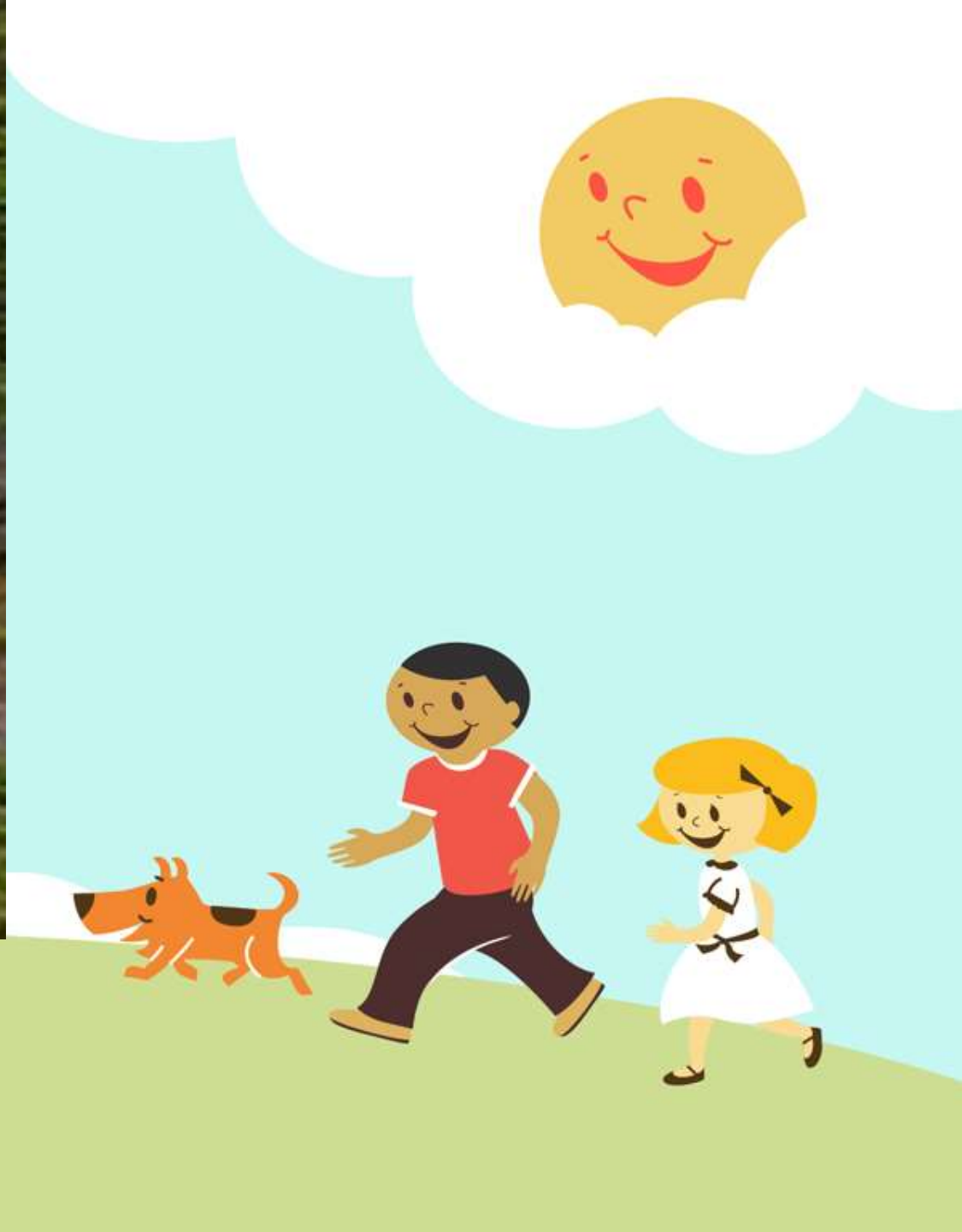




Two roads diverged in a yellow wood,
And sorry I could not travel both
And be one traveler, long I stood
And looked down as far I could
To where it bent in the undergrowth;
Then took the other,...



Structures and Strategies for State Space Search



Questions to be answered?

- Is the problem solver guaranteed a solution?
- Will the search terminate or get caught in an infinite loop?
- Will the solution be optimal?
- What are the time and memory usage complexity?

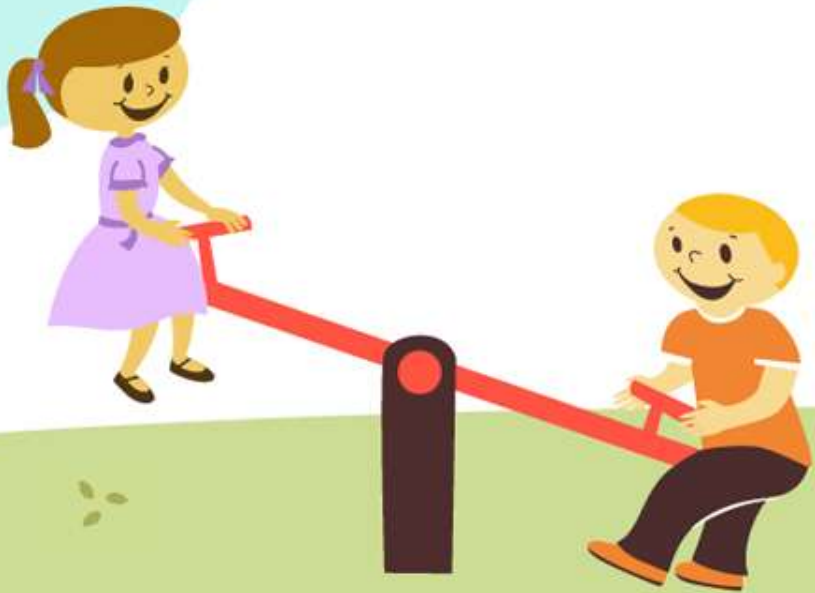


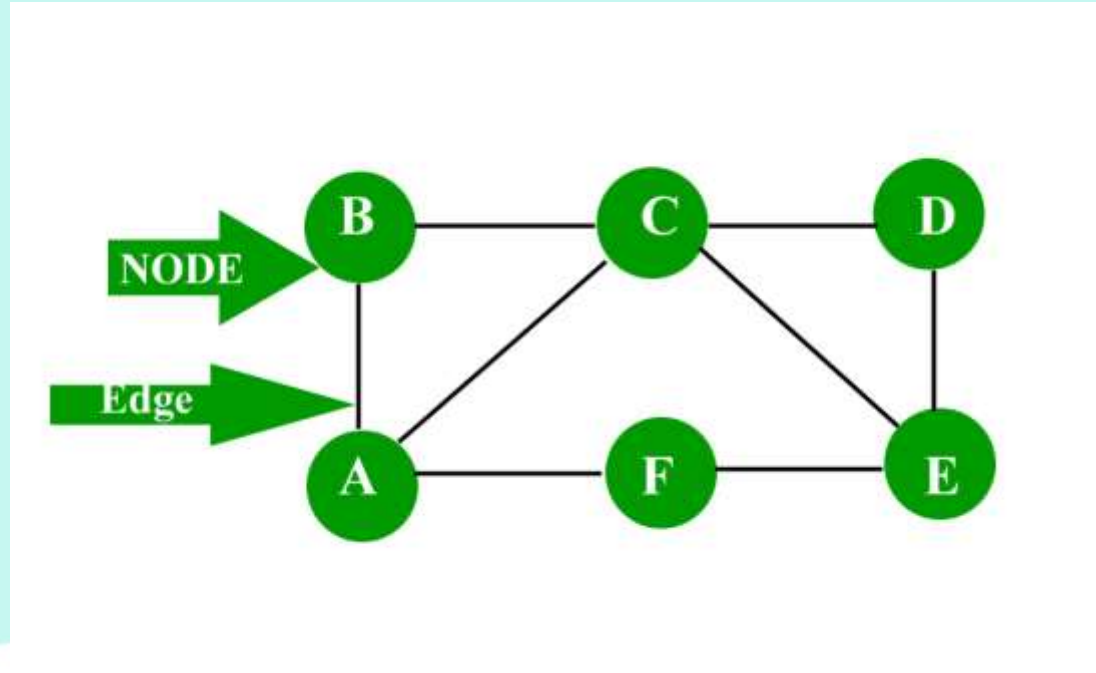
Konigsberg Bridge Problem



Graph Theory

Structures for State Space Search





- Labeled Graph
- Labels on arcs
- Directed graph
- Path
- Rooted Graph
- Tree\Relation between nodes
 - Parent, child, siblings;
 - Ancestral & Descendant nodes
- Leaf node



