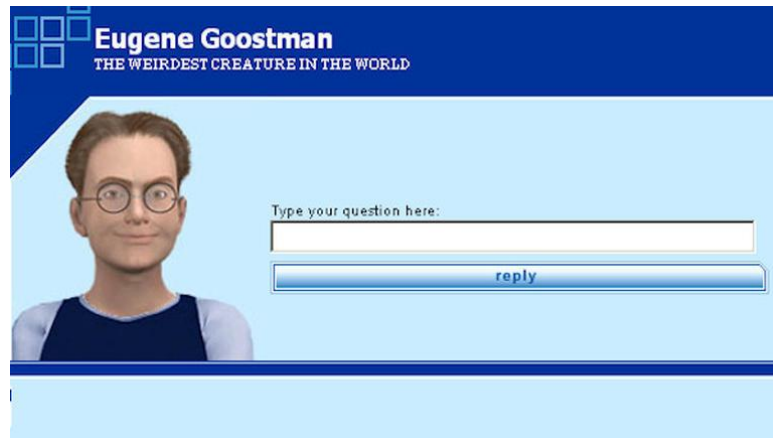
- **Year 2011:** In the year 2011, **IBM's Watson won jeopardy**, a quiz show, where it had to solve the complex questions as well as riddles. Watson had proved that it could understand natural language and can solve tricky questions quickly.



- **Year 2012:** Google has launched an Android app feature "**Google now**", which was able to provide information to the user as a prediction.

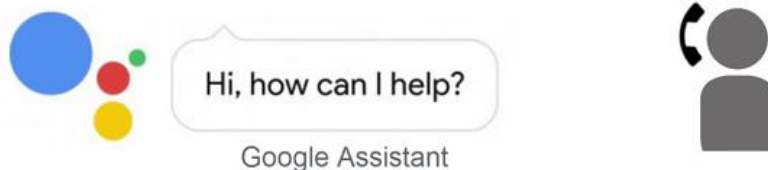


- **Year 2014:** In the year 2014, Chatbot "**Eugene Goostman**" won a competition in the famous "Turing test."



- **Year 2018:** The "Project Debater" from IBM debated on complex topics with two master debaters and also performed extremely well.
- Google has demonstrated an AI program "Duplex" which was a virtual assistant and which had taken hairdresser appointment on call, and lady on other side didn't notice that she was talking with the machine.

Google Duplex is a **technology powering a new Google Assistant feature**. Billed as a completely automated system, Google Duplex can essentially make calls for you, but with a natural-sounding human voice instead of a robotic one.



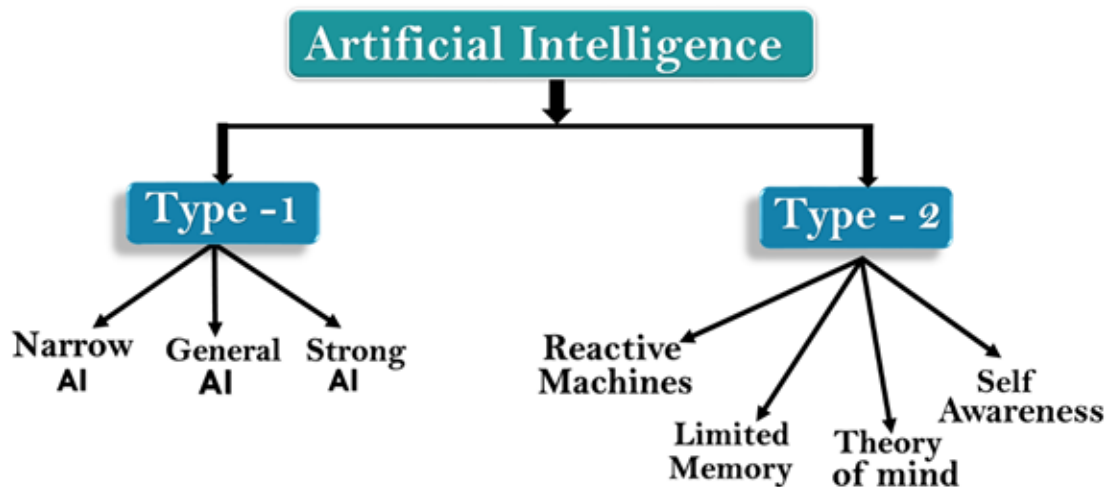
Now AI has developed to a remarkable level. The concept of **Deep learning, big data, and data science** are now trending like a boom. Nowadays companies like Google, Facebook, IBM, and Amazon are working with AI and creating



amazing devices. The future of Artificial Intelligence is inspiring and will come with high intelligence.

### Types of Artificial Intelligence:

Artificial Intelligence can be divided in various types, there are mainly two types of main categorization which are **based on capabilities** and **based on functionally of AI**. Following is flow diagram which explain the types of AI



### AI type-1: Based on Capabilities

#### 1. Weak AI or Narrow AI:

- Narrow AI is a type of AI which is able to perform a dedicated task with intelligence. The most common and currently available AI is Narrow AI in the world of Artificial Intelligence.
- **Narrow AI cannot perform beyond its field or limitations, as it is only trained for one specific task.** Hence it is also termed as weak AI. Narrow AI can fail in unpredictable ways if it goes beyond its limits.
- **Apple Siri a good example of Narrow AI**, but it operates with a limited pre-defined range of functions.
- **IBM's Watson supercomputer** also comes under Narrow AI, as it uses an Expert system approach combined with Machine learning and natural language processing.

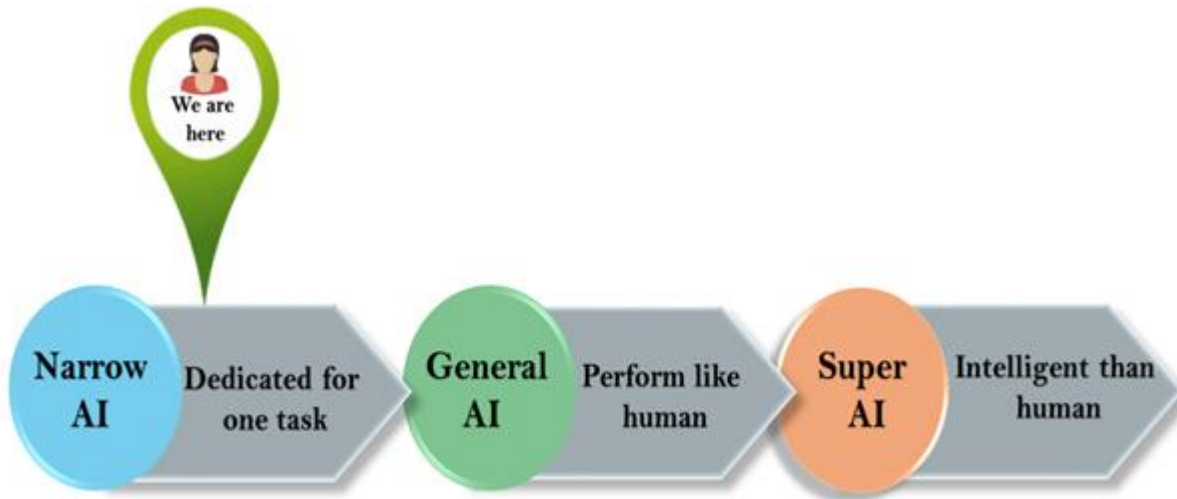
- Some Examples of Narrow AI are playing chess, purchasing suggestions on e-commerce site, self-driving cars, speech recognition, and image recognition.

## **2. General AI:**

- General AI is a type of intelligence **which could perform any intellectual task with efficiency like a human.**
- The idea behind the general AI to make such a system which could be smarter and think like a human by its own.
- **Currently, there is no such system exist** which could come under general AI and can perform any task as perfect as a human.
- The worldwide researchers are now focused on developing machines with General AI.
- As systems with general AI are **still under research** and it will take lots of efforts and time to develop such systems.

## **3. Super AI:**

- Super AI is a level of Intelligence of Systems at which machines could **surpass human intelligence**, and can perform any task better than human with cognitive properties. It is an outcome of general AI.
- Some key characteristics of strong AI include capability include the **ability to think, to reason, solve the puzzle, make judgments, plan, learn, and communicate by its own.**
- Super AI is still a hypothetical concept of Artificial Intelligence. Development of such systems in real is still world changing task.



## Artificial Intelligence type-2: Based on functionality

### 1. Reactive Machines

- Purely reactive machines are the most basic types of Artificial Intelligence.
- Such AI systems do not store memories or past experiences for future actions.
- These machines only focus on current scenarios and react on it as per possible best action.
- **IBM's Deep Blue system** is an example of reactive machines.



- **Google's AlphaGo** is also an example of reactive machines.



## 2. Limited Memory

- Limited memory machines can **store past experiences or some data for a short period of time.**
- These machines can use stored data for a **limited time period only.**
- **Self-driving cars** are one of the best examples of Limited Memory systems. These cars can store **recent speed of nearby cars, the distance of other cars, speed limit,** and other information to navigate the road.



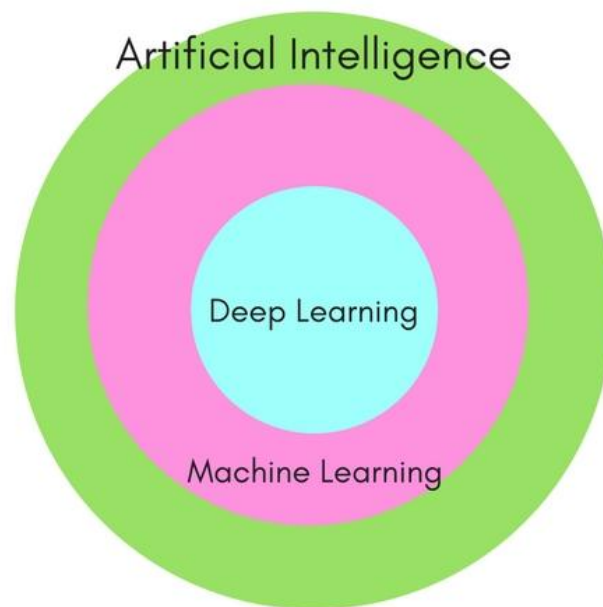
### 3. Theory of Mind

- Theory of Mind AI should understand the human emotions, people, beliefs, and be able to interact socially like humans.
- This type of AI machines are **still not developed**, but researchers are making lots of efforts and improvement for developing such AI machines.

### 4. Self-Awareness

- Self-awareness AI is the future of Artificial Intelligence. These machines will be super intelligent, and will have their own consciousness, sentiments, and self-awareness.
- These machines will be smarter than human mind.
- **Self-Awareness AI does not exist in reality** still and it is a hypothetical concept.

### Artificial Intelligence vs. Machine Learning vs. Deep Learning: Still confused?



The short answer is that **Artificial Intelligence** is the ability of machines to think and make decisions like humans, while **Machine Learning** is one of the approaches in which AI can be achieved and **Deep Learning** is a technique for Machine Learning

For example, an ATM machine that dispenses cash doesn't require a learning process. It uses a fixed algorithm to dispense bills as per the input that you give (the amount of money you need) and the amount that it has and dispenses the right amount.

What if a new currency denomination is introduced? Does it learn by itself about it? No. You have to put it into its algorithm and then it'll work just fine.

