

8/8/19

## Constraint Satisfaction Problem (CSP)

Not all AI problems are similar to 8-tile puzzle.

They search for the goal state but, with certain constraints which need to be taken care of.

CSP is a kind of assignment problem.

Related terms:

Variables - which need to be assigned value. (distinct & finite)

Domains - possible values (all) of a variable.

Ex:  $V = \{x_1, x_2, x_3, x_4, x_5\}$   
 $D = \{d_1, d_2, d_3, d_4, d_5\}$

$\uparrow \quad \uparrow \quad \uparrow \quad \uparrow \quad \uparrow$   
 M, T, W, Th, F, S, Su.      1..31      Jan, Feb, ..., Dec      2000..3000      1..24

constraints - single or multiple conditions which must be satisfied.

(It is the relationship between the domains)

→ CSP is also called domain reduction/constraint propagation logic.

Cryptarithmic problem

F A T

+ T H A T

A P P L E

[Total 6 distinct alphabets/variables]

Each alphabet must be assigned a value between 0 & 9. This becomes the domain.

constraint:

$C_1$  = distinct no. to each alphabet

$C_2$  = arithmetic operation rule must not be violated.

⇒ The domain is reduced each time an alphabet is assigned a no.

Ex - A is assigned 1

Domain no's become 0, 2, 3, 4, 5, 6, 7,  
8, 9

∴ It is called domain reduction.

③	○	③ ↗		
			constraint being propagated	
8	1	9		
E	A	T		

9	2	1	9	
T	H	A	T	

1	0	0	3	8	1 (0, when 5+5)
A	P	P	L	E	

↑ can be 0

or 1. (since A is an extra alphabet here,  
we take it as 1)

May have more than one solution  
(Cryptarithmic)

Ex: i) Page No. \_\_\_\_\_  
Date \_\_\_\_\_

1	5	6	7
S	E	N	D
1	0	3	5
M	O	R	F

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1	D	6	5	2
M	O	N	E	Y

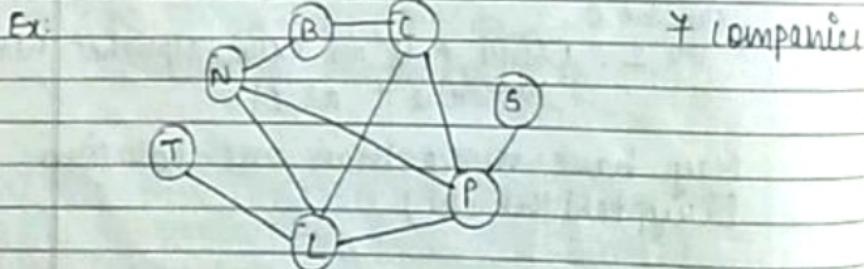
ii) ④

7	4	8	3
B	A	S	E
7	4	5	5
B	A	L	L

1	4	9	3	8
G	A	M	E	S

iii) GERALD      iv) FOUR      v) TWO  
 $\begin{array}{r} + \text{DONALD} \\ \hline \text{ROBERT} \end{array}$        $\begin{array}{r} \text{FOUR} \\ + \text{FOUR} \\ \hline \text{EIGHT} \end{array}$        $\begin{array}{r} \text{TWO} \\ + \text{TWO} \\ \hline \text{FOUR} \end{array}$

vi) C R O S S  
 $\begin{array}{r} + \text{R D A D S} \\ \hline \text{D A N C E R} \end{array}$

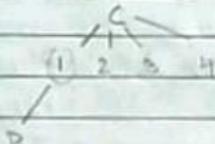


Constraints:

- No. of students want to appear for N, B & C
- No. of students want to appear for L, P & N
- S & P
- L & C
- T, L & N
- C & P

4 dates are available and a student appearing for a company cannot appear for any other company on the same date/day.

T can only come on the first date.



9/8/19 game playing with search (Adversarial Search)

at initial level:

			x	

has same  
weightage,  
 $w_1$

x		
*	x	
*		

will have the same  
weightage,  $w$ .

x		x
*		x
*		x

will have the same  
weightage,  $w_2$

Based on these weightage, the next best move can be chosen (heuristic func.)