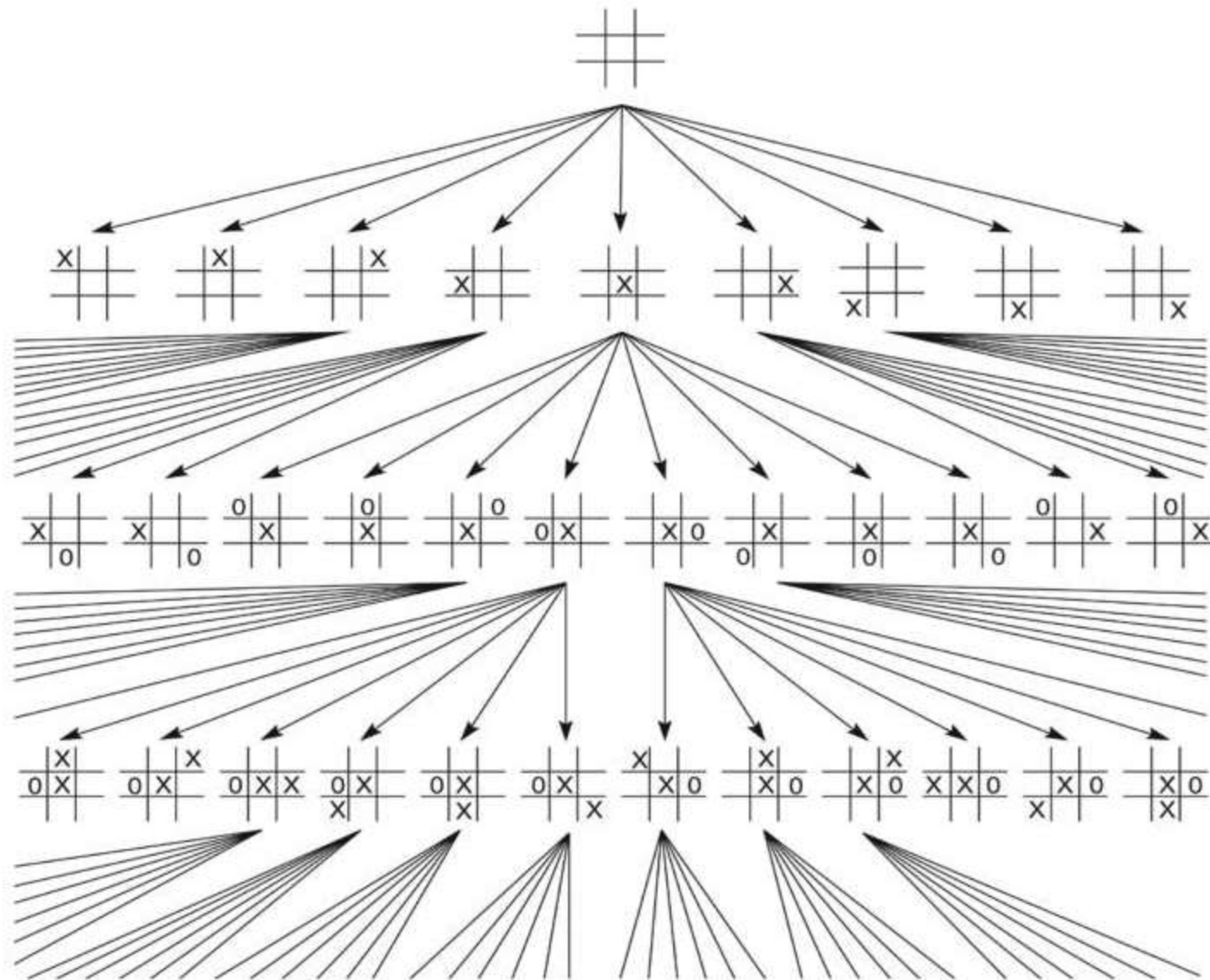
State Space Representation of Problems

[N, A, S, GD]

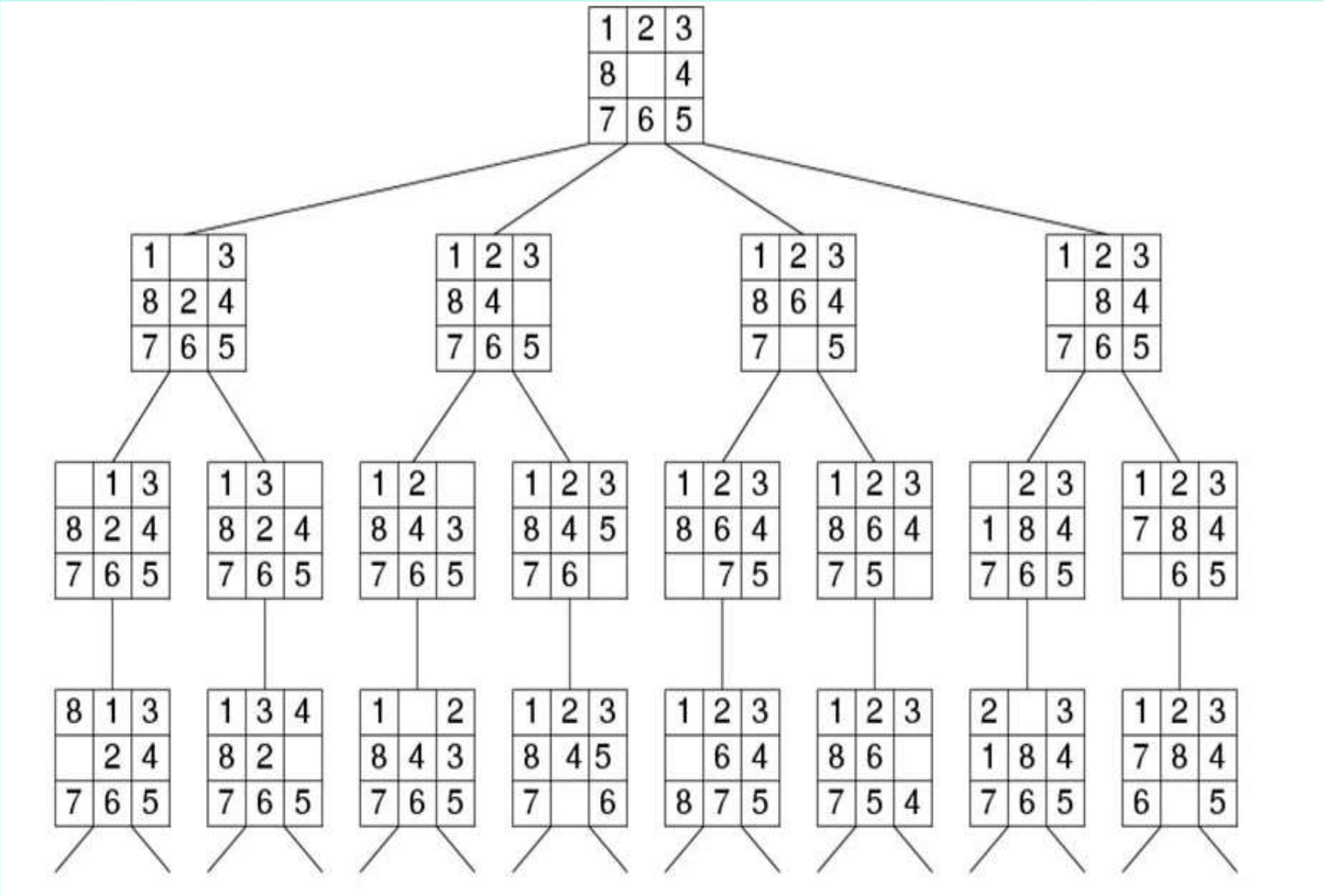
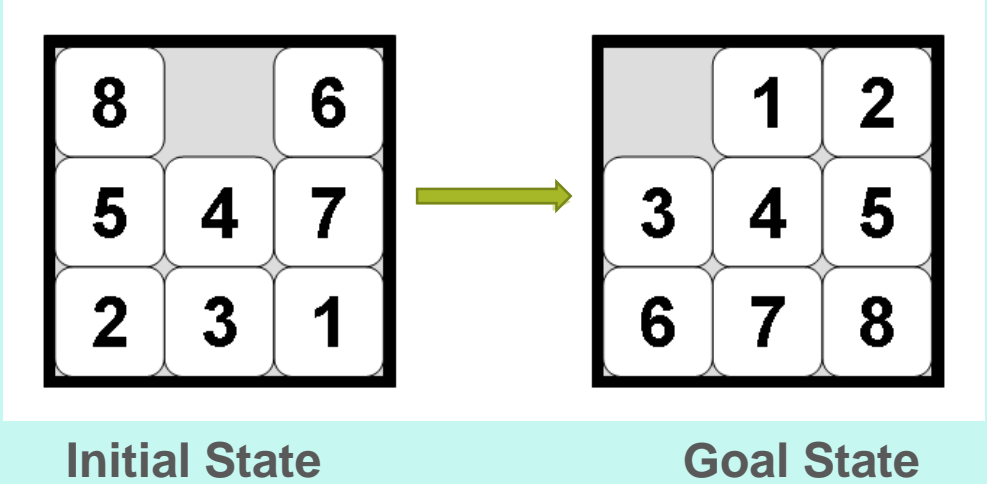
- N- nodes/ states
- A- Arcs/steps
- S- Start node
- GD- Goal State
- Solution – Path from S to GD