But Facebook can identify the photos of many of your friends. You don't need to tell it the name of your friend; it automatically learns that from the data. It can even recognize them in dark photos or from multiple angles.

In a way, Facebook is intelligent enough to learn on its own! How is it possible?

It is possible through Machine Learning.

Deep learning is one of the techniques that can be used to implement machine learning. It is based on **Artificial Neural Networks**, which is our attempt at mimicking the functioning of the human brain.



## AI - Agents & Environments

An AI system is composed of an agent and its environment. The agents act in their environment. The environment may contain other agents.

### What are Agent and Environment?

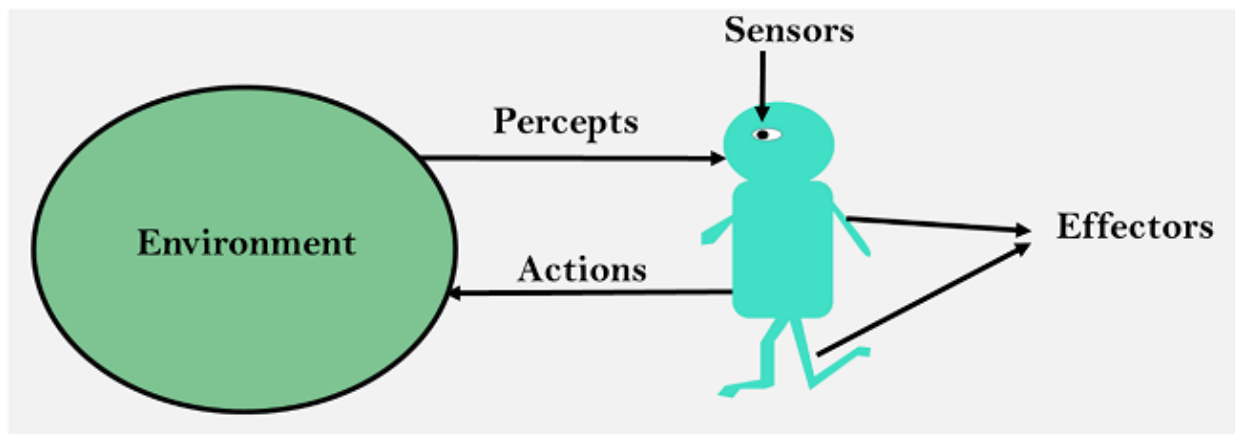
An agent is anything that can **perceive** its environment through **sensors** and acts upon that environment through **effectors**.

- A **human agent** has sensory organs such as eyes, ears, nose, tongue and skin parallel to the sensors, and other organs such as hands, legs, mouth, for effectors.
- A **robotic agent** replaces cameras and infrared range finders for the sensors, and various motors and actuators for effectors.
- A **software agent** has encoded bit strings as its programs and actions.

**Sensor:** Sensor is a device which detects the change in the environment and sends the information to other electronic devices. An agent observes its environment through sensors.

**Actuators:** Actuators are the component of machines that converts energy into motion. The actuators are only responsible for moving and controlling a system. An actuator can be an electric motor, gears, rails, etc.

**Effectors:** Effectors are the devices which affect the environment. Effectors can be legs, wheels, arms, fingers, wings, fins, and display screen.



## Agent Terminology

- **Performance Measure of Agent** – It is the criteria, which determines how successful an agent is.
- **Behavior of Agent** – It is the action that agent performs after any given sequence of percepts.
- **Percept** – It is agent's perceptual inputs at a given instance.
- **Percept Sequence** – It is the history of all that an agent has perceived till date.
- **Agent Function** – It is a map from the precept sequence to an action.

## Intelligent Agents:

An intelligent agent is an autonomous entity which acts upon an environment using sensors and actuators for achieving goals. An intelligent agent may learn from the environment to achieve their goals.

Following are the main four rules for an AI agent:

- **Rule 1:** An AI agent must have the ability to perceive the environment.
- **Rule 2:** The observation must be used to make decisions.
- **Rule 3:** Decision should result in an action.
- **Rule 4:** The action taken by an AI agent must be a rational action.

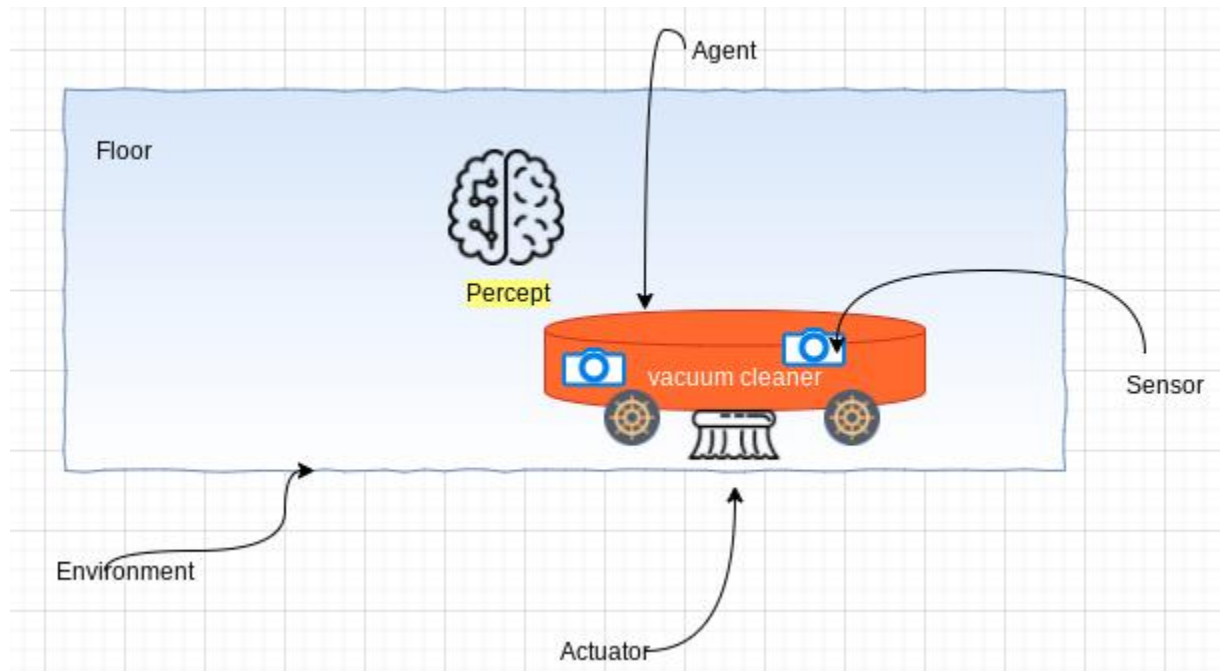
## Rational Agent:

A rational agent is an agent which has clear preference, models uncertainty, and acts in a way to maximize its performance measure with all possible actions.

A rational agent is said to perform the right things. AI is about creating rational agents to use for game theory and decision theory for various real-world scenarios.

For an AI agent, the rational action is most important because in AI reinforcement learning algorithm, for each best possible action, agent gets the positive reward and for each wrong action, an agent gets a negative reward.

- **Note:** Rational agents in AI are very similar to intelligent agents.



### Rationality:

The rationality of an agent is measured **by its performance measure**. Rationality can be judged on the basis of following points:

- Performance measure which defines the **success criterion**.
- Agent **prior knowledge** of its environment.
- **Best possible actions** that an agent can perform.
- The **sequence of percepts**.

**Note:** Rationality differs from Omniscience because an Omniscient agent knows the actual outcome of its action and act accordingly, which is not possible in reality.

## Structure of an AI Agent

The task of AI is to design an agent program which implements the agent function. The structure of an intelligent agent is a combination of architecture and agent program. It can be viewed as:

$$\text{Agent} = \text{Architecture} + \text{Agent program}$$

Following are the main three terms involved in the structure of an AI agent:

**Architecture:** **Architecture is machinery** that an AI agent executes on.

1. **Agent program:** Agent program is an **implementation of agent function**. An agent program executes on the physical architecture to produce function  $f$ .
2. **Agent Function:** Agent function is used to **map a percept to an action**.  
 $f: P^* \rightarrow A$

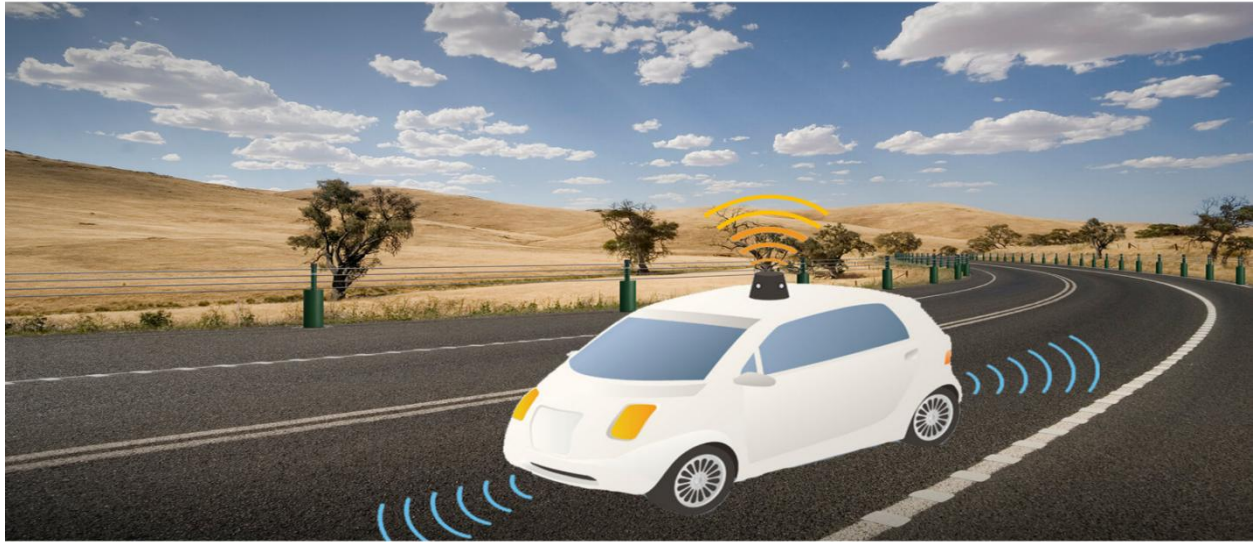
## PEAS Representation

PEAS is a type of model on which an AI agent works upon. When we define an AI agent or rational agent, then we can group its properties under PEAS representation model. It is made up of four words:

- **P:** Performance measure
- **E:** Environment
- **A:** Actuators
- **S:** Sensors

Here performance measure is the objective for the success of an agent's behavior.