The output can be:-  
 Player 1 wins  
 Player 2 wins  
 Tie

Depending on how we want the game to end, the heuristic func is selected.

Calculate weightage as:-

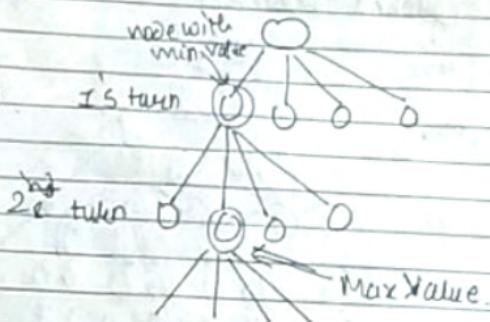
- + When move in favor of player
- When move in favor of opponent

If both the players are using the same heuristic function, one should try to maximize it & other should minimize it.

Ex: Heuristic func. = no. of balloons

- 1 : Min  
2 : Max

(Tic-Tac-Toe)

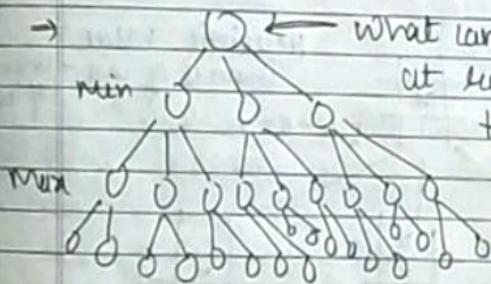


Outcomes:

- 1 wins if: 1 (Max. value)
- Tie if: 0
- 2 wins if: -1 (Min. value)

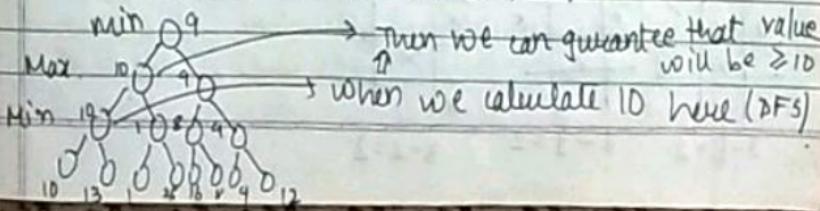
This is MinMax algo. & can be applied only if the universe of the game is predictable

→ What can be maximum value at Root when we have the func. say - as

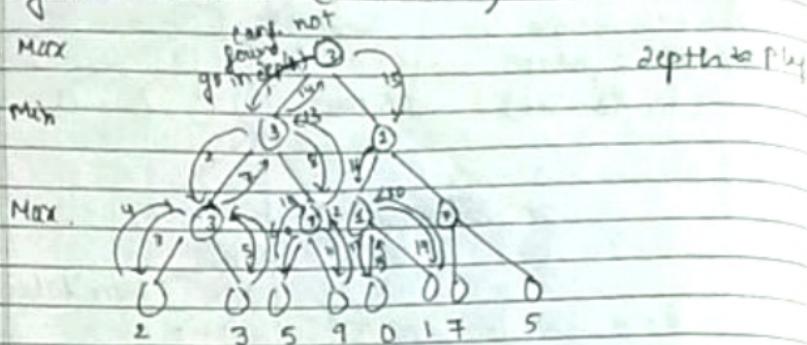


'Minimizing' &  
'Maximizing'  
assuming that

the opponent is optimal, this searching will give the best possible way to win a game & if not, at least end in a tie.



19/6/19 local search (Ex - Hill climbing)  
 global search (Ex - A\*)



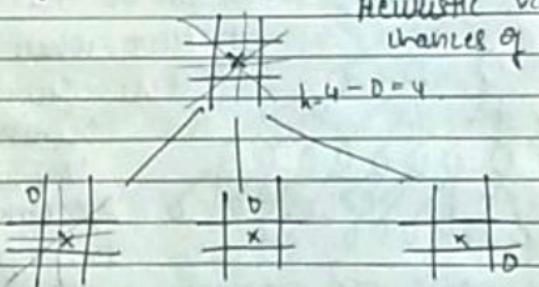
Root node cannot have a heuristic value as it cannot be defined.