State Space Representation of Tic-Tac-Toe



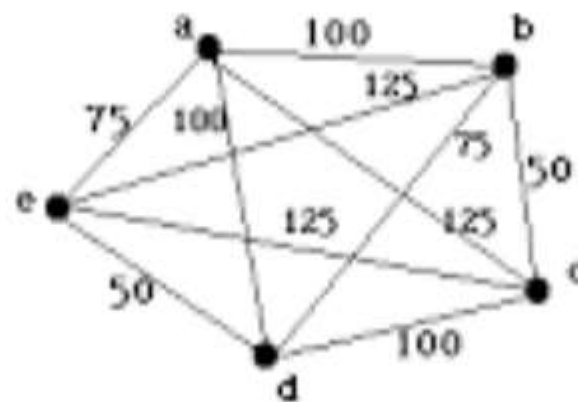
State Space Representation of 8-puzzle



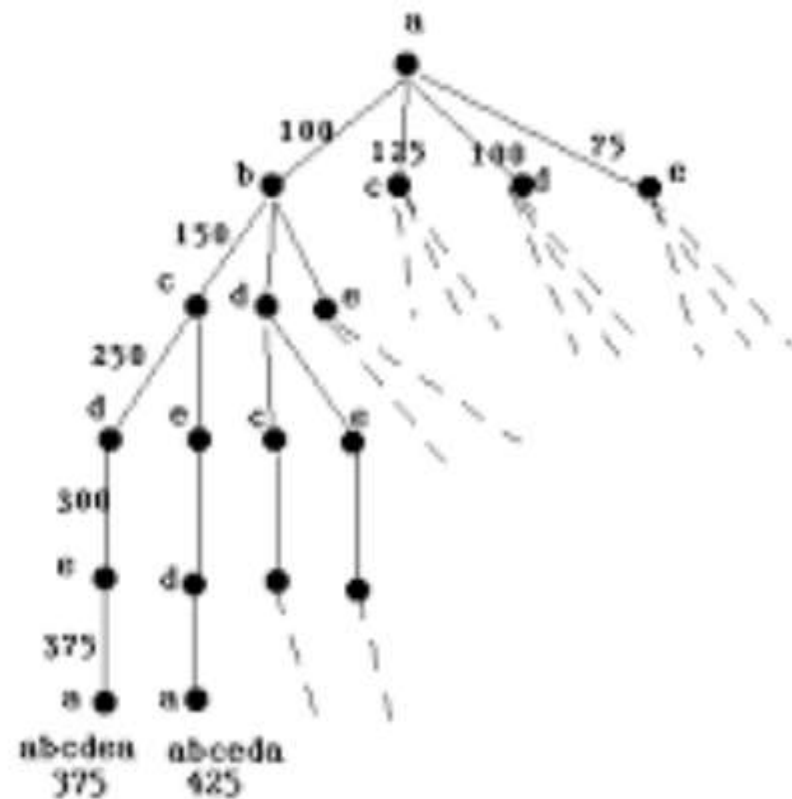
The Traveling Salesman Problem

- Starting from city 1, the salesman must travel to all cities once before returning home
- The distance between each city is given, and is assumed to be the same in both directions
- Only the links shown are to be used
- Objective - Minimize the total distance to be travelled

An Instance of the Traveling Salesman Problem



Search Space



Simplifying AI Models with the PEAS Representation System

PEAS => Performance, Environment, Actuators, and Sensors.

PEAS system for a ketchup-producing industry

Agent: Tomato classification system.

Sensors: Weighing sensors, Cameras for visual input, color sensing, etc.

Actuators: Track changing mechanism for segregation, display boards, or a Y-belt for quick classification into ripe and unripe tomatoes.

Environment: Our environment can be a moving walkway through which the tomatoes are passed on for segregation. It should have a good source of light for better camera input.

Performance: It measures how successful the agent is in classifying the tomatoes. It can be a confusion matrix with true positive, true negative, false positive, and false negative numbers or the model's accuracy.



Strategies for State Space Search

- Data-Driven and Goal Driven Search
- Graph Search
- Depth-First & Breadth-First Search
- Depth First with iterative Deepening



STATE SPACE SEARCH

Data-Driven Search

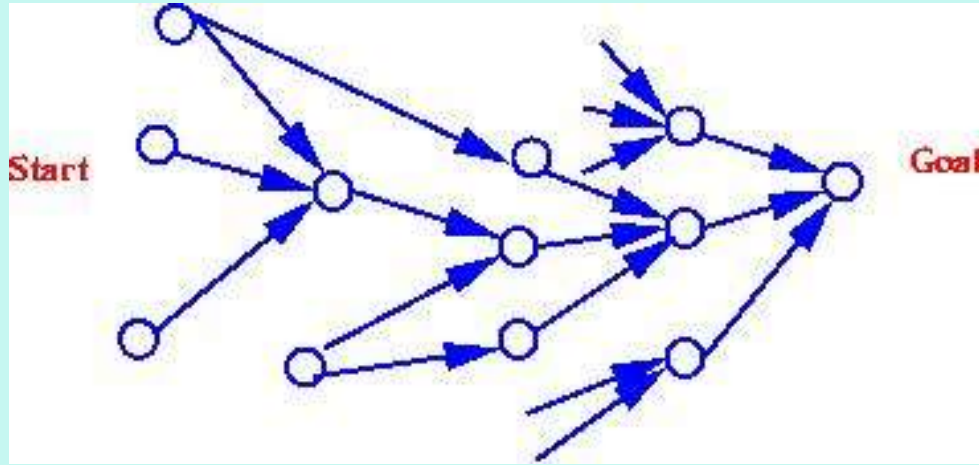
- Data Driven approach collects the facts about the problem
- Applies rules on the data and produce new facts from it to move towards the goal.
- It is also termed as forward chaining.