## PEAS for self-driving cars



Let's suppose a self-driving car then PEAS representation will be:

**Performance:** Safety, time, legal drive

**Environment:** Roads, other vehicles, road signs

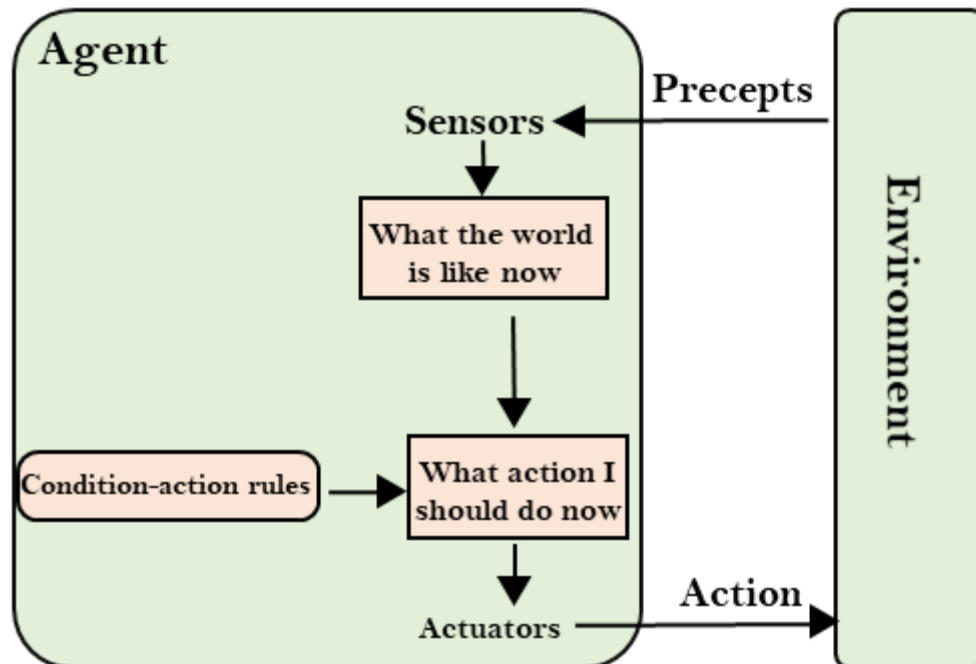
**Actuators:** Steering, accelerator, brake, horn

**Sensors:** Camera, GPS, speedometer, accelerometer

## Types of Agents:

### Simple Reflex Agents:

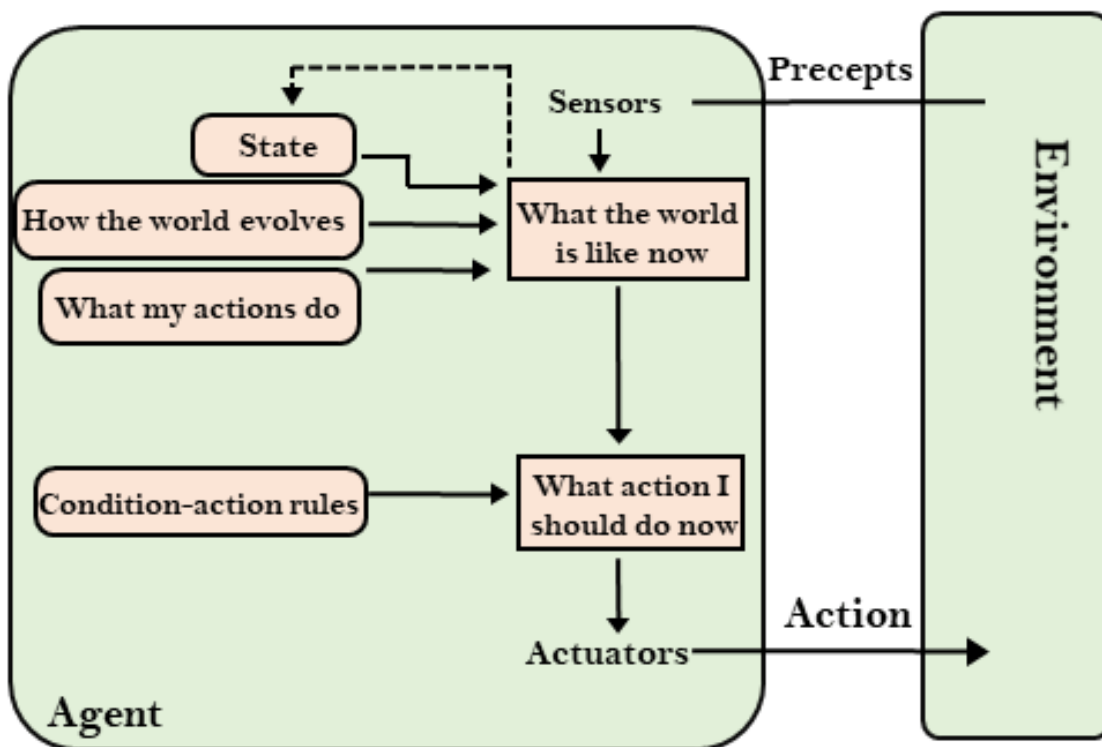
- The Simple reflex agents are the simplest agents. These agents take decisions on the basis of the **current percepts and ignore the rest of the percept history.**
- These agents only succeed in the **fully observable environment.**
- The Simple reflex agent does not consider any part of percepts history during their decision and action process.
- The Simple reflex agent works on **Condition-action rule**, which means it maps the current state to action. Such as a **Room Cleaner agent, it works only if there is dirt in the room.**
- Problems for the simple reflex agent design approach:
  - They have very limited intelligence
  - They do not have knowledge of non-perceptual parts of the current state
  - Not adaptive to changes in the environment.





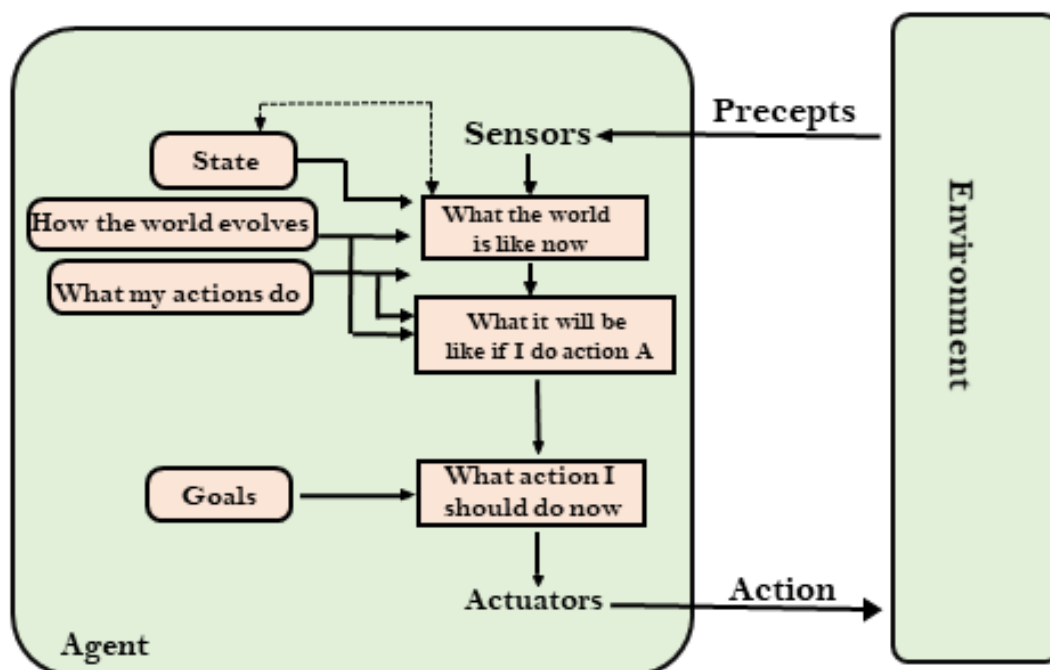
### Model Based Reflex Agents:

- The Model-based agent can work in a **partially observable environment**, and track the situation.
- A model-based agent has **two important factors**:
  - **Model**: It is knowledge about "**how things happen in the world**," so it is called a Model-based agent.
  - **Internal State**: It is a representation of the **current state** based on percept history.
- These agents have the model, "**which is knowledge of the world**" and based on the model they perform actions.
- Updating the agent state requires information about:
  - a. How the world evolves
  - b. How the agent's action affects the world.



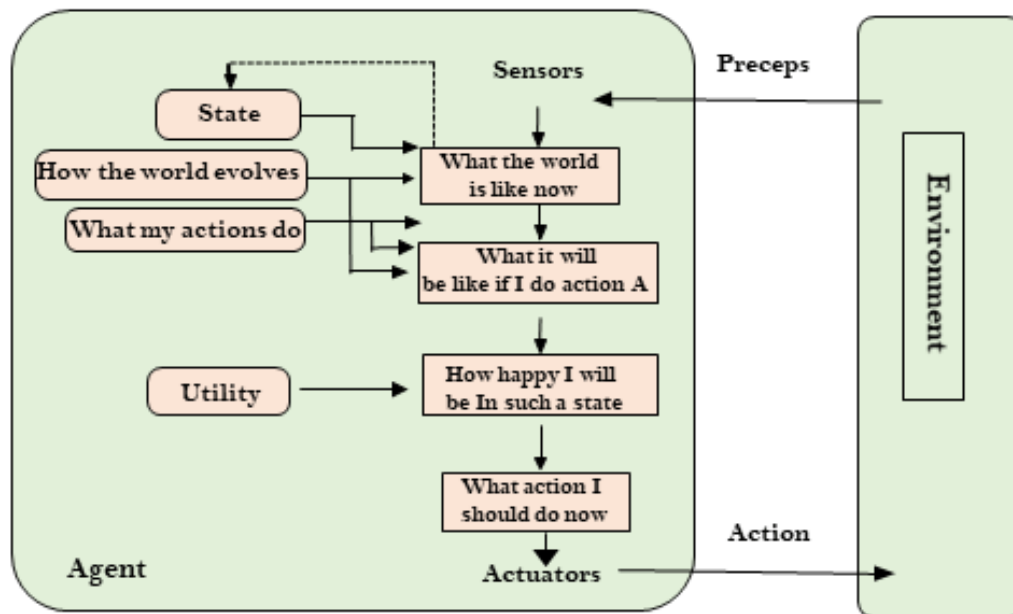
## Goal Based Agents:

- The knowledge of the current state environment is not always sufficient to decide for an agent to what to do.
- The agent needs to know its goal which describes desirable situations.
- Goal-based agents expand the capabilities of the model-based agent by having the "goal" information.
- They choose an action, so that they can achieve the goal.
- These agents may have to consider a long sequence of possible actions before deciding whether the goal is achieved or not. Such considerations of different scenario are called searching and planning, which makes an agent proactive.



## Utility Based Agents:

- These agents are similar to the goal-based agent but provide an extra component of utility measurement which makes them different by **providing a measure of success at a given state**.
- Utility-based agent act based not **only goals but also the best way to achieve the goal**.
- The Utility-based agent is useful when there are multiple possible alternatives, and an agent has to choose in order to perform the best action.
- The utility function maps each state to a real number to check **how efficiently** each action achieves the goals.



## Example of Agents with their PEAS representation

Agent	Performance measure	Environment	Actuators	Sensors
1. Medical Diagnose	<ul style="list-style-type: none"> <li>Healthy patient</li> <li>Minimized cost</li> </ul>	<ul style="list-style-type: none"> <li>Patient</li> <li>Hospital</li> <li>Staff</li> </ul>	<ul style="list-style-type: none"> <li>Tests</li> <li>Treatments</li> </ul>	Keyboard (Entry of symptoms)
2. Vacuum Cleaner	<ul style="list-style-type: none"> <li>Cleanness</li> <li>Efficiency</li> <li>Battery life</li> <li>Security</li> </ul>	<ul style="list-style-type: none"> <li>Room</li> <li>Table</li> <li>Wood floor</li> <li>Carpet</li> <li>Various obstacles</li> </ul>	<ul style="list-style-type: none"> <li>Wheels</li> <li>Brushes</li> <li>Vacuum Extractor</li> </ul>	<ul style="list-style-type: none"> <li>Camera</li> <li>Dirt detection sensor</li> <li>Cliff sensor</li> <li>Bump Sensor</li> <li>Infrared Wall Sensor</li> </ul>

## Agent Environment in AI

An environment is everything in the world which surrounds the agent, but it is not a part of an agent itself. An environment can be described as a situation in which an agent is present.

