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1.) Problem Solving using search

- (i) States are treated as a black box - an indivisible structure.
- (ii) The problem is solved when the current state matches one of the goal states.
- (iii) They use problem and domain-specific heuristics to find solutions.
- (iv) The states ~~can~~ support direct tests to determine if it's a goal state.

Constraint Satisfaction problem

- (i) States are treated as a structure made up of different components - a set of variables, each of which is assigned some value.
- (ii) The problem is solved when each variable is assigned a value that satisfies all the constraints on the variable.
- (iii) They use general-purpose heuristics
- (iv) The goal test is determined by ~~checking~~ whether or not the set of constraints on variable values are satisfied.

Cryptarithmic Problem

- Variables:  $\{D, E, A, R, U, M, C_1, C_2, C_3\}$
- Domains:  $\{0, 1, 2, 3, 4, 5, 6, 7, 8, 9\}$  for each variable
- Constraints:  $\text{Alldiff}(D, E, A, R, U, M)$ 
  - $R + R = M + 10 \cdot C_1$
  - $C_1 + A + A = U + 10 \cdot C_2$
  - $C_2 + E + E = R + 10 \cdot C_3$
  - $C_3 = D$ ,
  - $E \neq 0, D \neq 0$ .

 $C_3 \ C_2 \ C_1$ 

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We know that the sum of two one-digit numbers plus a carry can at most be 19, i.e.

$$C_2 + E + E \leq 19$$

$\Rightarrow C_3$  can at most be 1.

Since  $C_3 = D$ , and the constraint  $D \neq 0$  exists,  $D$  must be 1.

$$\therefore, \underline{C_3 = D = 1}$$

$$\begin{array}{r} \phantom{1} C_2 C_1 \\ \phantom{1} E A R \\ + \phantom{1} E A R \\ \hline D R U M \end{array}$$

$$\text{Now, } C_2 + 2E = 10 + R$$

if  $R$  is even,  $C_2 = 0$

if  $R$  is odd,  $C_2 = 1$

Out of these <sup>two</sup> alternatives, let's first explore  $C_2 = 0$

Since  $C_2 = 0$ ,  $R$  must be even.

Possible values for  $R = \{2, 4, 6, 8\}$

and,

$$2E = 10 + R$$

$\therefore$ , possible values for  $E = \{6, 7, 8, 9\}$

Now,

$$C_1 + 2A = U (\because C_2 = 0)$$

Again, two alternatives for  $C_1$  exist. Let's first explore  $C_1 = 1$

then,

$$1 + 2A = U, \text{ i.e. } U \text{ is odd.}$$

$$2R = 10 + M$$

Since  $C_1 = 1$ ,  $R$  can't be any of  $\{2, 4\}$  since that will not generate a carry.

Thus, possible values of  $R = \{6, 8\}$

possible values of  $E = \{8, 9\}$

$$\begin{array}{r} \phantom{1} 0 \phantom{1} \\ \phantom{1} E A R \\ + \phantom{1} E A R \\ \hline 1 \phantom{0} R U M \end{array}$$

Let  $R = 6$ .

then,  $E = 8$ , ( $\because 2E = 10 + R$ )

and,  $M = 2$  ( $\because 2R = 10 + M$ )

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Now,  $1 + 2A = U$

Possible values of  $A = \{3, 4\}$

(all other values are either taken or generate a carry.)

$\therefore$  possible values of  $U = \{7, 9\}$  ( $\because 1 + 2A = U$ )

Let  $A = 3$ ,  
then,  $U = 7$

$$\begin{array}{r} 1 \quad 0 \quad 1 \\ 8 \quad 3 \quad 6 \\ \hline 1 \quad 6 \quad 7 \quad 2 \end{array}$$

$$\begin{array}{r} 1 \quad 0 \quad 1 \\ 8 \quad 3 \quad 6 \\ \hline 1 \quad 6 \quad 7 \quad 2 \end{array}$$

All constraints are satisfied. Therefore, this is one of the solutions of the problem.