Goal Driven Search

- Goal driven approach focus on the goal
- Search the facts and rules that could be able to produce that goal.
- It works by processing in backward direction via rules and sub goals to reach to the facts of the problem.
- It is also called backward chaining.

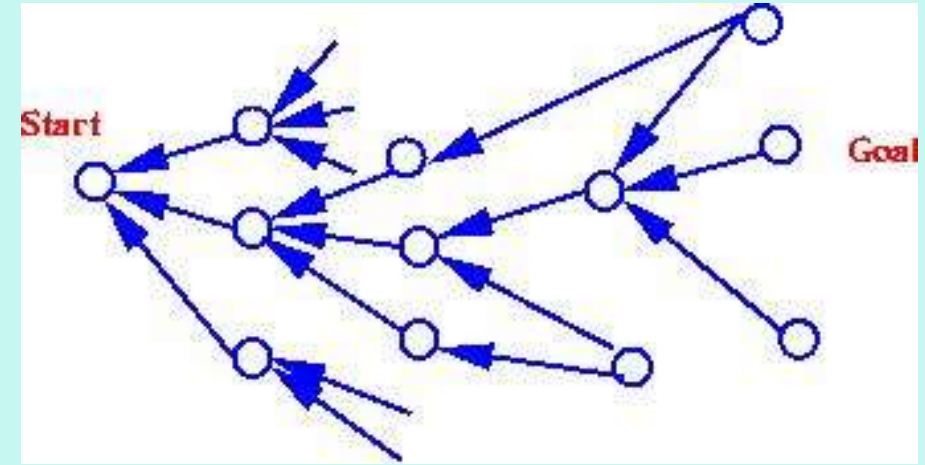


Forward Chaining.



- A goal or hypothesis is given in the problem statement
- There are a large number of rules that match the facts of the problem => an increasing number of conclusions or goals
- Problem data are not given but must be acquired by the problem solver

Backward Chaining.



- All or most of the data are given in the initial problem statement.
- There are a large number of potential goals, but there are only a few ways to use the facts and given information of a particular problem instance.
- It is difficult to form a goal or hypothesis.

Implementing Graph Search

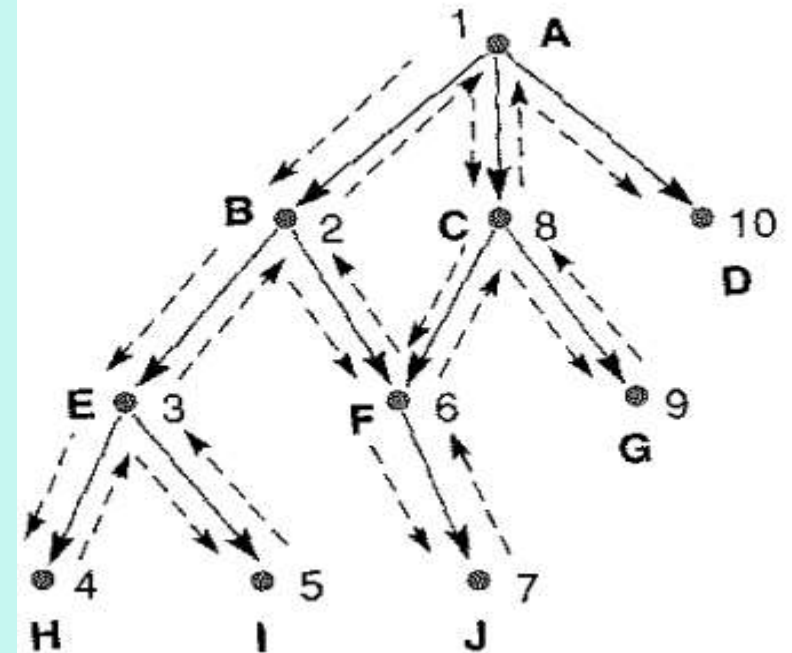
- a problem solver must find a path from a start state to a goal through the state space graph.
- Backtracking is a technique for systematically trying all paths through a state space
 - Begins at the start state and pursues a path until it reaches either a goal or a "dead end."
 - Goal → it quits and returns the solution path.
 - Dead end → "backtracks" to the most recent node on the path having unexamined siblings and continues down one of these branches,



```

function backtrack;
begin
  SL := [Start]; NSL := [Start]; DE := [ ]; CS := Start;           % initialize:
  while NSL  $\neq$  [ ] do                                           % while there are states to be tried
  begin
    if CS = goal (or meets goal description)
    then return SL;                                               % on success, return list of states in path.
    if CS has no children (excluding nodes already on DE, SL, and NSL)
    then begin
      while SL is not empty and CS = the first element of SL do
      begin
        add CS to DE;                                           % record state as dead end
        remove first element from SL;                             % backtrack
        remove first element from NSL;
        CS := first element of NSL;
      end
      add CS to SL;
    end
    else begin
      place children of CS (except nodes already on DE, SL, or NSL) on NSL;
      CS := first element of NSL;
      add CS to SL
    end
  end
end;
return FAIL;
end.

```



Initialize: SL = [A]; NSL = [A]; DE = []; CS = A;

AFTER

ITERATION	CS	SL	NSL	DE
0	A	[A]	[A]	[]
1	B	[B A]	[B C D A]	[]
2	E	[E B A]	[E F B C D A]	[]
3	H	[H E B A]	[H I E F B C D A]	[]
4	I	[I E B A]	[I E F B C D A]	[H]
5	F	[F B A]	[F B C D A]	[E I H]
6	J	[J F B A]	[J F B C D A]	[E I H]
7	C	[C A]	[C D A]	[B F J E I H]
8	G	[G C A]	[G C D A]	[B F J E I H]

BACKTRACKING

Usage of Backtracking in Graph Search

1. The use of a list of unprocessed states (NSL) to allow the algorithm to return (backtrack) to any of these states.
2. A list of "bad" states (DE) to prevent the algorithm from retrying useless paths.
3. A list of nodes (SL) on the current solution path that is returned if a goal is found.
4. Explicit checks for membership of new states in these lists to prevent looping.