Ex:

		x - +1 point
	-	0 - -1 "
	-	tie - 0 "

True, the value for initial state cannot be defined.

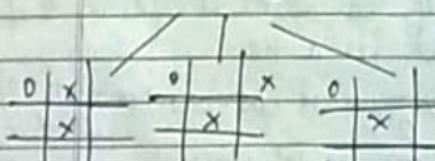
Heuristic value =  
 chances of win - chances  
 of loss



$$3-2=1$$

$$3-1=2$$

$$3-2=1$$

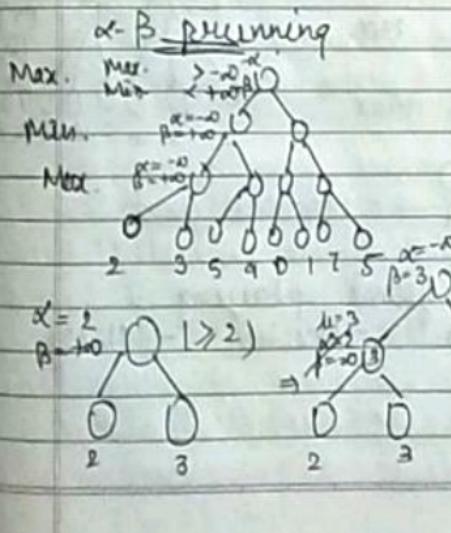
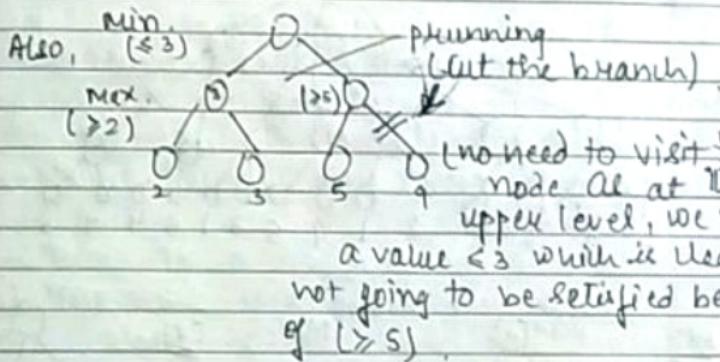
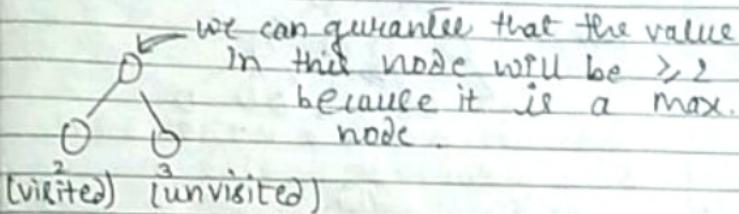


$$3-1=2$$

$$3-1=2$$

$$3-1=2$$

If both the players are playing optimally, what is the maximum possible value that can be achieved at the root node (the goal of MinMax algo)



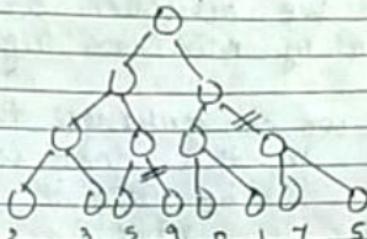
$\Delta$  - max     $\square$  - max    if nothing is specified,  
 $\nabla$  - min.     $O$  - min    root node is considered as  
Page No. \_\_\_\_\_  
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 max. node

At any point, if  $\alpha > \beta$  (of upper layer)  
 it is time to prune the search.

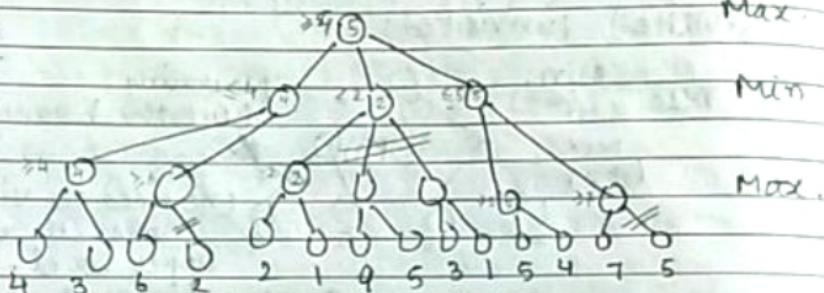
Max.