Variable Values

$$C_3 = D = 1, C_2 = 0, C_1 = 1$$

$$R = 6$$

$$E = 8$$

$$M = 2$$

$$A = 3$$

$$U = 7$$

There can be many more solutions that take different choices for  $C_2, C_1$ , and other possible values for  $R$ , and  $A$ . For example, another solution is if we choose  $A = 4 (\Rightarrow U = 9)$

$$\begin{array}{r} 1 \quad 0 \quad 1 \\ 8 \quad 4 \quad 6 \\ + \quad 8 \quad 4 \quad 6 \\ \hline 1 \quad 6 \quad 9 \quad 2 \end{array}$$



2.) Types of Knowledge Representation techniques:

(i) Logic-based representations: contain facts, premises, rules for propositional logic, predicate logic, etc. They have well defined syntax and semantics and ~~eff~~ inferencing techniques (which may or may not be very efficient).

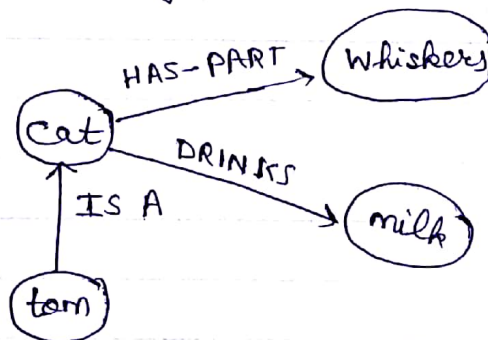
eg:  $HUMAN(x)$ :  $x$  is a human  
 $MORTAL(x)$ :  $x$  is mortal

then, the sentence "all humans are mortal" is represented as:

$$\forall x \ HUMAN(x) \rightarrow MORTAL(x).$$

(ii) Semantic Networks: allow us to define relations using nodes and links. Related information is bound together using these links.

eg:



only restricted inference based on inheritance is supported.

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(iii) Frames : Knowledge about an object or an event is stored together in memory as a unit. They consist of slot and slot values. The slots specify general or specific characteristics of the entity which the frame represents.

eg:

~~Name:~~  
~~Subclass:~~  
~~Size:~~  
~~has part:~~

eg:

Elephant:

subclass: mammal

size: large

has part: trunk

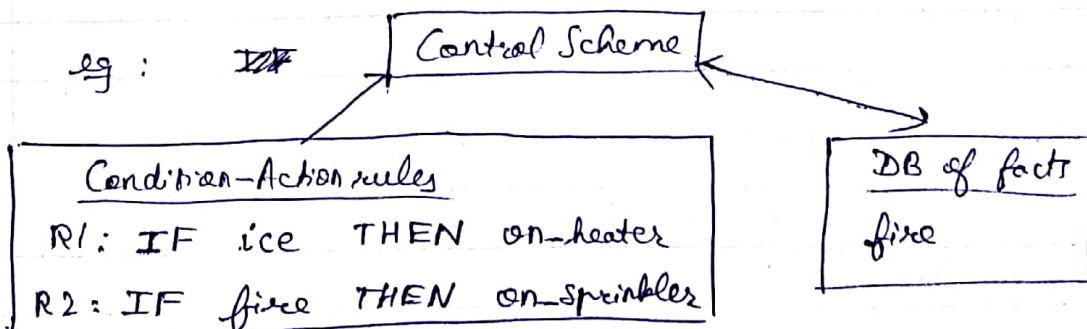
Nellie

instance of: Elephant

likes: Banana.

(iv) Rule-based representations are used in some specific problem solving context. They involve production rules that say what to do, given various conditions are satisfied.

eg:



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Sentence S: Someone walked slowly to the supermarket

Lexicon L

Pronoun  $\rightarrow$  someone

Verb  $\rightarrow$  walked

Adv  $\rightarrow$  slowly

Prep  $\rightarrow$  to

Article  $\rightarrow$  the

Noun  $\rightarrow$  Supermarket

Grammar A

$S \rightarrow NP VP$

$NP \rightarrow \text{Pronoun} / \text{Article Noun} / \text{Noun}$

$VP \rightarrow VP PP / VP Adv Adv / \text{Verb}$

~~$VP \rightarrow VP PP$~~

$Prep \rightarrow Prep NP$

Attempt to derive S using grammar A and given lexicon

$S \Rightarrow NP VP$

$\Rightarrow \text{Pronoun } VP$

$\Rightarrow \text{someone } VP$

$\Rightarrow \text{someone } \vee$

$\Rightarrow \text{someone walked}$   
fail!