Breadth-First and Depth-First Search

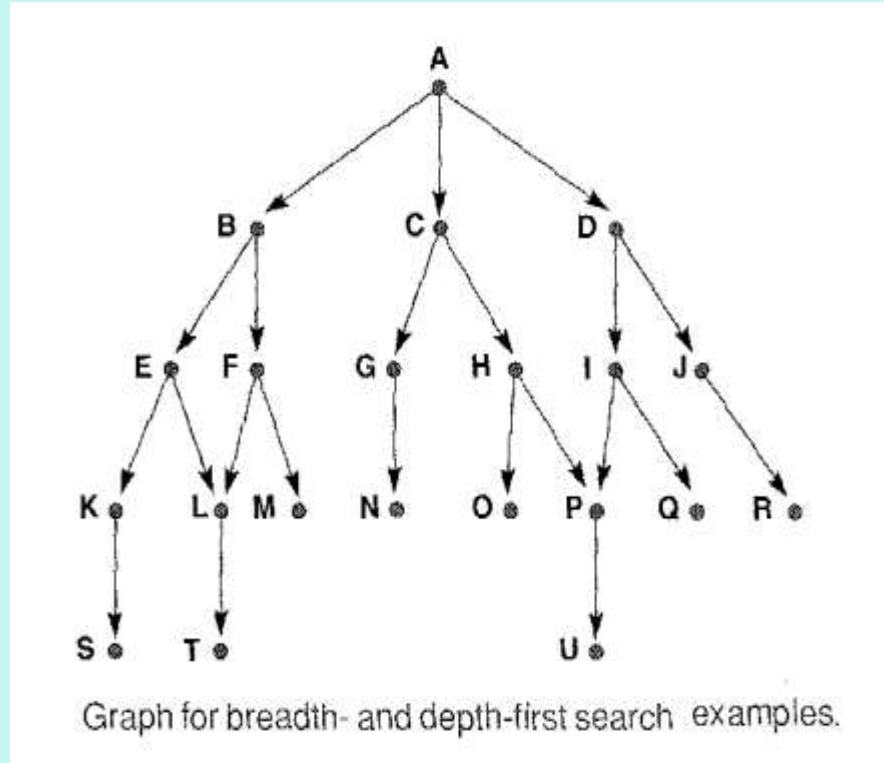
BFS

OPEN

A
BCD
CDEF
DEFGH
EFGHIJ
FGHIJKL

CLOSED

A
BA
CBA
DCBA
EDCBA



DFS

OPEN

A
BCD
EFCD
KLFC
SLFC

CLOSED

A
BA
EBA
KEBA

Breadth-First and Depth-First Search

BFS

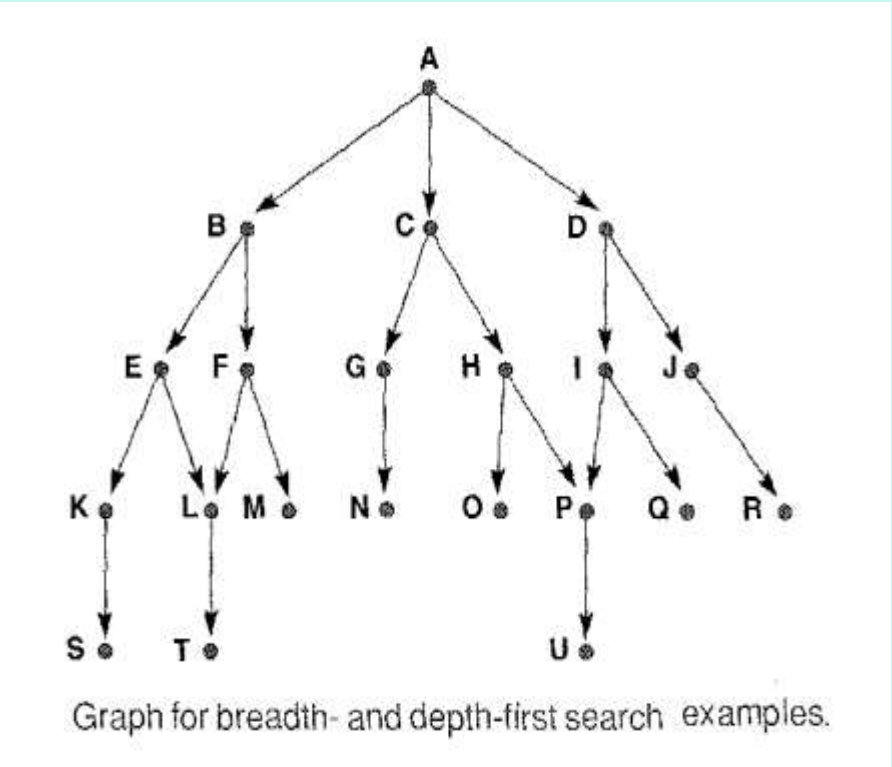
DFS

OPEN

CLOSED

A
BCD
CDEF
DEFGH
EFGHIJ
FGHIJKL
GHIJKLMN
HIJKLMN
IJKLMNOP
JKLMNOPQ
KLMNOPQR
LMNOPQRS
MNOPQRST
NOPQRST
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A
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FEDCBA
GFEDCBA
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NMLKJIHGFEDCBA
ONMLKJIHGFEDCBA
PONMLKJIHGFEDCBA
QPONMLKJIHGFEDCBA
RQPONMLKJIHGFEDCBA
SRQPONMLKJIHGFEDCBA
TSRQPONMLKJIHGFEDCBA



OPEN

CLOSED

A
BCD
EFCD
KLFC
SLFC
LFCD
TFCD
FCD
MCD
CD
GHD
NHD
HD
OPD
PD
UD
D
IJ
QJ
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A
BA
EBA
KEBA
SKEBA
LSKEBA
TLSKEBA
FTLSKEBA
MFTLSKEBA
CMFTLSKEBA
GCMFTLSKEBA
NGCMFTLSKEBA
HNGCMFTLSKEBA
OHNGCMFTLSKEBA
POHNGCMFTLSKEBA
UPOHNGCMFTLSKEBA
DUPOHNGCMFTLSKEBA
IDUPOHNGCMFTLSKEBA
QIDUPOHNGCMFTLSKEBA
JQIDUPOHNGCMFTLSKEBA

Breadth-First and Depth-First Search

```
function breadth_first_search;  
begin  
  open := [Start];  
  closed := [ ];  
  while open  $\neq$  [ ] do  
    begin  
      remove leftmost state from open, call it X;  
      if X is a goal then return SUCCESS  
      else begin  
        generate children of X;  
        put X on closed;  
        discard children of X if already on open or closed;  
        put remaining children on right end of open  
      end  
    end  
  end  
  return FAIL  
end.
```

```
function depth_first_search;  
  
begin  
  open := [Start];  
  closed := [ ];  
  while open  $\neq$  [ ] do  
    begin  
      remove leftmost state from open, call it X;  
      if X is a goal then return SUCCESS  
      else begin  
        generate children of X;  
        put X on closed;  
        discard children of X if already on open or closed;  
        put remaining children on left end of open  
      end  
    end  
  end;  
  return FAIL  
end.
```

Breadth-first Search (BFS)

Uses queue data structure to store the nodes to be visited

Traverses a graph level-wise

Not suitable for decision-making trees used in games or puzzle

More suitable when the target node is closer to the source

Depth-first Search (DFS)

Uses stack to store the nodes to be visited

Traverses a graph depth-wise

More suitable for game or puzzle problems

More suitable when the target node is away from the source node



DFS or Depth First Search

- On unweighted graph, DFS will create minimum spanning tree for all pair shortest path tree
- We can detect cycles in a graph using DFS.
- Using DFS we can find path between two given vertices u and v .
- We can perform topological sorting is used to scheduling jobs from given dependencies among jobs.
- Using DFS, we can find strongly connected components of a graph. If there is a path from each vertex to every other vertex, that is strongly connected.

BFS (Breadth First Search)

- In peer-to-peer network like bit-torrent, BFS is used to find all neighbor nodes
- Search engine crawlers are used BFS to build index. Starting from source page, it finds all links in it to get new pages
- Using GPS navigation system BFS is used to find neighboring places.
- In networking, when we want to broadcast some packets, we use the BFS algorithm.
- Path finding algorithm is based on BFS or DFS.
- BFS is used in Ford-Fulkerson algorithm to find maximum flow in a network.



Iterative deepening search

- Use DFS as a subroutine
 1. Check the root
 2. Do a DFS searching for a path of length 1
 3. If there is no path of length 1, do a DFS searching for a path of length 2
 4. If there is no path of length 2, do a DFS searching for a path of length 3...