Min.

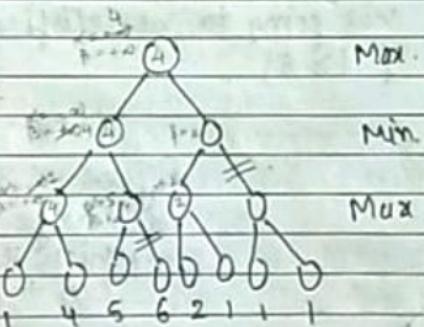
Max.



Ex:

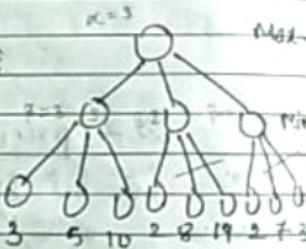


Ex:



Max.

Ex:



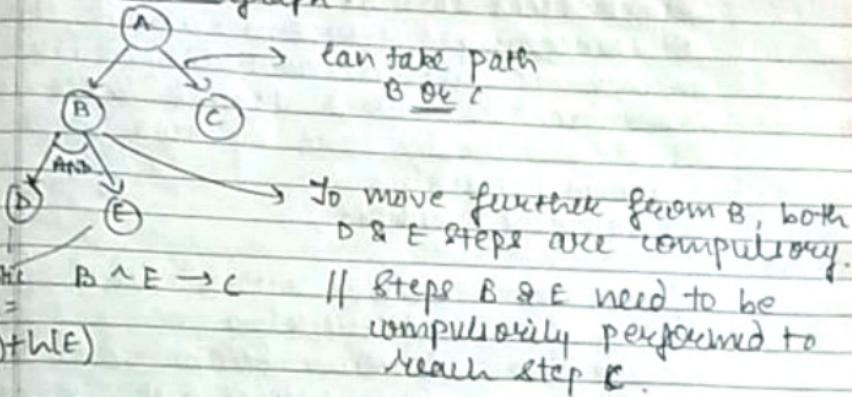
Max.

20/8/19

Application of game playing:

- Go
- Othello
- Checkers
- Chess
- AND-OR graph

## Wid-Or Graph



## Knowledge Representation

Representation of information is important to predict <sup>result</sup> and teach a machine what it is to be done and how it can be done.

- ways:
- i) Proposition logic
  - ii) Predicate logic
  - iii) Semantic Net
  - iv) Frame representation
  - v) Script
  - vi) Fuzzy logic (Uncertainty)

## Proposition logic

Assign a proposition to every sentence

$T \leftarrow$  Today is Tuesday

$R \leftarrow$  It is raining

No. of operations are performed to take a move at a decision.

These steps can be considered as a part of reasoning (Reason about the answer, if this is available). This reasoning is called logical reasoning or it can be done by two ways:

- i) Forward checking
- ii) Backward checking

or full action  
in knowledge base

If we are starting with initial facts, it is forward checking.

If we are starting from goal & want to find the fact for it, it is backward checking (prolog uses forward checking)

#### FORWARD CHECKING

- \* Starts with facts
- \* If no. of goal states are more

#### BACKWARD CHECKING

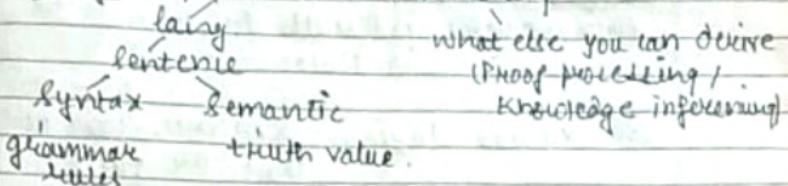
- \* Starts with goal
- \* If no. of goal states are less or single

Ex - To determine whether person belongs to Gandhi family or not.  
Two ways:

- i) Generate entire family tree
- ii) Start with the person and search for Mahatma Gandhi at every parental level. (Backward checking)

Here, Backward checking is more feasible as the no. of nodes generated are comparatively less.