or  $S \Rightarrow NP VP$

as before,  $\Rightarrow \text{someone } VP$

$\Rightarrow \text{someone } VP PP$

no grammar rules for PP! fail!

or  $S \Rightarrow NP VP$

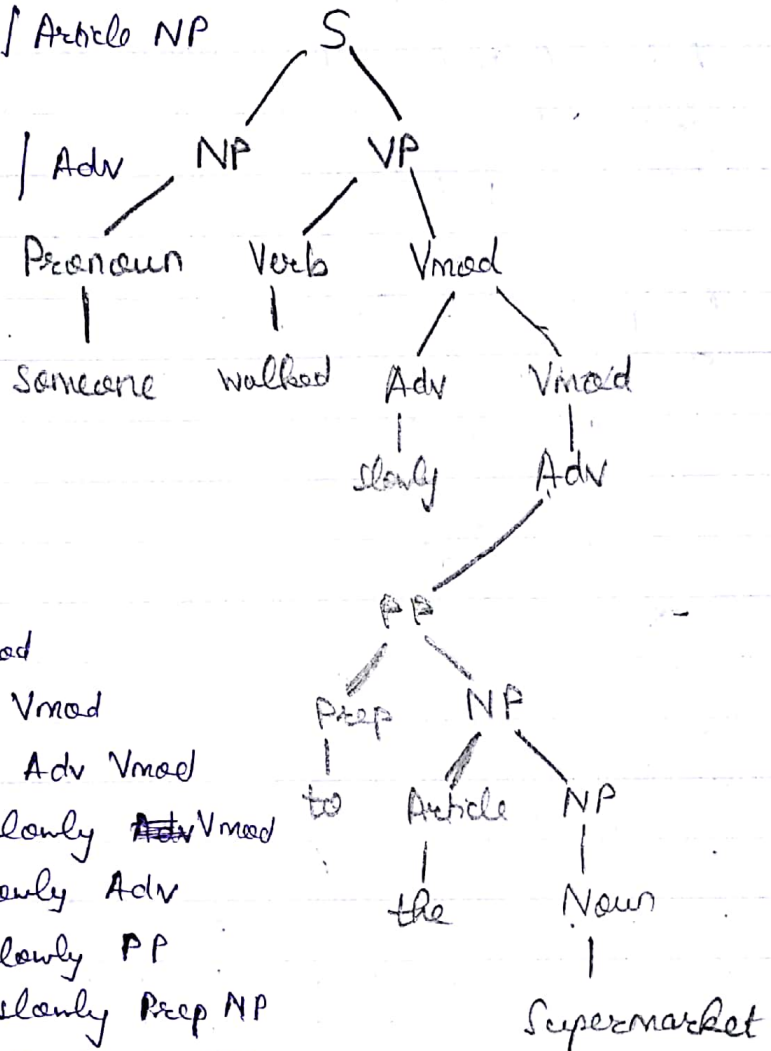
$\Rightarrow \text{someone } VP Adv Adv$

This will keep generating either verbs  
or adverbs, and we will not get  
the sentence ever.

Therefore, grammar A  
doesn't generate the  
given sentence,



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Grammar B $S \rightarrow NP VP$  $NP \rightarrow \text{Pronoun} / \text{Noun} / \text{Article } NP$  $VP \rightarrow \text{Verb } V_{\text{mod}}$  $V_{\text{mod}} \rightarrow \text{Adv } V_{\text{mod}} / \text{Adv}$  $\text{Adv} \rightarrow PP$  $PP \rightarrow \text{Prep } NP$ Parse tree for Grammar BAttempt to derive S $S \Rightarrow NP VP$  $\Rightarrow \text{Pronoun } VP$  $\Rightarrow \text{someone } VP$  $\Rightarrow \text{someone Verb } V_{\text{mod}}$  $\Rightarrow \text{someone walked } V_{\text{mod}}$  $\Rightarrow \text{someone walked Adv } V_{\text{mod}}$  $\Rightarrow \text{someone walked slowly } \text{Adv } V_{\text{mod}}$  $\Rightarrow \text{someone walked slowly Adv}$  $\Rightarrow \text{someone walked slowly PP}$  $\Rightarrow \text{someone walked slowly Prep NP}$  $\Rightarrow \text{someone walked slowly to NP}$  $\Rightarrow \text{someone walked slowly to Article NP}$  $\Rightarrow \text{someone walked slowly to the NP}$  $\Rightarrow \text{someone walked slowly to the supermarket.}$ 

Success!