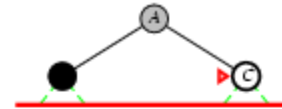
Iterative deepening search

Limit = 0



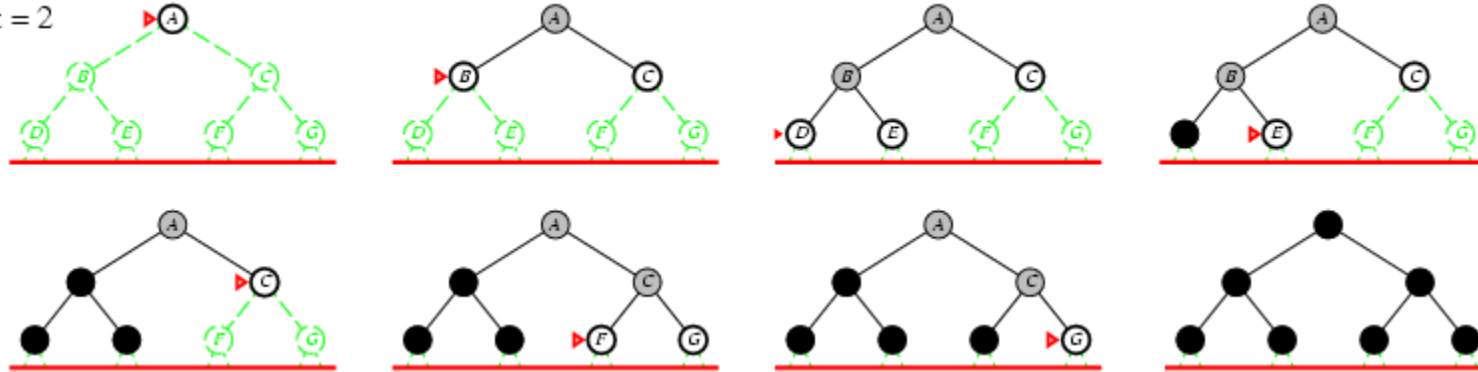
Iterative deepening search

Limit = 1



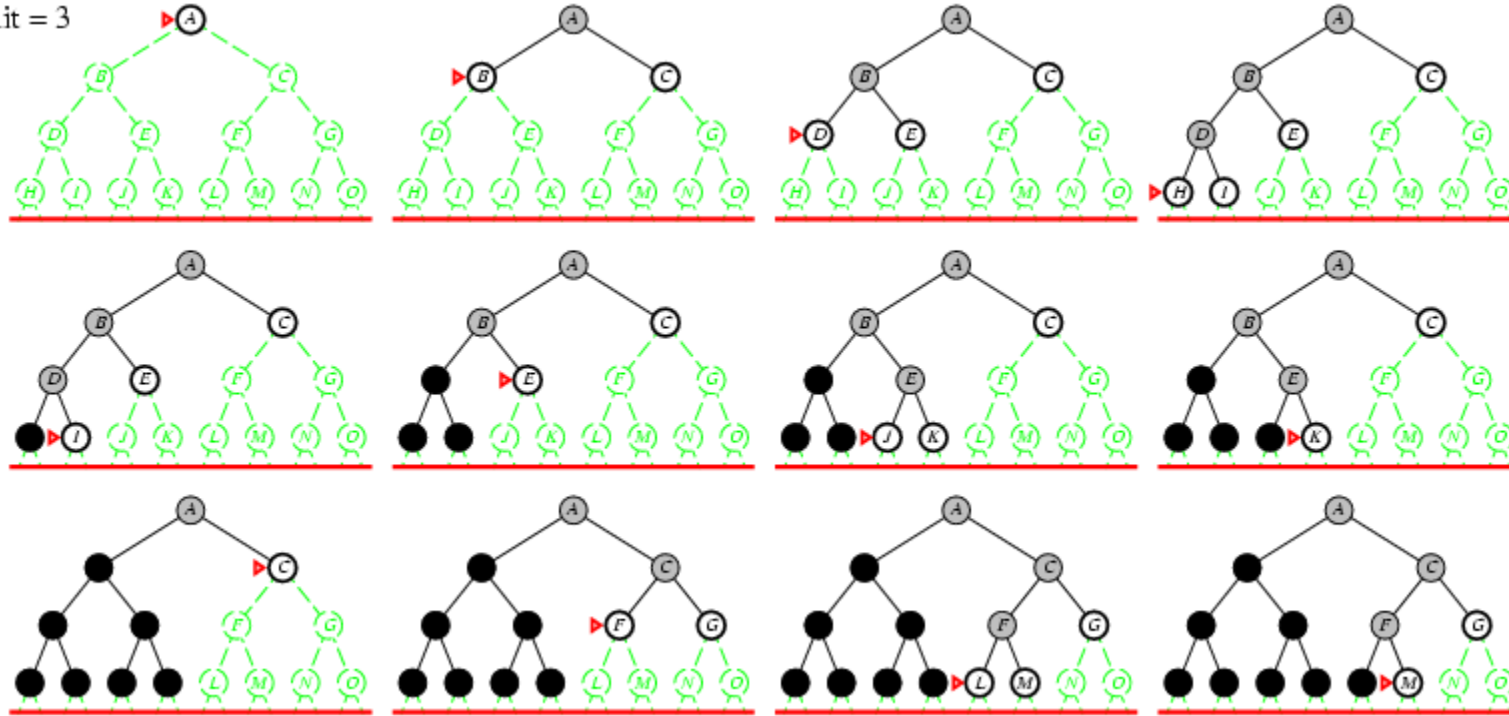
Iterative deepening search

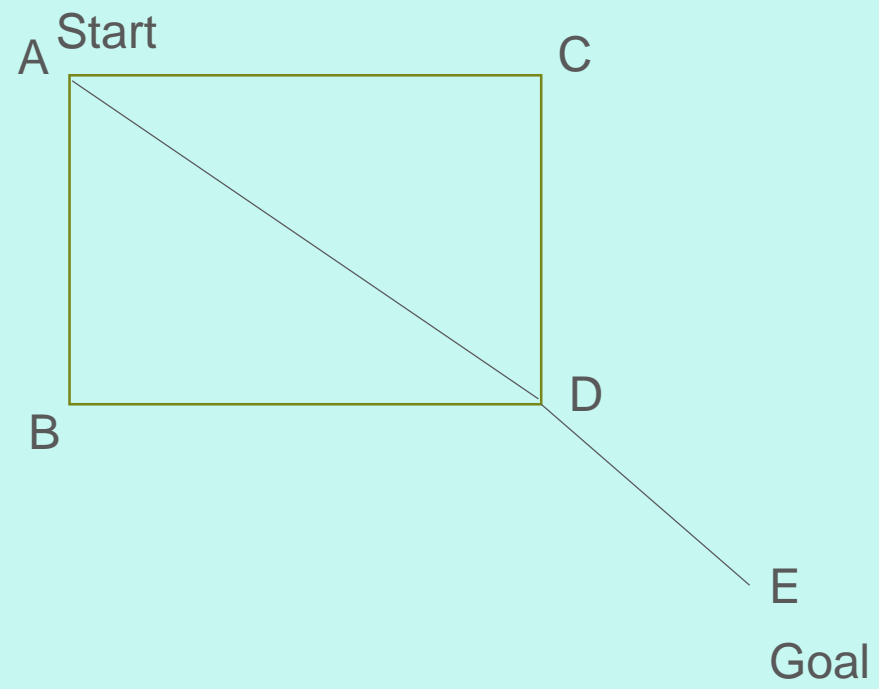
Limit = 2



Iterative deepening search

Limit = 3





Using the State Space to Represent Reasoning with the Predicate Calculus

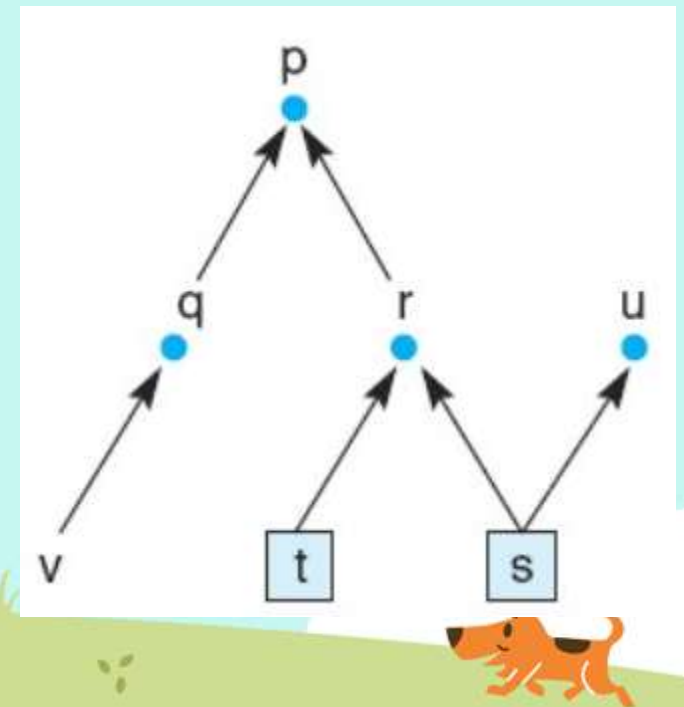
- Representation
 - Logical expressions as **states**
 - Inference Rules as **links**
- Correctness
 - **Soundness** and **Completeness** of Predicate Calculus **inference Rules** guarantee the **Correctness** of conclusions
- Theorem Proof
 - State space Search

Example

- $q \rightarrow p$
- $r \rightarrow p$
- $s \rightarrow r$
- $t \rightarrow r$
- $s \rightarrow u$
- $v \rightarrow q$
- s
- t

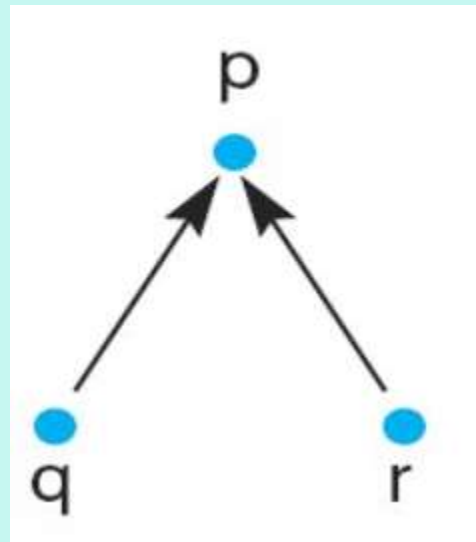
- Nodes \rightarrow letters
- Links \rightarrow Implications

Soundness is the property of only being able to prove "true" things. Completeness is the property of being able to prove all true things.

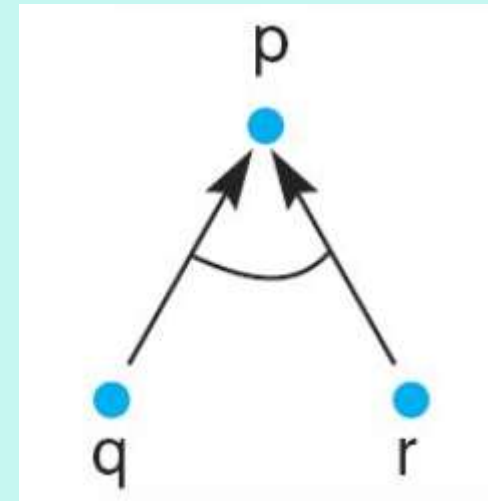


And/Or Graph

- OR – Separate
- AND – connected



$$q \vee r \rightarrow p$$



$$q \wedge r \rightarrow p$$