The environment is where agent lives, operate and provide the agent with something to sense and act upon it.

### Features of Environment/Types of Environments in AI

An environment in artificial intelligence is the surrounding of the agent. The agent takes input from the environment through sensors and delivers the output to the environment through actuators. There are several types of environments:

1. Fully observable vs Partially Observable
2. Static vs Dynamic
3. Discrete vs Continuous
4. Deterministic vs Stochastic
5. Single-agent vs Multi-agent
6. Episodic vs sequential

#### 1. Fully observable vs Partially Observable:

- When an agent sensor is capable to sense or access the complete state of an agent at each point in time, it is said to be a **fully observable environment** else it is partially observable.
- Maintaining a fully observable environment is easy as there is no need to keep track of the history of the surrounding.
- An environment is called **unobservable** when the agent has no sensors in all environments.
- **Example:**
  - **Chess** – the board is fully observable, so are the opponent's moves

- **Driving** – the environment is partially observable because what's around the corner is not known.

## 2. Deterministic vs Stochastic:

- When uniqueness in the agent's current state completely determines the next state of the agent, the environment is said to be deterministic.
- The stochastic environment is random in nature which is not unique and cannot be completely determined by the agent.
- **Example:**  
**Chess** – there would be only a few possible moves for a coin at the current state and these moves can be determined  
**Self Driving Cars** – the actions of a self-driving car are not unique, it varies time to time

## 3. Episodic vs Sequential:

- In an episodic environment, there is a series of one-shot actions, and only the current percept is required for the action.
- However, in Sequential environment, an agent requires memory of past actions to determine the next best actions.

## 4. Single-agent vs Multi-agent

- An environment **consisting of only one agent** is said to be a single-agent environment.
- An environment involving more than one agent is a multi-agent environment.
- The game of football is multi-agent as it involves 11 players in each team.



## 5. Static vs Dynamic:

- An environment that keeps constantly changing itself when the agent is up with some action is said to be dynamic.
- An idle environment with no change in its state is called a static environment.
- An empty house is static as there's no change in the surroundings when an agent enters.
- Static environments are easy to deal because an agent does not need to continue looking at the world while deciding for an action.
- However for dynamic environment, agents need to keep looking at the world at each action.
- Taxi driving is an example of a dynamic environment whereas Crossword puzzles are an example of a static environment.
- A roller coaster ride is dynamic as it is set in motion and the environment keeps changing every instant.



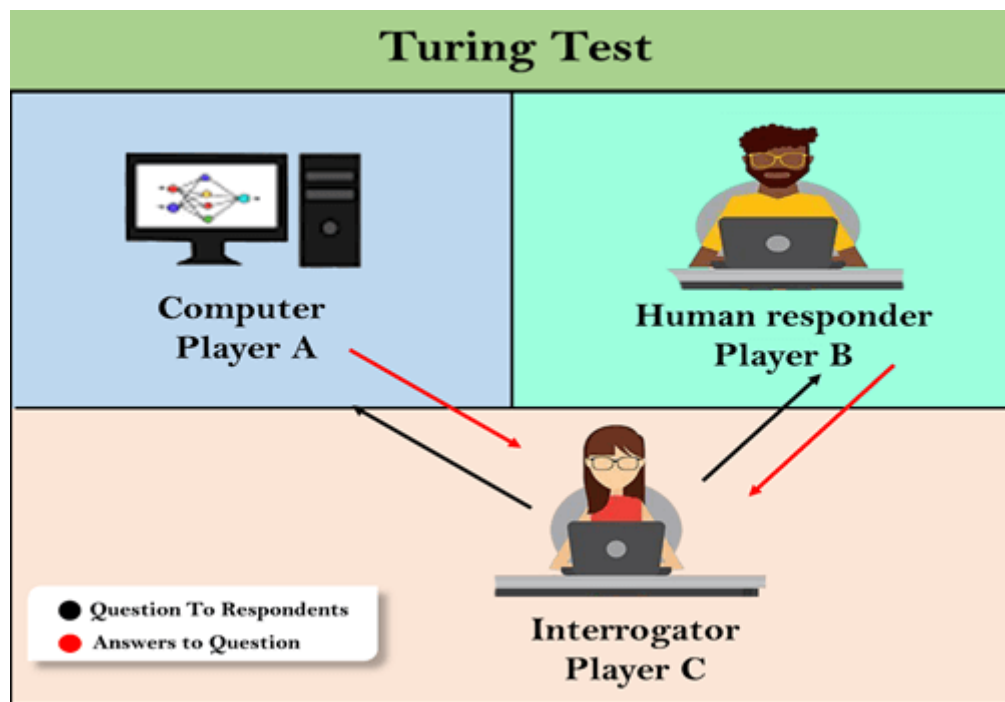
## 6. Discrete vs Continuous:

- If an environment consists of a finite number of actions that can be deliberated in the environment to obtain the output, it is said to be a discrete environment.
- The game of chess is discrete as it has only a finite number of moves. The number of moves might vary with every game, but still, it's finite.
- The environment in which the actions performed cannot be numbered ie. is not discrete, is said to be continuous.
- Self-driving cars are an example of continuous environments as their actions is driving, parking, etc. which cannot be numbered.

## Turing Test in AI

In 1950, Alan Turing introduced a test **to check whether a machine can think like a human or not**, this test is known as the Turing Test. In this test, Turing proposed that the computer can be said to be an intelligent if it can mimic human response under specific conditions.

Turing Test was introduced by Turing in his 1950 paper, "**Computing Machinery and Intelligence**," which considered the question, "**Can Machine think?**"



The Turing test is based on a party game "**Imitation game**," with some modifications. This game involves three players in which one player is Computer, another player is human responder, and the third player is a human Interrogator, who is isolated from other two players and his job is to **find that which player is machine among two of them.**

Consider, Player A is a computer, Player B is human, and Player C is an interrogator. **Interrogator is aware that one of them is machine**, but he needs to identify this on the basis of questions and their responses.

The conversation between all players is via keyboard and screen so the result would not depend on the machine's ability to convert words as speech.

The test result **does not depend on each correct answer, but only how closely its responses like a human answer**. The computer is permitted to do everything possible to force a wrong identification by the interrogator.

The questions and answers can be like:

**Interrogator:** Are you a computer?

**PlayerA (Computer):** No

**Interrogator:** Multiply two large numbers such as (256896489\*456725896)

**Player A:** Long pause and give the wrong answer.

In this game, if an interrogator would not be able to identify which is a machine and which is human, then the computer passes the test successfully, and the machine is said to be intelligent and can think like a human.

"In 1991, the New York businessman Hugh Loebner announces the prize competition, offering a \$100,000 prize for the first computer to pass the Turing test. However, no AI program to till date, come close to passing an undiluted Turing test".

Chatbots to attempt the Turing test:

**ELIZA:** ELIZA was a Natural language processing computer program created by Joseph Weizenbaum. It was created to demonstrate the ability of communication between machine and humans. It was one of the first chatterbots, which has attempted the Turing Test.

**Parry:** Parry was a chatterbot created by Kenneth Colby in 1972. Parry was designed to simulate a person with **Paranoid schizophrenia**(most common chronic mental disorder). Parry was described as "ELIZA with attitude." Parry was tested using a variation of the Turing Test in the early 1970s.

**Eugene Goostman:** Eugene Goostman was a chatbot developed in Saint Petersburg in 2001. This bot has competed in the various number of Turing Test. In June 2012, at an event, Goostman won the competition promoted as largest-ever Turing test content, in which it has convinced 29% of judges that it was a human.Goostman resembled as a 13-year old virtual boy.

## The Chinese Room Argument:

There were many philosophers **who really disagreed** with the complete concept of **Artificial Intelligence**. The most famous argument in this list was "**Chinese Room**."

In the year **1980**, **John Searle** presented "**Chinese Room**" thought experiment, in his paper "**Mind, Brains, and Program**," which was against the validity of Turing's Test. According to his argument, "**Programming a computer may make it to understand a language, but it will not produce a real understanding of language or consciousness in a computer.**"

He argued that Machine such as ELIZA and Parry could easily pass the Turing test by **manipulating keywords and symbol**, but they had no real understanding of language. So it **cannot be described as "thinking"** capability of a machine such as a human.

## Features required for a machine to pass the Turing test:

- **Natural language processing:** NLP is required to communicate with Interrogator in general **human language like English**.
- **Knowledge representation:** To **store and retrieve information** during the test.
- **Automated reasoning:** To use the **previously stored information** for answering the questions.
- **Machine learning:** To **adapt new changes** and can detect generalized patterns.
- **Vision (For total Turing test):** **To recognize the interrogator actions** and other objects during a test.

## Problem-solving Agent in Artificial Intelligence

**One type of goal-based agent** known as a problem-solving agent, which uses atomic representation with no internal states visible to the *problem-solving algorithms*.

### Problem-solving agent

The problem-solving agent performs precisely by defining problems and its several solutions.

**According to psychology**, “a problem-solving refers to *a state where we wish to reach to a definite goal* from a present state or condition.”

**According to computer science**, a problem-solving is a part of artificial intelligence which encompasses *a number of techniques such as algorithms, heuristics to solve a problem*.

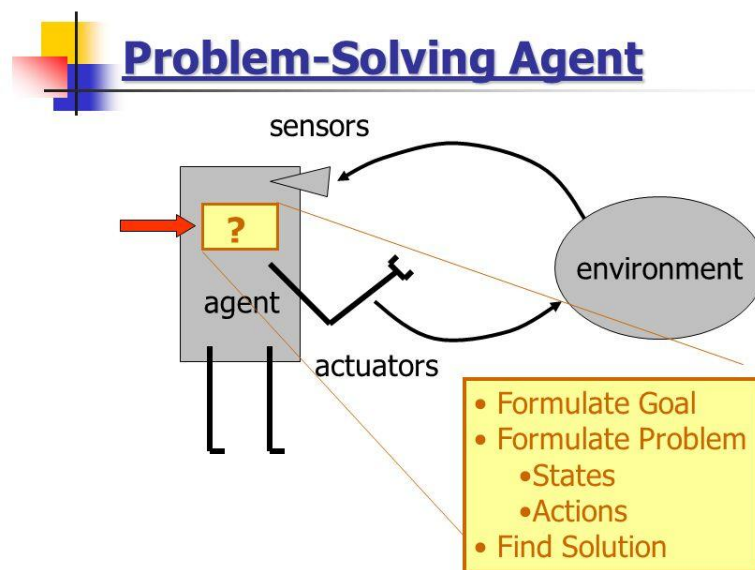
Therefore, a problem-solving agent is a **goal-driven agent** and focuses on satisfying the goal.