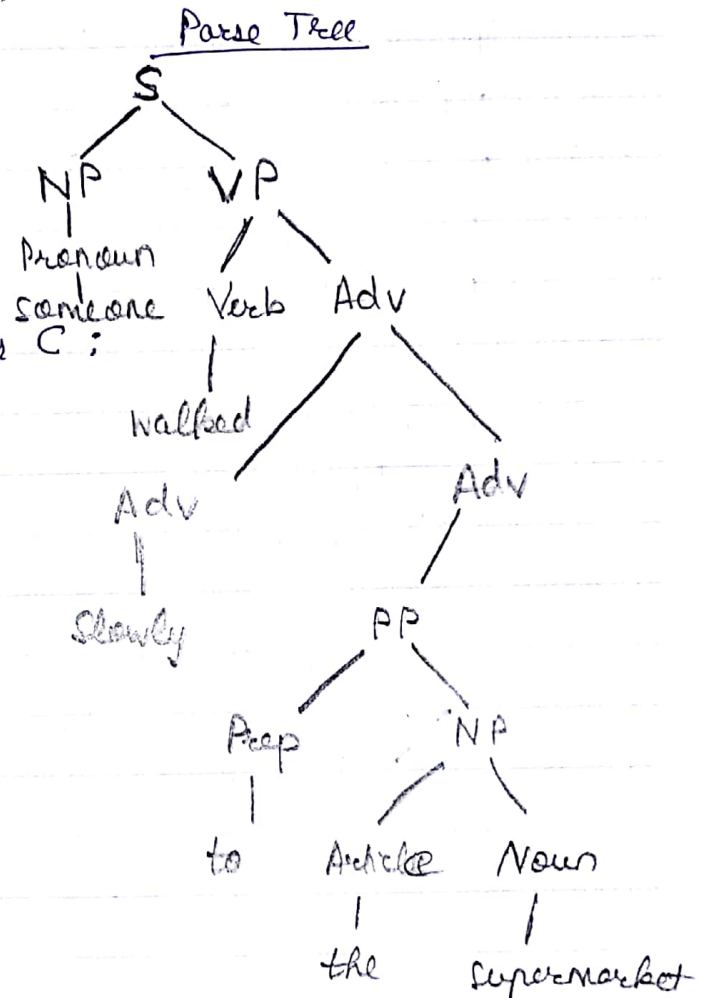
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Grammar C $S \rightarrow NP VP$  $NP \rightarrow \text{Pronoun} \mid \text{Article NP} \mid \text{Noun}$  $VP \rightarrow \text{Verb Adv}$  $\text{Adv} \rightarrow \text{Adv Adv} \mid PP$ ~~Adv Adv~~ $PP \rightarrow \text{Prep NP}$ 

Attempt to derive S using grammar C:

 $S \Rightarrow NP VP$  $\Rightarrow \text{Pronoun VP}$  $\Rightarrow \text{Someone VP}$  $\Rightarrow \text{Someone Verb Adv}$  ~~$\Rightarrow \text{Someone slowly Adv}$~~  ~~$\Rightarrow \text{Someone slowly Adv Adv}$~~  ~~$\Rightarrow \text{Someone slowly}$~~  $\Rightarrow \text{Someone walked Adv}$  $\Rightarrow \text{Someone walked Adv Adv}$  $\Rightarrow \text{Someone walked slowly Adv}$  $\Rightarrow \text{Someone walked slowly PP}$  $\Rightarrow \text{Someone walked slowly Prep NP}$  $\Rightarrow \text{Someone walked slowly to NP}$  $\Rightarrow \text{Someone walked slowly to Article NP}$  $\Rightarrow \text{Someone walked slowly to the NP}$  $\Rightarrow \text{Someone walked slowly to the Noun}$  $\Rightarrow \text{Someone walked slowly to the supermarket}$ 

Success!