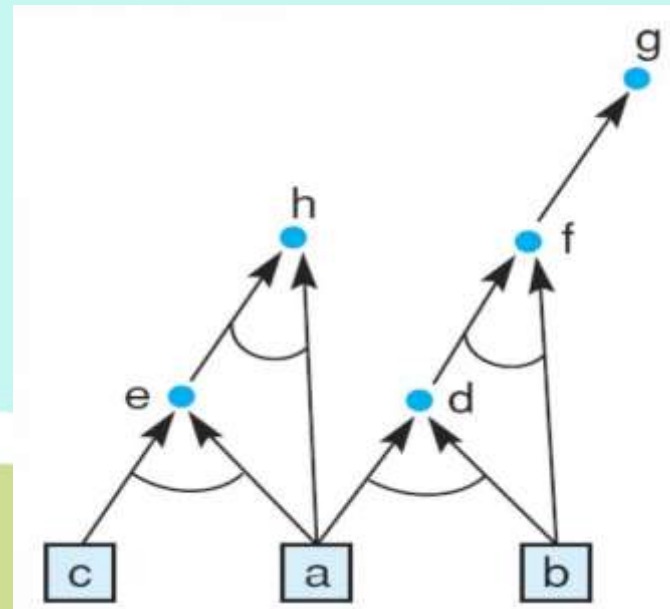


HYPERGRAPH

- A hypergraph consists of :
 - N , a set of nodes
 - H , a set of hyperarcs defined by ordered pairs in which the first element of the pair is a single node from N and the second element is a subset of N
- Ordinary graph – Special case of hypergraph in which all sets of descendant nodes have a cardinality of 1
- k -connectors – k is the cardinality of the set of descendant nodes

Example:

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



Example 1:

1. Fred is a collie.
2. Sam is Fred's master.
3. The day is Saturday.
4. It is cold on Saturday.
5. Fred is trained.
6. Spaniels are good dogs and so are trained collies.
7. If a dog is a good dog and has a master then he will be with his master.
8. If it is Saturday and warm, then Sam is at the park.
9. If it is Saturday and not warm, then Sam is at the museum..



Draw the AND/OR graph using the data-driven strategy to find the location of fred, i.e., evaluate the goal location(fred,X).



Example 1:

1. Fred is a collie.
2. Sam is Fred's master.
3. The day is Saturday.
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8. If it is Saturday and warm, then Sam is at the park.
9. If it is Saturday and not warm, then Sam is at the museum..