### Steps performed by Problem-solving agent:

- **Goal Formulation:** It is the first and simplest step in problem-solving. It *organizes the steps/sequence required* to formulate one goal out of multiple goals as well as actions to achieve that goal. Goal formulation is based on the current situation and the agent's performance measure
- **Problem Formulation:** It is the most important step of problem-solving which **decides what actions should be taken** to achieve the formulated goal. There are following *five components involved in problem formulation:*

- **Initial State:** It is the **starting state** or initial step of the agent towards its goal.
- **Actions:** It is the description of the **possible actions** available to the agent.
- **Transition Model:** It describes **what each action does**.
- **Goal Test:** It determines **if the given state is a goal state**.
- **Path cost:** It **assigns a numeric cost** to each path that follows the goal.

The problem-solving agent selects a cost function, which reflects its performance measure. Remember, **an optimal solution has the lowest path cost among all the solutions**.



5

**Note:** **Initial state**, **actions**, and **transition model** together define the **state-space** of the problem implicitly. **State-space of a problem is a set of all states which can be reached from the initial state followed by any sequence of actions.** **The state-space forms a directed map or graph** where **nodes are the states**, **links between the nodes are actions**, and the **path is a sequence of states** connected by the sequence of actions.



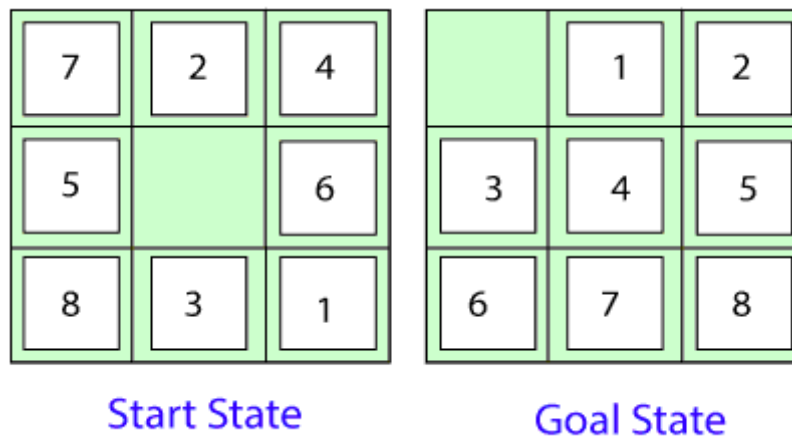
## Example Problems

Basically, there are two types of problem approaches:

- **Toy Problem:** It is a concise and exact description of the problem which is used by the researchers to compare the performance of algorithms.
- **Real-world Problem:** It is real-world based problems which require solutions. Unlike a toy problem, it does not depend on descriptions, but we can have a general formulation of the problem.

## Some Toy Problems

- **8 Puzzle Problem:** Here, we have a  $3 \times 3$  matrix with movable tiles numbered from 1 to 8 with a blank space. The tile adjacent to the blank space can slide into that space. The objective is to reach a specified goal state similar to the goal state, as shown in the below figure.
- In the figure, our task is to convert the current state into goal state by sliding digits into the blank space.

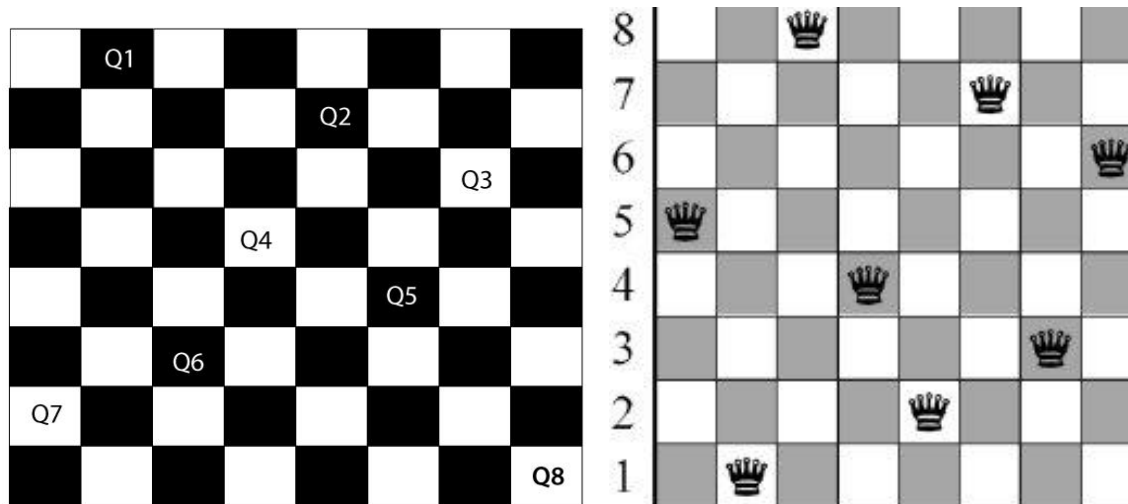


In the above figure, our task is to convert the current (Start) state into goal state by sliding digits into the blank space.

**The problem formulation is as follows:**

- **States:** It describes the location of each numbered tiles and the blank tile.
- **Initial State:** We can start from any state as the initial state.
- **Actions:** Here, actions of the blank space is defined, i.e., either **left, right, up or down**
- **Transition Model:** It returns the resulting state as per the given state and actions.
- **Goal test:** It identifies whether we have reached the correct goal-state.
- **Path cost:** The path cost is the number of steps in the path where the cost of each step is 1.

**8-queens problem:** The aim of this problem is to place eight queens on a chessboard in an order **where no queen may attack another**. A queen can attack other queens either **diagonally or in same row and column**.



**Following steps are involved in this formulation:**

- **States:** Arrangement of any 0 to 8 queens on the chessboard.
- **Initial State:** An empty chessboard
- **Actions:** Add a queen to any empty box.
- **Transition model:** Returns the chessboard with the queen added in a box.
- **Goal test:** Checks whether 8-queens are placed on the chessboard without any attack.
- **Path cost:** There is no need for path cost because only final states are counted.

## Search Algorithms in Artificial Intelligence

Search algorithms are one of the most important areas of Artificial Intelligence. This topic will explain all about the search algorithms in AI.

Problem-solving agents:

In Artificial Intelligence, Search techniques are universal problem-solving methods. **Rational agents** or **Problem-solving agents** in AI mostly used these search strategies or algorithms to solve a specific problem and provide the best result. Problem-solving agents are the goal-based agents and use atomic representation. In this topic, we will learn various problem-solving search algorithms.

### Search Algorithm Terminologies:

- **Search:** Searching is a step by step procedure to solve a search-problem in a given search space. A search problem can have three main factors:
  - a. **Search Space:** Search space represents a set of possible solutions, which a system may have.
  - b. **Start State:** It is a state from where agent begins the search.
  - c. **Goal test:** It is a function which observe the current state and returns whether the goal state is achieved or not.

**Search tree:** A tree representation of search problem is called Search tree. The root of the search tree is the root node which is corresponding to the initial state.

**Actions:** It gives the description of all the available actions to the agent.

**Transition model:** A description of what each action do, can be represented as a transition model.

**Path Cost:** It is a function which assigns a numeric cost to each path.

**Solution:** It is an action sequence which leads from the start node to the goal node.

**Optimal Solution:** If a solution has the lowest cost among all solutions.

### Properties of Search Algorithms:

Following are the four essential properties of search algorithms to compare the efficiency of these algorithms:

**Completeness:** A search algorithm is said to be complete if it guarantees to return a solution if at least any solution exists for any random input.

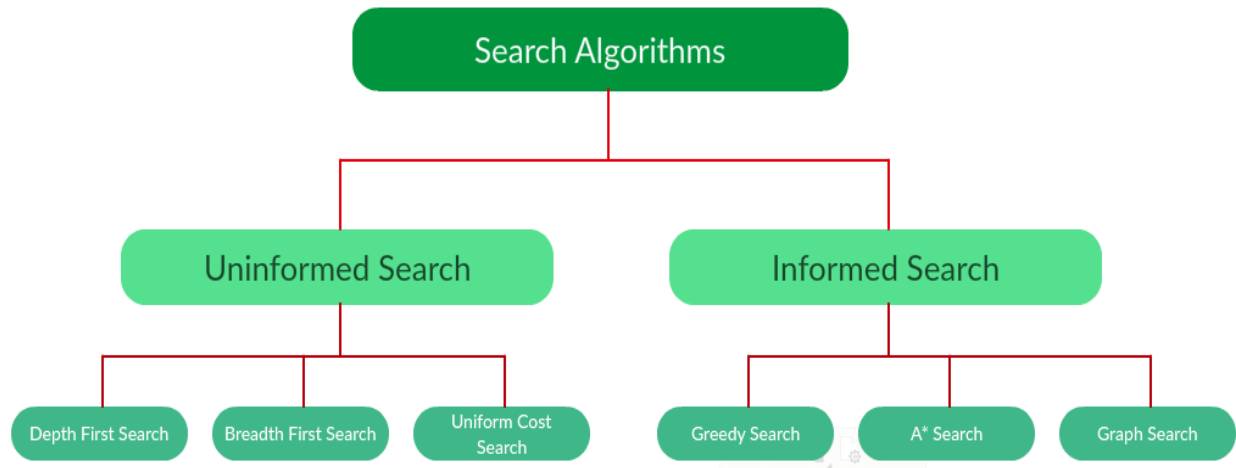
**Optimality:** If a solution found for an algorithm is guaranteed to be the best solution (lowest path cost) among all other solutions, then such a solution for is said to be an optimal solution.

**Time Complexity:** Time complexity is a measure of time for an algorithm to complete its task.

**Space Complexity:** It is the maximum storage space required at any point during the search, as the complexity of the problem.

## Types of search algorithms

Based on the search problems we can classify the search algorithms into uninformed (Blind search) search and informed search (Heuristic search) algorithms.



### Uninformed/Blind Search:

The uninformed search does **not contain any domain knowledge** such as closeness, the location of the goal. It operates in a brute-force way as it only includes information about how to traverse the tree and how to identify leaf and goal nodes. Uninformed search applies a way in which search tree is searched without any information about the search space like initial state operators and test for the goal, so it is also called blind search. It examines each node of the tree until it achieves the goal node.

#### It can be divided into five main types:

- Breadth-first search
- Uniform cost search
- Depth-first search
- Iterative deepening depth-first search
- Bidirectional Search

## Informed Search:

Informed search algorithms use **domain knowledge**. In an informed search, problem information is available which can guide the search. Informed search strategies can find a solution more efficiently than an uninformed search strategy. Informed search is **also called a Heuristic search**.

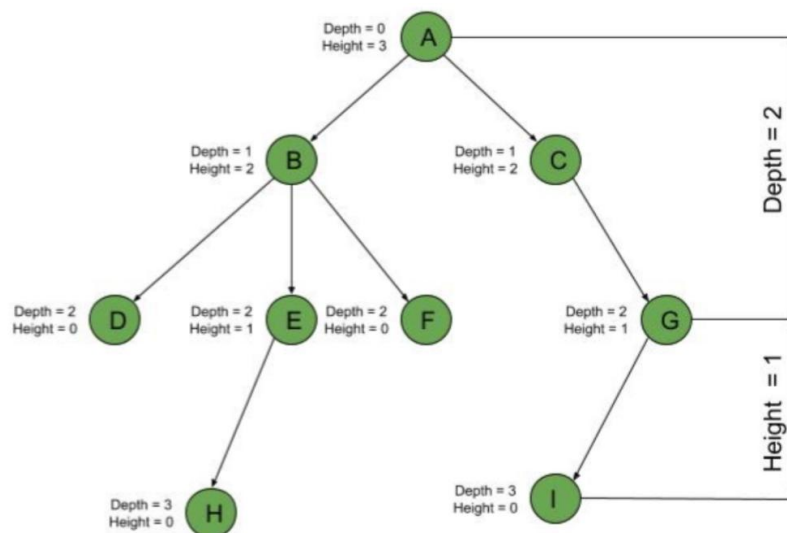
A heuristic is a way which **might not always be guaranteed for best solutions** but guaranteed to find a good solution in reasonable time.