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- 3.) • A heuristic function,  $h(n)$  denotes the estimated cost of the cheapest path from the state at node  $n$  to a ~~goal~~ goal state.
- A heuristic function is said to underestimate when the heuristic's estimate is lower than the actual path cost.
  - A heuristic function is said to overestimate when the heuristic's estimate is higher than the actual path cost.

Conditions for optimality of  $A^*$ :

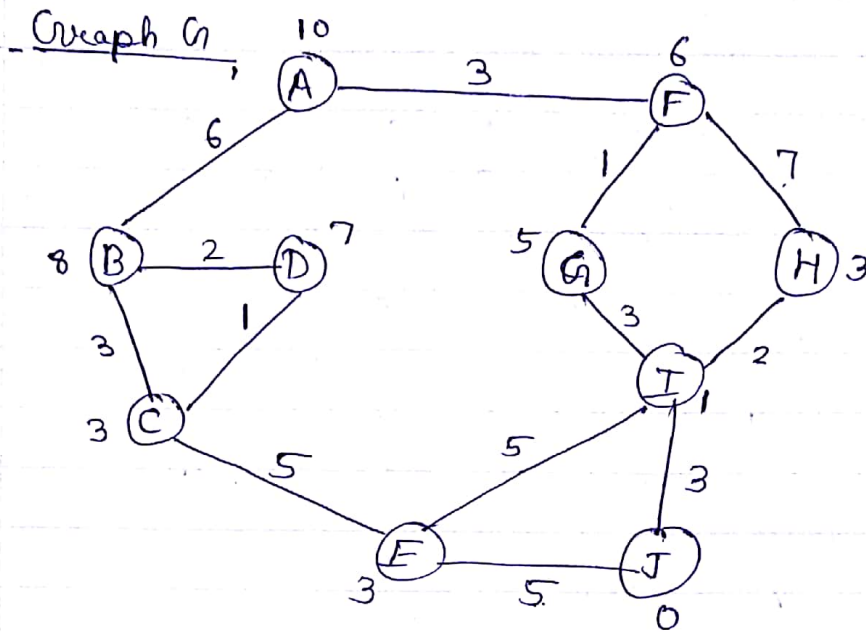
- (i)  $h(n)$  must be an admissible heuristic - i.e., a heuristic that never overestimates the cost to reach the goal.
- (ii)  $h(n)$  must be consistent - for every node  $n$  and every successor  $n'$  of  $n$  generated by some action  $a$ ,

$$h(n) \leq c(n, a, n') + h(n')$$

estimated cost of reaching the goal from $n$	step cost of getting from $n$ to $n'$	estimated cost of reaching the goal from $n'$
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numbers on edges: distance between nodes.

numbers on node:  $h(n)$ ,  $n = A, B, \dots, J$ .

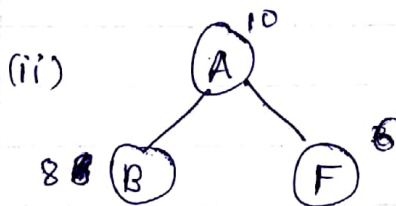
Best path from start state A to goal state J:

(a) Greedy Best First Search algorithm

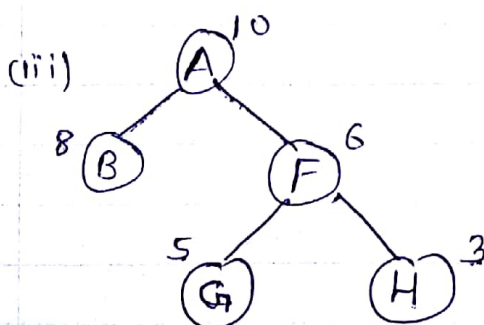
only at each step, select the node with the lowest heuristic value out of the nodes generated so far.

(i) A<sup>10</sup>

only one node, so we expand it to generate successor nodes.



node F is the most promising, so expand F next.  
successor nodes C and H are produced.

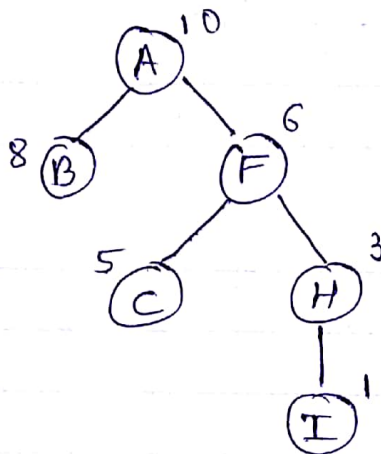


node H is the most promising,  
so we expand node H to  
generate successor node I.