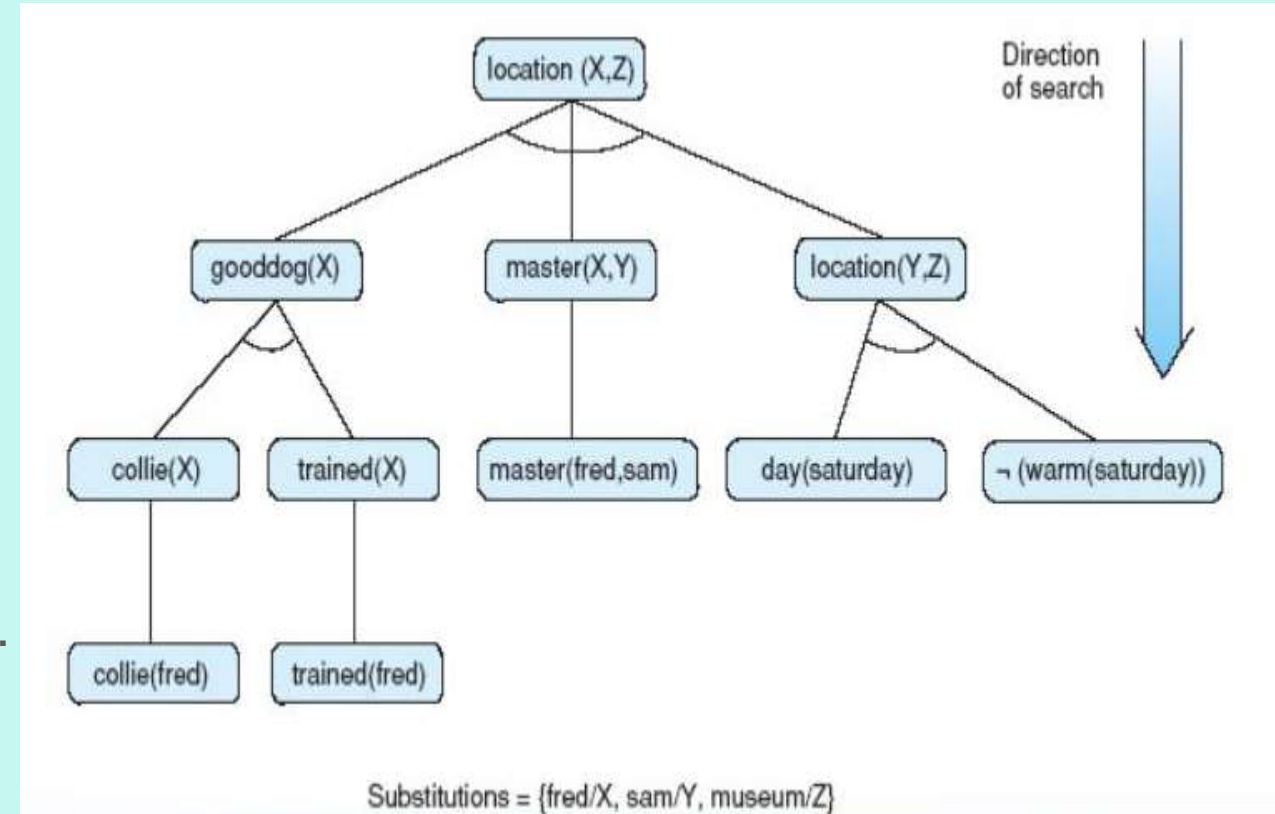
1. **collie(fred).**
2. **master(fred,sam).**
3. **day(saturday).**
4. **\neg (warm(saturday)).**
5. **trained(fred).**
6. **$\forall X[\text{spaniel}(X) \vee (\text{collie}(X) \wedge \text{trained}(X)) \rightarrow \text{gooddog}(X)]$**
7. **$\forall (X,Y,Z) [\text{gooddog}(X) \wedge \text{master}(X,Y) \wedge \text{location}(Y,Z) \rightarrow \text{location}(X,Z)]$**
8. **$(\text{day}(\text{saturday}) \wedge \text{warm}(\text{saturday})) \rightarrow \text{location}(\text{sam},\text{park}).$**
9. **$(\text{day}(\text{saturday}) \wedge \neg (\text{warm}(\text{saturday}))) \rightarrow \text{location}(\text{sam},\text{museum}).$**

Draw the AND/OR graph using the data-driven strategy to find the location of fred, i.e., evaluate the goal $\text{location}(\text{fred},X)$.



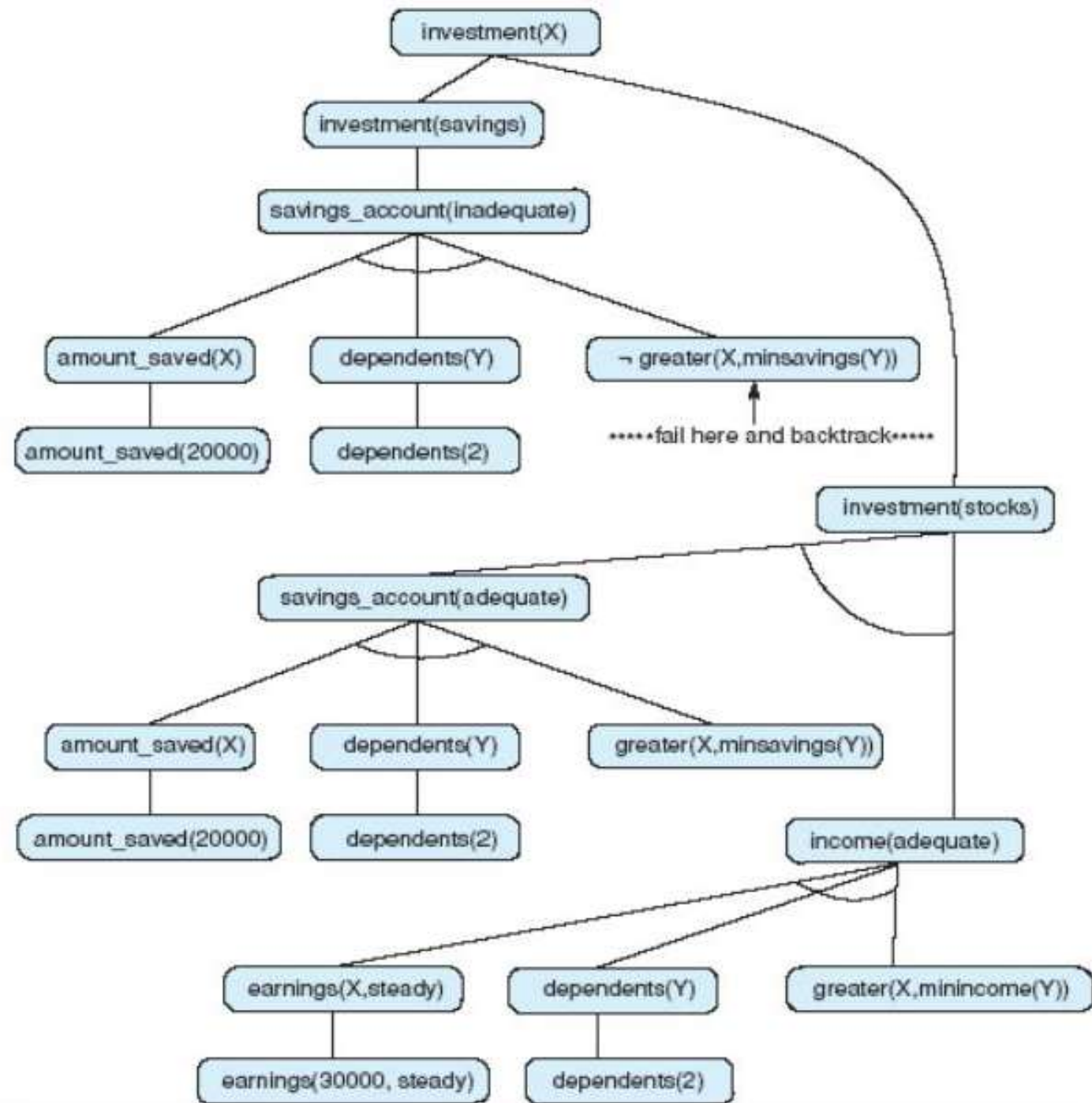
AND/OR Graph for Example 1

1. **collie(fred).**
2. **master(fred,sam).**
3. **day(saturday).**
4. **\neg (warm(saturday)).**
5. **trained(fred).**
6. **$\forall X[\text{spaniel}(X) \vee (\text{collie}(X) \wedge \text{trained}(X)) \rightarrow \text{gooddog}(X)]$**
7. **$\forall (X,Y,Z) [\text{gooddog}(X) \wedge \text{master}(X,Y) \wedge \text{location}(Y,Z) \rightarrow \text{location}(X,Z)]$**
8. **$(\text{day(saturday)} \wedge \text{warm(saturday)}) \rightarrow \text{location(sam,park)}.$**
9. **$(\text{day(saturday)} \wedge \neg (\text{warm(saturday)})) \rightarrow \text{location(sam,museum)}.$**



AND/OR GRAPH FOR FINANCIAL ADVISOR PROBLEM

Example 2



WATER JUG PROBLEM

- You are given two jugs, a 4-gallon one and a 3-gallon one. Neither has any measuring mark on it. There is a pump that can be used to fill the jugs with water. How can you get exactly 2 gallons of water into the 4-gallon jug?