Informed search can solve much complex problem which could not be solved in another way.

An example of informed search algorithms is a traveling salesman problem.

1. Greedy Search
2. A\* Search

## Uninformed Search Algorithms:



For each node in a tree, we can define two features: *height* and *depth*. A node's height is the **number of edges to its most distant leaf node**. On the other hand, a node's **depth is the number of edges back up to the root**



## 1. Breadth-first Search:

- Breadth-first search is the most common search strategy for traversing a tree or graph. This algorithm searches breadth-wise in a tree or graph, so it is called breadth-first search.
- BFS algorithm starts searching from the root node of the tree and expands all successor nodes at the current level before moving to nodes of next level.
- The breadth-first search algorithm is an example of a general-graph search algorithm.
- Breadth-first search implemented using **FIFO queue** data structure.

### Advantages:

- BFS will provide a solution if any solution exists.
- If there is more than one solution for a given problem, then BFS will provide the **minimal solution** which requires the least number of steps.

### Disadvantages:

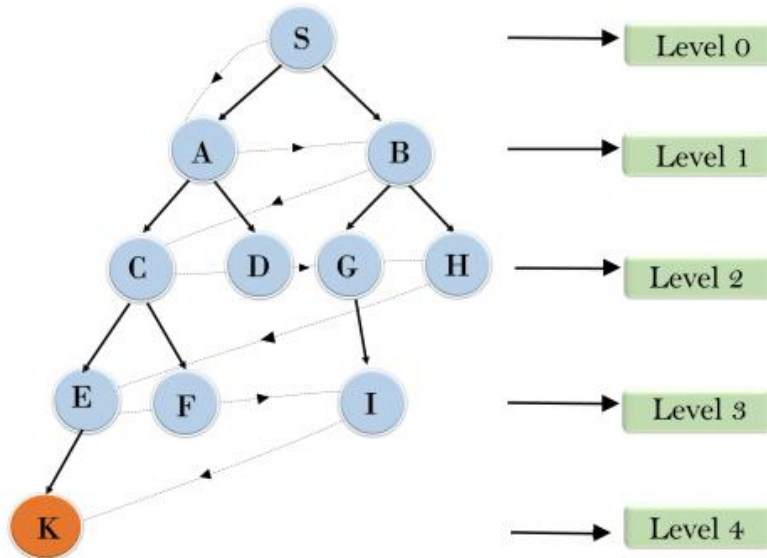
- It requires **lots of memory** since each level of the tree must be saved into memory to expand the next level.
- BFS needs **lots of time if the solution is far away from the root** node.

### Example:

In the below tree structure, we have shown the traversing of the tree using BFS algorithm from the **root node S to goal node K**. BFS search algorithm traverse in layers, so it will follow the path which is shown by the dotted arrow, and the traversed path will be:

**S---> A--->B--->C--->D--->G--->H--->E--->F--->I--->K**

### Breadth First Search



**Completeness:** BFS is complete, which means if the shallowest goal node is at some finite depth, then BFS will find a solution.

**Optimality:** BFS is optimal if path cost is a non-decreasing function of the depth of the node

## 2. Depth-first Search

- Depth-first search is a recursive algorithm for traversing a tree or graph data structure.
- It is called the depth-first search because it starts from the **root node and follows each path to its greatest depth node before moving to the next path.**
- DFS uses a **stack data structure** for its implementation.
- The process of the DFS algorithm is similar to the BFS algorithm.

Note: Backtracking is an algorithm technique for finding all possible solutions using recursion.

### Advantage:

- DFS requires **very less memory** as it only needs to store a stack of the nodes on the path from root node to the current node.
- It takes **less time to reach** to the goal node than BFS algorithm (if it traverses in the right path).

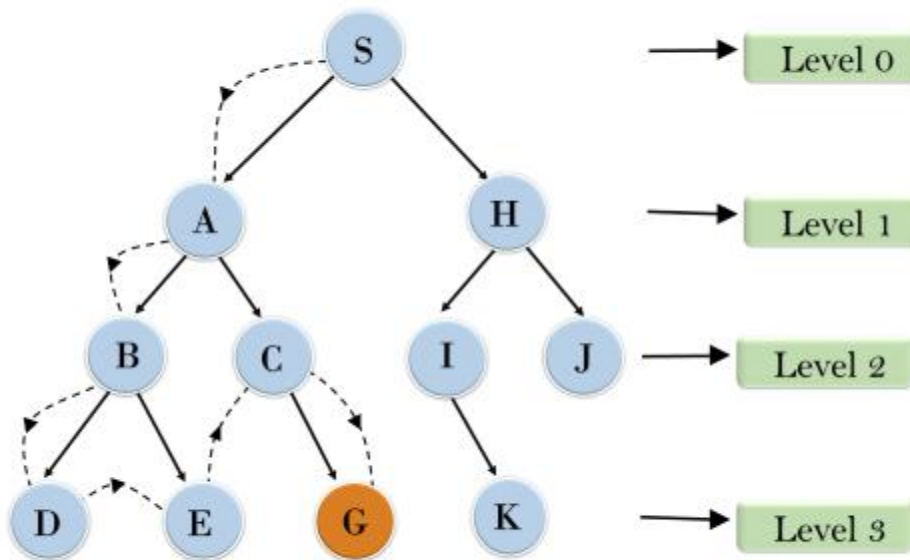
### Example:

In the below search tree, we have shown the flow of depth-first search, and it will follow the order as:

**Root node--->Left node ----> right node.**

It will start searching from root node S, and traverse A, then B, then D and E, after traversing E, it will backtrack the tree as E has no other successor and still goal node is not found. After backtracking it will traverse node C and then G, and here it will terminate as it found goal node.

## Depth First Search



**Completeness:** DFS search algorithm is complete within finite state space as it will expand every node within a limited search tree.

**Optimal:** DFS search algorithm **is non-optimal**, as it may generate a large number of steps or high cost to reach to the goal node.

### 3. Depth-first Search with Iterative deepening:

The iterative deepening algorithm is a combination of DFS and BFS algorithms. This search algorithm finds out the best depth limit and does it by gradually increasing the limit until a goal is found.

This algorithm performs depth-first search up to a certain "depth limit", and it keeps increasing the depth limit after each iteration until the goal node is found.

This Search algorithm combines the benefits of Breadth-first search's fast search and depth-first search's memory efficiency.

The iterative search algorithm is useful uninformed search when search space is large, and depth of goal node is unknown.

**Advantages:**

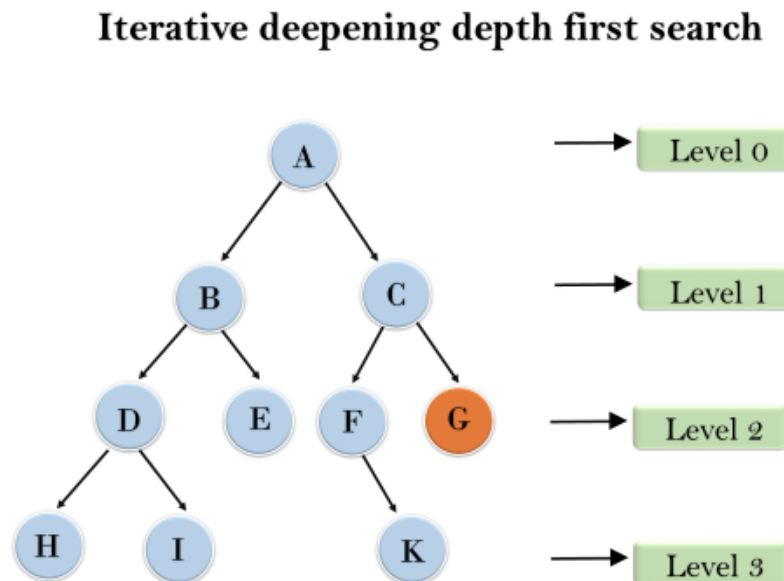
- It combines the benefits of BFS and DFS search algorithm in terms of fast search and memory efficiency.

**Disadvantages:**

- The main drawback of IDDFS is that it repeats all the work of the previous phase.

**Example:**

Following tree structure is showing the iterative deepening depth-first search. IDDFS algorithm performs various iterations until it does not find the goal node. The iteration performed by the algorithm is given as:



1'st Iteration-----> A

2'nd Iteration-----> A, B, C

3'rd Iteration----->A, B, D, E, C, F, G

4'th Iteration----->A, B, D, H, I, E, C, F, K, G

In the fourth iteration, the algorithm will find the goal node.

## Informed Search Algorithms

So far we have talked about the uninformed search algorithms which looked through search space for all possible solutions of the problem without having any additional knowledge about search space. But informed search algorithm contains an array of knowledge such as how far we are from the goal, path cost, how to reach to goal node, etc. This knowledge help agents to explore less to the search space and find more efficiently the goal node.

The informed search algorithm is more useful for large search space. Informed search algorithm uses the idea of heuristic, so it is also called Heuristic search.

**Heuristics function:** Heuristic is a function which is used in Informed Search, and it finds the most promising path. It takes the current state of the agent as its input and produces the estimation of how close agent is from the goal. The heuristic method, however, might not always give the best solution, but it guaranteed to find a good solution in reasonable time. Heuristic function estimates how close a state is to the goal. It is represented by  $h(n)$ , and it calculates the cost of an optimal path between the pair of states. The value of the heuristic function is always positive.

**Admissibility of the heuristic function is given as:**

$$h(n) \leq h^*(n)$$

Here  $h(n)$  is heuristic cost, and  $h^*(n)$  is the estimated cost. Hence heuristic cost should be less than or equal to the estimated cost.



## Pure Heuristic Search:

Pure heuristic search is the simplest form of heuristic search algorithms. It expands nodes based on their heuristic value  $h(n)$ . It maintains two lists, OPEN and CLOSED list. In the CLOSED list, it places those nodes which have already expanded and in the OPEN list, it places nodes which have yet not been expanded.

On each iteration, each node  $n$  with the lowest heuristic value is expanded and generates all its successors and  $n$  is placed to the closed list. The algorithm continues until a goal state is found.

In the informed search we will discuss two main algorithms which are given below:

- **Best First Search Algorithm(Greedy search)**
- **A\* Search Algorithm**

### 1. Best-first Search Algorithm (Greedy Search):

Greedy best-first search algorithm always selects the path which appears best at that moment. It is the combination of depth-first search and breadth-first search algorithms. It uses the heuristic function and search. Best-first search allows us to take the advantages of both algorithms. With the help of best-first search, at each step, we can choose the most promising node. In the best first search algorithm, we expand the node which is closest to the goal node and the closest cost is estimated by heuristic function, i.e.

$$f(n) = g(n).$$

Where,  $h(n)$  = estimated cost from node  $n$  to the goal.