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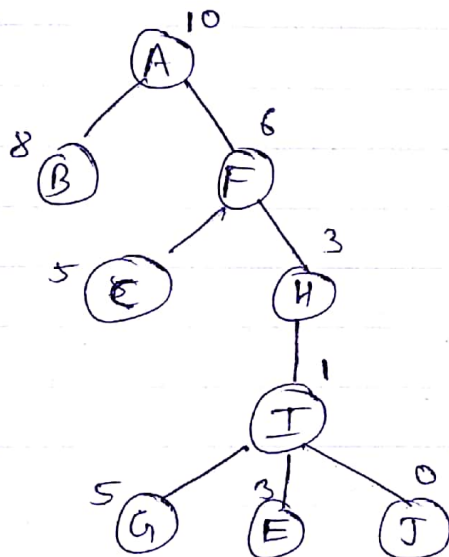
(11)

(iv)



node I most promising.  
 $\therefore$ , generate successor nodes  
 G, E, J

(v)



node J most promising,  
 and it is the goal state.

Thus, we have reached the  
 goal state.

Best path:  $A \rightarrow F \rightarrow H \rightarrow I \rightarrow J$

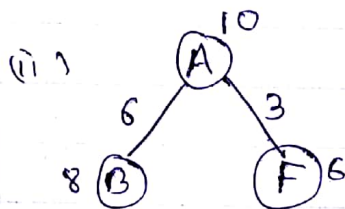
Actual cost of path =  $3 + 7 + 2 + 3 = 15$



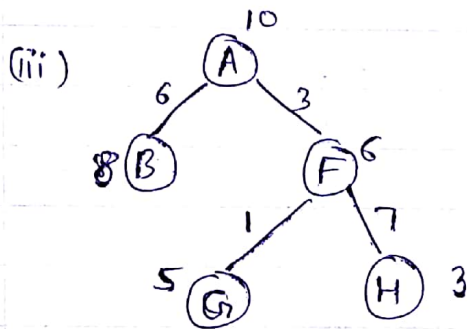


(b) A\* algorithm  $f(n) = g(n) + h(n)$   
 choose lowest  $f(n)$  at each step.  
 (cost of edge) (heuristic)

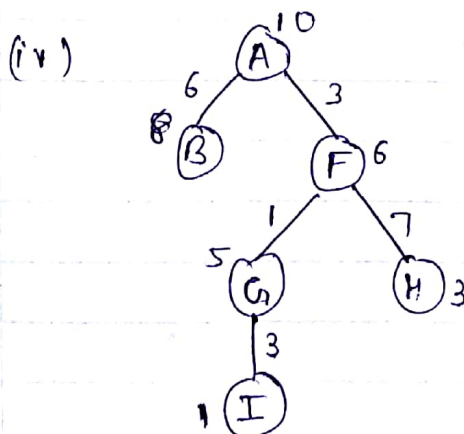
(i) (A)<sup>10</sup>  
 only one node, expand to generate successor nodes.



$f(B) = 6 + 8 = 14$   
 $f(F) = 3 + 6 = 9$   
 $\therefore$  F is more promising  
 Expand F.



$f(G) = 3 + 1 + 5 = 9$   
 $f(H) = 3 + 7 + 3 = 13$   
 $\therefore$  G is more promising  
 Expand G.

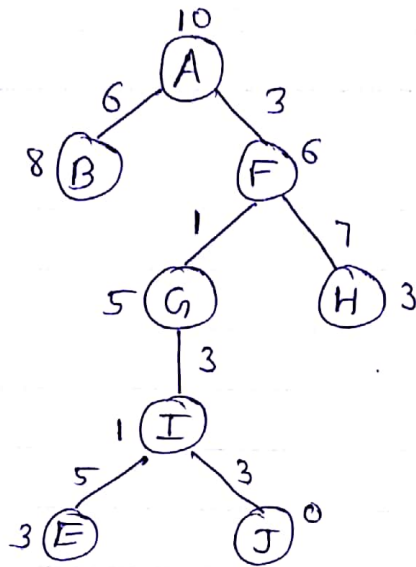


$f(I) = 3 + 1 + 3 + 1 = 8$   
 $\therefore$  I is more promising  
 Expand I.