## Knowledge Representation & Reasoning



- The representation varies from person to person or lang. to lang. What is true for one lang. may not be true in some other lang.
- The truth value depends on some prior knowledge

If we have some fact/info. and some new inference can be made by new info derived, it is called entailment.

Any lang. should have:

- Alphabets (Variables)
- connectives ( $\neg, \vee, \rightarrow, \leftrightarrow, \top, \perp$ )

## Propositional logic

- less expressive
- atomic lang. - Every sentence is represented by an atomic variable

$(\neg, \vee)$  is a complete set of notations.  
(we can represent almost everything with these notations). Hence, we prefer writing in disjunctive form.

## Proof Preprocessing

- Two ways: i) Truth table  
ii) Rules

Two-valued logic - Sentence can either be true or false. (in propositional logic)

When going with proof preprocessing, the entire truth table may have three outcomes:

- Tautology - Every case has one value - true.
- Contradiction - Every case has one value - false.
- Satisfiable - Some of the cases have one value - true.

Ex: Your friend, F, is organizing a party. F has A, B, C, D, E friends.

Max. friends should be able to come conditions:

- If B & A both appear, then F will not appear and D will not appear  
if B & E both appear.
- E will appear if C & D appear
- C will only appear if A also appears
- A will only come if A&D B or C appear.

- $\rightarrow$  ①  $A \wedge B \rightarrow \bar{E}$  OR  $A \wedge B \rightarrow \neg E$   
 ②  $B \wedge E \rightarrow \bar{D}$   
 ③  $C \wedge D \rightarrow F$   
 ④  $A \rightarrow C$   
 ⑤  $B \vee C \rightarrow A$

On the end, ①  $\wedge$  ②  $\wedge$  ③  $\wedge$  ④  $\wedge$  ⑤

$\rightarrow$	P	q	$P \oplus q$
T	T	F	
T	F	T	
F	T	T	
F	F	F	

P	q	$P \wedge q$	$P \vee q$	$\neg(P \wedge q)$	$P \vee q \wedge \neg(P \wedge q)$	$P \oplus q$
T	T	T	T	0	0	0
T	F	0	T	1	1	1
F	T	0	T	1	1	1
F	F	0	0	1	0	0

P	q	$P \rightarrow q$	$\neg q \rightarrow \neg P$	$q \rightarrow P$	$(P \rightarrow q) \wedge (q \rightarrow P) \equiv P \leftrightarrow q$
T	T	T	T	T	T
T	F	F	T	0	0
F	T	T	T	0	0
F	F	T	T	T	T

Puzzle: Knight and Knaves puzzle.

28/3/19  $A \rightarrow B$

- if A then B
- A implies B
- B if A

- whenever A, n  
A is sufficient condition

### Equivalences

$$P \vee \neg P = T$$

$$P \wedge \neg P = F$$

$$P \vee F = P$$

$$P \wedge T = P$$

$$P \wedge F = F$$

$$A \text{ unless } B \equiv \neg B \rightarrow A$$

### Associativity

$$(P \vee q) \vee r = P \vee (q \vee r)$$

### Distribution

$$P \vee (q \wedge r) = (P \vee q) \wedge (P \vee r)$$

$$P \rightarrow q \equiv \neg P \vee q$$

$$P \leftrightarrow q \equiv (P \wedge q) \wedge \neg q \rightarrow P$$

### Example:

$$\begin{aligned} & ((k \wedge \neg p) \vee (k \wedge q)) \vee ((\neg k \wedge \neg p) \vee (\neg k \wedge q)) \\ & \equiv (k \vee \neg k) \wedge (\neg p \vee q) \\ & \equiv T \wedge (\neg p \vee q) \\ & \equiv \neg p \vee q \end{aligned}$$

- ①  $\Rightarrow$  1) If John comes he will be very hostile if Sarah is there  
2) Sarah will only come if Kim will be there also  
3) Kim says she will not come unless John does.