The greedy best first algorithm is implemented by the priority queue.

**Best first search algorithm:**

- **Step 1:** Place the starting node into the OPEN list.
- **Step 2:** If the OPEN list is empty, Stop and return failure.
- **Step 3:** Remove the node  $n$ , from the OPEN list which has the lowest value of  $h(n)$ , and places it in the CLOSED list.
- **Step 4:** Expand the node  $n$ , and generate the successors of node  $n$ .
- **Step 5:** Check each successor of node  $n$ , and find whether any node is a goal node or not. If any successor node is goal node, then return success and terminate the search, else proceed to Step 6.
- **Step 6:** For each successor node, algorithm checks for evaluation function  $f(n)$ , and then check if the node has been in either OPEN or CLOSED list. If the node has not been in both list, then add it to the OPEN list.
- **Step 7:** Return to Step 2.

**Advantages:**

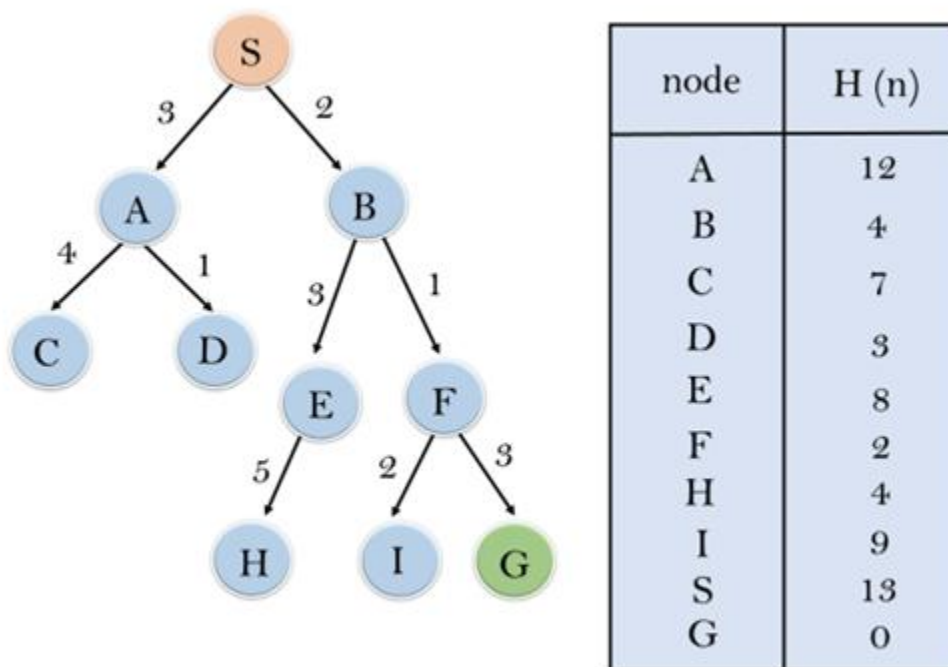
- Best first search can switch between BFS and DFS by gaining the advantages of both the algorithms.
- This algorithm is more efficient than BFS and DFS algorithms.

**Disadvantages:**

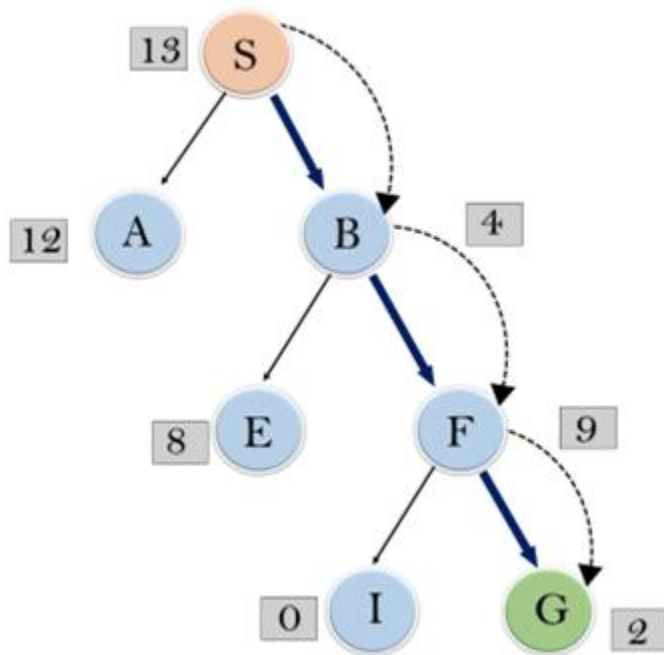
- It can behave as an unguided depth-first search in the worst case scenario.
- It can get stuck in a loop as DFS.
- This algorithm is not optimal.

**Example:**

Consider the below search problem, and we will traverse it using greedy best-first search. At each iteration, each node is expanded using evaluation function  $f(n)=h(n)$ , which is given in the below table.



In this search example, we are using two lists which are **OPEN** and **CLOSED** Lists. Following are the iteration for traversing the above example.



**Expand the nodes of S and put in the CLOSED list**

**Initialization:** Open [A, B], Closed [S]

**Iteration 1:** Open [A], Closed [S, B]

**Iteration 2:** Open [E, F, A], Closed [S, B]  
: Open [E, A], Closed [S, B, F]

**Iteration 3:** Open [I, G, E, A], Closed [S, B, F]  
: Open [I, E, A], Closed [S, B, F, G]

Hence the final solution path will be: **S-----> B----->F-----> G**

**Time Complexity:** The worst case time complexity of Greedy best first search is  $O(b^m)$ .

**Space Complexity:** The worst case space complexity of Greedy best first search is  $O(b^m)$ . Where, m is the maximum depth of the search space.

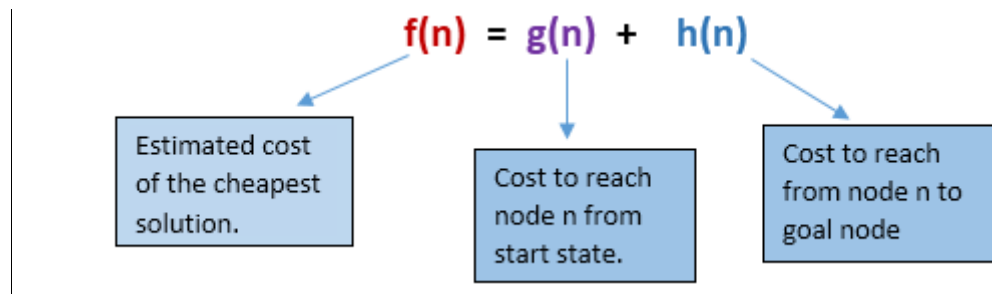
**Complete:** Greedy best-first search is also incomplete, even if the given state space is finite.

**Optimal:** Greedy best first search algorithm is not optimal.

## 2.) A\* Search Algorithm:

A\* search is the most commonly known form of best-first search. It uses heuristic function  $h(n)$ , and cost to reach the node  $n$  from the start state  $g(n)$ . It has combined features of UCS and greedy best-first search, by which it solve the problem efficiently. A\* search algorithm finds the shortest path through the search space using the heuristic function. This search algorithm expands less search tree and provides optimal result faster. A\* algorithm is similar to UCS except that it uses  $g(n)+h(n)$  instead of  $g(n)$ .

In A\* search algorithm, we use search heuristic as well as the cost to reach the node. Hence we can combine both costs as following, and this sum is called as a **fitness number**.



At each point in the search space, only those node is expanded which have the lowest value of  $f(n)$ , and the algorithm terminates when the goal node is found.

### **Algorithm of A\* search:**

**Step 1:** Place the starting node in the OPEN list.

**Step 2:** Check if the OPEN list is empty or not, if the list is empty then return failure and stops.

**Step 3:** Select the node from the OPEN list which has the smallest value of evaluation function ( $g+h$ ), if node  $n$  is goal node then return success and stop, otherwise

**Step 4:** Expand node  $n$  and generate all of its successors, and put  $n$  into the closed list. For each successor  $n'$ , check whether  $n'$  is already in the OPEN or CLOSED list, if not then compute evaluation function for  $n'$  and place into Open list.

**Step 5:** Else if node  $n'$  is already in OPEN and CLOSED, then it should be attached to the back pointer which reflects the lowest  $g(n')$  value.

**Step 6:** Return to **Step 2**.

### **Advantages:**

- A\* search algorithm is the best algorithm than other search algorithms.
- A\* search algorithm is optimal and complete.
- This algorithm can solve very complex problems.

### **Disadvantages:**

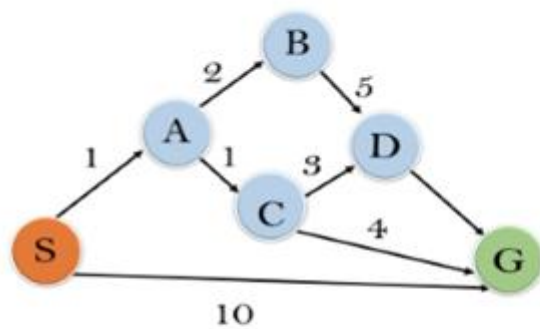
- It does not always produce the shortest path as it mostly based on heuristics and approximation.
- A\* search algorithm has some complexity issues.

- The main drawback of A\* is memory requirement as it keeps all generated nodes in the memory, so it is not practical for various large-scale problems.

**Example:**

In this example, we will traverse the given graph using the A\* algorithm. The heuristic value of all states is given in the below table so we will calculate the  $f(n)$  of each state using the formula  $f(n) = g(n) + h(n)$ , where  $g(n)$  is the cost to reach any node from start state.

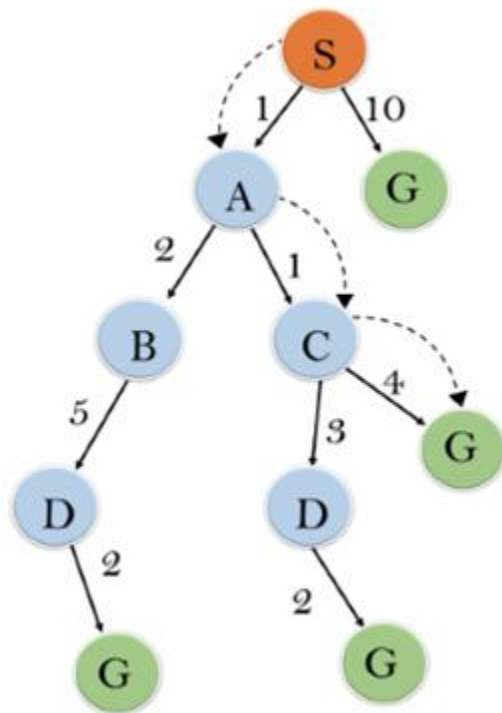
Here we will use OPEN and CLOSED list.



State	$h(n)$
S	5
A	3
B	4
C	2
D	6
G	0



**Solution:**



**Initialization:**  $\{(S, 5)\}$

**Iteration1:**  $\{(S \rightarrow A, 4), (S \rightarrow G, 10)\}$

**Iteration2:**  $\{(S \rightarrow A \rightarrow C, 4), (S \rightarrow A \rightarrow B, 7), (S \rightarrow G, 10)\}$

**Iteration3:**  $\{(S \rightarrow A \rightarrow C \rightarrow G, 6), (S \rightarrow A \rightarrow C \rightarrow D, 11), (S \rightarrow A \rightarrow B, 7), (S \rightarrow G, 10)\}$

**Iteration 4** will give the final result, as **S $\rightarrow$ A $\rightarrow$ C $\rightarrow$ G** it provides the optimal path with cost 6.