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(2)



$$f(E) = 3 + 1 + 3 + 5 + 3 = 15$$

$$f(J) = 3 + 1 + 3 + 3 + 0 = 10$$

J is more promising,  
and J is a goal node!

Thus, we have reached the  
goal.

Best path using  $A^*$ :

$A \rightarrow F \rightarrow G \rightarrow I \rightarrow J$

Actual Cost of path = 10

Clearly, this path is better than greedy Best first search.

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5.) Let the predicates be:LOVES( $x, y$ ) :  $x$  loves  $y$ ANIMAL( $y$ ) :  $y$  is an animalKILLS( $x, y$ ) :  $x$  kills  $y$ CAT( $y$ ) :  $y$  is a cat(a) Sentences in Predicate Logic

$$A1: \forall x (\forall y \text{ ANIMAL}(y) \rightarrow \text{LOVES}(x, y)) \rightarrow (\exists z \text{ LOVES}(z, x))$$

A2:

$$A2: \forall x (\exists y \text{ ANIMAL}(y) \wedge \text{KILLS}(x, y)) \rightarrow (\forall z \sim \text{LOVES}(z, x))$$

$$A3: \forall y \text{ ANIMAL}(y) \rightarrow \text{LOVES}(\text{Jack}, y)$$

$$A4: \text{KILLS}(\text{Jack}, \text{Pussy}) \vee \text{KILLS}(\text{John}, \text{Pussy})$$

$$A5: \forall y \text{ CAT}(y) \rightarrow \text{ANIMAL}(y)$$

$$A6: \text{CAT}(\text{Pussy})$$

(b) Prefix/Normal FormA1• Eliminate  $\rightarrow$ 

$$\forall x (\sim (\sim \forall y \text{ ANIMAL}(y) \vee \text{LOVES}(x, y)) \vee (\exists z \text{ LOVES}(z, x)))$$

• Move negations inward

$$\forall x \exists z (\sim (\exists y \sim \text{ANIMAL}(y) \wedge \sim \text{LOVES}(x, y)) \vee (\exists z \text{ LOVES}(z, x)))$$

$$\forall x \exists z \forall y (\text{ANIMAL}(y) \vee \text{LOVES}(x, y) \vee \exists z \text{ LOVES}(z, x))$$



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(b) Prenex Normal formA1(i) eliminate  $\rightarrow$ 

$$\forall x (\sim \forall y (\text{ANIMAL}(y) \vee \text{LOVES}(x, y))) \vee \exists z \text{LOVES}(z, x)$$

(ii) move negations inward

$$\forall x \exists y (\text{ANIMAL}(y) \wedge \sim \text{LOVES}(x, y)) \vee (\exists z \text{LOVES}(z, x))$$

(iii) renaming not necessary - bring quantifiers to the front

$$\forall x \exists y \exists z (\text{ANIMAL}(y) \wedge \sim \text{LOVES}(x, y)) \vee \exists z (\text{LOVES}(z, x))$$

A2

$$\begin{aligned} & \forall x (\sim \exists y (\text{ANIMAL}(y) \wedge \text{KILLS}(x, y))) \vee (\forall z \sim \text{LOVES}(z, x)) \\ & \equiv \forall x (\forall y (\sim \text{ANIMAL}(y) \vee \sim \text{KILLS}(x, y))) \vee \forall z \sim \text{LOVES}(z, x) \\ & \equiv \forall x \forall y \forall z (\sim \text{ANIMAL}(y) \vee \sim \text{KILLS}(x, y) \vee \sim \text{LOVES}(z, x)) \end{aligned}$$

$$\text{A3} \quad \forall y \sim \text{ANIMAL}(y) \vee \text{LOVES}(\text{Jack}, y)$$

$$\text{A4} \quad \text{KILLS}(\text{Jack}, \text{Pussy}) \vee \text{KILLS}(\text{John}, \text{Pussy})$$

$$\text{A5} \quad \forall y \sim \text{CAT}(y) \vee \text{ANIMAL}(y)$$

$$\text{A6} \quad \text{CAT}(\text{Pussy})$$

(c) SkolemizationA1:replace  $y$  by  $f(x)$ replace  $z$  by  $g(x)$ 

drop existential quantifiers

$$\forall x \text{ANIMAL}(f(x)) \wedge \sim \text{LOVES}(x, f(x))$$

$$\forall x (\text{ANIMAL}(f(x)) \wedge \sim \text{LOVES}(x, f(x))) \vee \text{LOVES}(g(x), x)$$

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A2: already in skolemized form

$$\forall x \forall y \forall z \quad \sim \text{ANIMAL}(y) \vee \sim \text{KILLS}(x, y) \vee \sim \text{LOVES}(z, x)$$

$$\underline{A3}: \forall y \quad \sim \text{ANIMAL}(y) \vee \text{LOVES}(\text{Jack}, y)$$

$$\underline{A4}: \text{KILLS}(\text{Jack}, \text{Pussy}) \vee \text{KILLS}(\text{John}, \text{Pussy})$$

$$\underline{A5}: \forall y \quad \sim \text{CAT}(y) \vee \text{ANIMAL}(y)$$

$$\underline{A6}: \text{CAT}(\text{Pussy})$$

(d) Resolution algorithm

- Drop universal quantifiers,
- write each clause on a separate line

~~A1~~ A1 (i)  $\text{ANIMAL}(f(x)) \vee \text{LOVES}(g(x), x)$

(ii)  $\sim \text{LOVES}(x, f(x)) \vee \text{LOVES}(g(x), x)$

$$\underline{A2}: \sim \text{ANIMAL}(y) \vee \sim \text{KILLS}(x, y) \vee \sim \text{LOVES}(z, x)$$

$$\underline{A3}: \sim \text{ANIMAL}(y) \vee \text{LOVES}(\text{Jack}, y)$$

~~A3~~  $\sim \text{ANIMAL}(y) \vee \text{LOVES}(\text{Jack}, y)$

$$\underline{A4}: \text{KILLS}(\text{Jack}, \text{Pussy}) \vee \text{KILLS}(\text{John}, \text{Pussy})$$

$$\underline{A5}: \sim \text{CAT}(y) \vee \text{ANIMAL}(y)$$

$$\underline{A6}: \text{CAT}(\text{Pussy})$$

Question: who killed the cat? Assume negations. First try John

~~A7~~  $\sim \text{KILLS}(\text{Jack}, \text{Pussy})$

$$\underline{A7}: \sim \text{KILLS}(\text{John}, \text{Pussy})$$

Resolving A5 and A6 with the substitution  $\{\text{Pussy}/y\}$ ,

we get:

$$\underline{A9}: \text{ANIMAL}(\text{Pussy})$$

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Resolving  $A3$  and  $A9$ , ~~we get~~ with  $\{Pussy/y\}$ , we get

$A10: \text{LOVES}(\text{Jack}, \text{Pussy})$

Resolving  $A2$  and  $A10$  with  $\{Jack/z, \text{Pussy}/x\}$   
 $A11: \sim \text{ANIMAL}$

Resolving  $A7$  and  $A4$ , we get

$A11: \text{KILLS}(\text{Jack}, \text{Pussy})$

Resolving  $A9$  and  $A2$ , we get. Substitution  $\{Pussy/y\}$   
 $A12: \sim \text{KILLS}(x, \text{Pussy}) \vee \sim \text{LOVES}(z, x)$

Resolving  $A12$  and  $A11$ , we get (substitution  $\{Jack/x\}$ )

$A13: \sim \text{LOVES}(z, \text{Jack})$

Resolving  ~~$A2$~~  as  $A1(ii)$  and  $A3$ , we get  
 $A14: \sim \text{ANIMAL}(f(\text{Jack})) \vee \text{LOVES}(g(\text{Jack}), \text{Jack})$

Resolving  $A14$  and  $A1(i)$ , we get (substitution  $\{Jack/x\}$ )

$A15: \text{LOVES}(g(\text{Jack}), \text{Jack})$

Resolving  $A15$  and  $A13$ , we get

$[ ]$  empty clause  $\rightarrow$  a contradiction.

$\therefore$ , John must have killed the cat, because assuming the negation of this leads to a contradiction.