**Points to remember:**

- A\* algorithm returns the path which occurred first, and it does not search for all remaining paths.

- The efficiency of A\* algorithm depends on the quality of heuristic.
- A\* algorithm expands all nodes which satisfy the condition  $f(n) \leq l_i$

**Complete:** A\* algorithm is complete as long as:

- Branching factor is finite.
- Cost at every action is fixed.

**Optimal:** A\* search algorithm is optimal if it follows below two conditions:

- **Admissible:** the first condition requires for optimality is that  $h(n)$  should be an admissible heuristic for A\* tree search. An admissible heuristic is optimistic in nature.
- **Consistency:** Second required condition is consistency for only A\* graph-search.

If the heuristic function is admissible, then A\* tree search will always find the least cost path.

**Time Complexity:** The time complexity of A\* search algorithm depends on heuristic function, and the number of nodes expanded is exponential to the depth of solution  $d$ . So the time complexity is  $O(b^d)$ , where  $b$  is the branching factor.

**Space Complexity:** The space complexity of A\* search algorithm is  **$O(b^d)$**

## Hill Climbing Algorithm in Artificial Intelligence

- Hill climbing algorithm is a local search algorithm which continuously moves in the direction of increasing elevation/value to find the peak of the mountain or best solution to the problem. It terminates when it reaches a peak value where no neighbor has a higher value.
- Hill climbing algorithm is a technique which is used for optimizing the mathematical problems. One of the widely discussed examples of Hill climbing algorithm is Traveling-salesman Problem in which we need to minimize the distance traveled by the salesman.
- It is also called greedy local search as it only looks to its good immediate neighbor state and not beyond that.
- A node of hill climbing algorithm has two components which are state and value.
- Hill Climbing is mostly used when a good heuristic is available.
- In this algorithm, we don't need to maintain and handle the search tree or graph as it only keeps a single current state.

### Features of Hill Climbing:

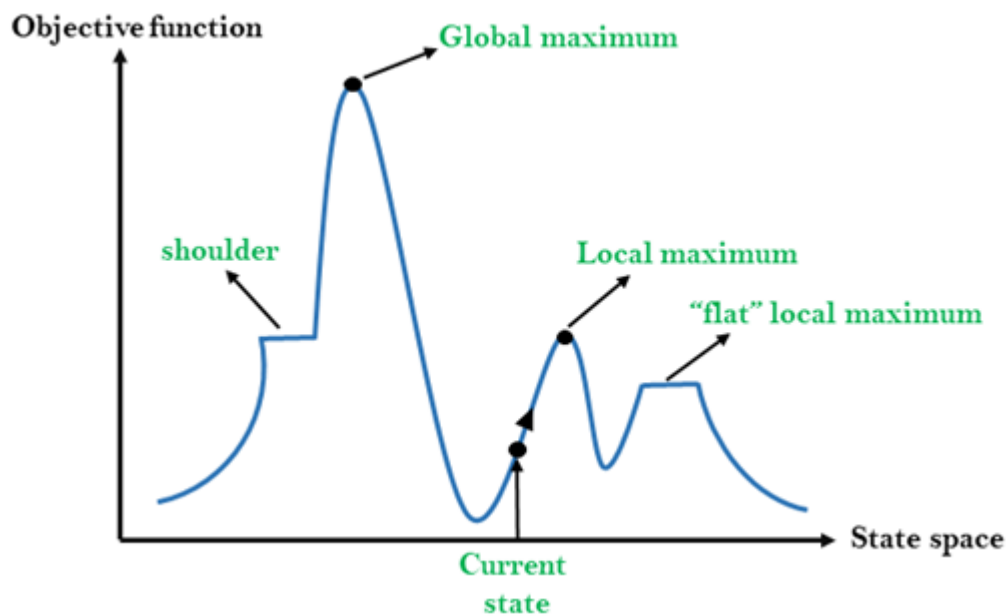
Following are some main features of Hill Climbing Algorithm:

- **Generate and Test variant:** Hill Climbing is the variant of Generate and Test method. The Generate and Test method produce feedback which helps to decide which direction to move in the search space.
- **Greedy approach:** Hill-climbing algorithm search moves in the direction which optimizes the cost.
- **No backtracking:** It does not backtrack the search space, as it does not remember the previous states.

## State-space Diagram for Hill Climbing:

The state-space landscape is a graphical representation of the hill-climbing algorithm which is showing a graph between various states of algorithm and Objective function/Cost.

On Y-axis we have taken the function which can be an objective function or cost function, and state-space on the x-axis. If the function on Y-axis is cost then, the goal of search is to find the global minimum and local minimum. If the function of Y-axis is Objective function, then the goal of the search is to find the global maximum and local maximum.



## Different regions in the state space landscape:

**Local Maximum:** Local maximum is a state which is better than its neighbor states, but there is also another state which is higher than it.

**Global Maximum:** Global maximum is the best possible state of state space landscape. It has the highest value of objective function.

**Current state:** It is a state in a landscape diagram where an agent is currently present.

**Flat local maximum:** It is a flat space in the landscape where all the neighbor states of current states have the same value.

**Shoulder:** It is a plateau region which has an uphill edge.

Types of Hill Climbing Algorithm:

- Simple hill Climbing:
- Steepest-Ascent hill-climbing:
- Stochastic hill Climbing:

### 1. Simple Hill Climbing:

Simple hill climbing is the simplest way to implement a hill climbing algorithm. **It only evaluates the neighbor node state at a time and selects the first one which optimizes current cost and set it as a current state.** It only checks its one successor state, and if it finds better than the current state, then move else be in the same state. This algorithm has the following features:

- Less time consuming
- Less optimal solution and the solution is not guaranteed

Algorithm for Simple Hill Climbing:

- **Step 1:** Evaluate the initial state, if it is goal state then return success and Stop.
- **Step 2:** Loop Until a solution is found or there is no new operator left to apply.
- **Step 3:** Select and apply an operator to the current state.
- **Step 4:** Check new state:

- a. If it is goal state, then return success and quit.
- b. Else if it is better than the current state then assign new state as a current state.
- c. Else if not better than the current state, then return to step2.

**Step 5:** Exit.

## 2. Steepest-Ascent hill climbing:

The steepest-Ascent algorithm is a variation of simple hill climbing algorithm. This algorithm examines all the neighboring nodes of the current state and selects one neighbor node which is closest to the goal state. This algorithm consumes more time as it searches for multiple neighbors

Algorithm for Steepest-Ascent hill climbing:

- o **Step 1:** Evaluate the initial state, if it is goal state then return success and stop, else make current state as initial state.
- o **Step 2:** Loop until a solution is found or the current state does not change.
  - a. Let SUCC be a state such that any successor of the current state will be better than it.
  - b. For each operator that applies to the current state:
    - a. Apply the new operator and generate a new state.
    - b. Evaluate the new state.
    - c. If it is goal state, then return it and quit, else compare it to the SUCC.
    - d. If it is better than SUCC, then set new state as SUCC.
    - e. If the SUCC is better than the current state, then set current state to SUCC.

**Step 5:** Exit.

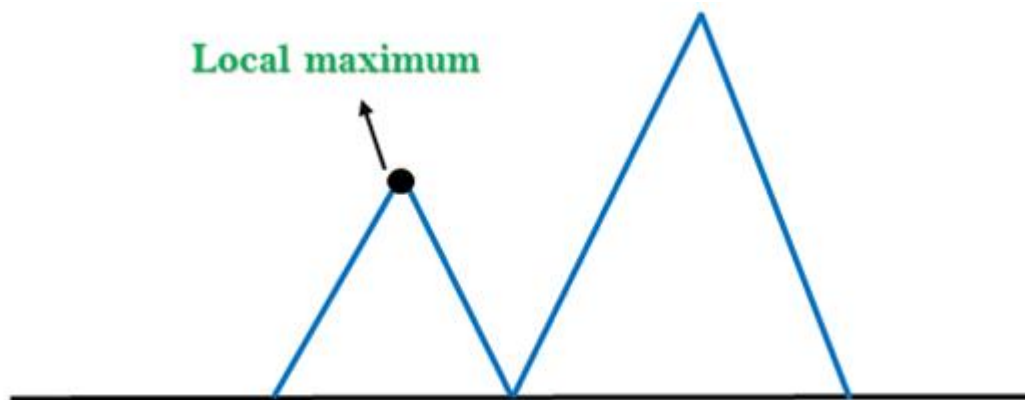
### 3. Stochastic hill climbing:

Stochastic hill climbing does not examine for all its neighbor before moving. Rather, this search algorithm selects **one neighbor node at random** and decides whether to choose it as a current state or examine another state.

Problems in Hill Climbing Algorithm:

**1. Local Maximum:** A local maximum is a peak state in the landscape which is better than each of its neighboring states, but there is another state also present which is higher than the local maximum.

**Solution:** Backtracking technique can be a solution of the local maximum in state space landscape. Create a list of the promising path so that the algorithm can backtrack the search space and explore other paths as well.

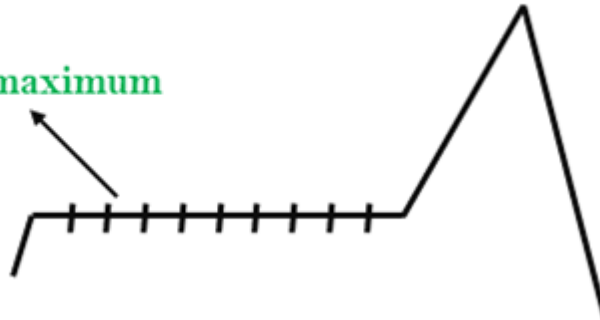


**2. Plateau:** A plateau is the flat area of the search space in which all the neighbor states of the current state contains the same value, because of this algorithm does not find any best direction to move. A hill-climbing search might be lost in the plateau area.

**Solution:** The solution for the plateau is to take big steps or very little steps while searching, to solve the problem. Randomly select a state which is far

away from the current state so it is possible that the algorithm could find non-plateau region.

**Plateau/Flat maximum**



**3. Ridges:** A ridge is a special form of the local maximum. It has an area which is higher than its surrounding areas, but itself has a slope, and cannot be reached in a single move.

**Solution:** With the use of bidirectional search, or by moving in different directions, we can improve this problem.

**Ridge**





### **Simulated Annealing:**

A hill-climbing algorithm which never makes a move towards a lower value guaranteed to be incomplete because it can get stuck on a local maximum. And if algorithm applies a random walk, by moving a successor, then it may complete but not efficient. **Simulated Annealing** is an algorithm which yields both efficiency and completeness.

In mechanical term **Annealing** is a process of hardening a metal or glass to a high temperature then cooling gradually, so this allows the metal to reach a low-energy crystalline state. The same process is used in simulated annealing in which the algorithm picks a random move, instead of picking the best move. If the random move improves the state, then it follows the same path. Otherwise, the algorithm follows the path which has a probability of less than 1 or it moves downhill and chooses another path.