$$\rightarrow (P \wedge q \wedge K) \rightarrow K$$

P	q	K	$P \wedge q \wedge K$	$(P \wedge q \wedge K) \rightarrow K$
0	0	0	0	1
0	0	1	0	1
0	1	0	0	1
0	1	1	0	1
1	0	0	0	1
1	0	1	0	1
1	1	0	0	1
1	1	1	1	1

$\therefore (P \wedge q \wedge K) \rightarrow K$  is a tautology.  
(A satisfiable)

Ans ①

$$S \rightarrow \bar{J}$$

~~$S \rightarrow S$~~

~~$J \rightarrow K$~~

S	J	K	$S \rightarrow \bar{J}$	$K \rightarrow S$	$J \rightarrow K$	$\textcircled{1}$	$\textcircled{2}$	$\textcircled{3}$
0	0	0	1	1	1	1	1	1
0	0	1	1	0	1	0	0	0
0	1	0	1	1	0	1	0	1
0	1	1	1	0	1	1	0	1
1	0	0	1	0	1	1	1	0
1	0	1	1	1	1	0	1	0
1	1	0	0	1	0	1	0	0
1	1	1	0	1	1	1	1	0

$$J \quad \bar{J} \quad K \quad \bar{K} \quad \bar{J} \rightarrow K \quad \bar{K} \rightarrow J$$

0	1	0	1	0	0	1
0	1	1	0	1	1	0
1	0	0	1	1	1	1
1	0	1	0	1	1	1

Q. A very special island is inhabited by knight and knave only. Knights always tell truth and knaves always lie. You meet two inhabitants A & B. A says that B is knave and B says that 'Neither A nor I are knaves'. Who is knight and who is knave?

→ A : A is knight

B : B is knight

A	B	$\neg B$	$A \wedge B$
1	1	0	1
1	0	1	0
0	1	0	0
0	0	1	0

→ A is knight

which means what he says ( $B$  is knave) must be true

It is true ( $B = 0$ )

And

what B says must be false  
which is also satisfied

⇒ A : I am not knave

B : A & C are knaves       $\neg(A \wedge C)$

C : I and A are knight

A	B	C	$\neg A \wedge \neg C$	$A \wedge C$
0	0	0	1	0
0	0	1	0	0
0	1	0	1	0

0	1	1	0	0
1	0	0	0	0
1	0	1	0	1
1	1	0	0	0
1	1	1	0	1

If we consider,

Socrates is a man.

All men are mortal.

We cannot represent this in eq.

Proposition logic

We need some more expressive lang.  
Predicate logic is such lang.

Ex: All men are mortal

$$\forall_x \text{man}(x) \rightarrow \text{mortal}(x)$$

Some students are sleeping

$$\exists_x \text{student}(x) \wedge \text{sleeping}(x)$$

Ex: 1) Marcus was a man

$$\text{man}(\text{Marcus})$$

2) Marcus was a Roman

$$\text{Roman}(\text{marcus})$$

3) All men are people

$$\forall_x \text{man}(x) \rightarrow \text{people}(x)$$

4) Caesar was a ruler

$$\text{Ruler}(\text{caesar})$$

5) All Romans were either  
loyal to Caesar or hated  
him

$$\forall_x \text{roman}(x) \rightarrow \\ \text{loyal-to}(x, \text{caesar}) \vee \\ \text{hates}(x, \text{caesar})$$

6) everyone is loyal to  
someone

$$\forall_x \exists_y \text{loyal-to}(x, y)$$

7) People only try to  
assassinate rulers they  
are not loyal to.

$$\forall_x \text{people}(x) \wedge \text{ruler}(y) \\ \neg \text{try-to-assassinate}(x, y) \\ \rightarrow \neg \text{loyal-to}(x, y)$$

8) Marcus tried to assassinate Caesar  
 try to assassinate (Marcus, Caesar)

→ Was Marcus loyal to Caesar?  
 loyal-to (Marcus, Caesar)?

Technique:

- Resolution
- Forward chaining
- Backward chaining

Resolution:

Steps:

- i) Negate the question.  
 $\neg \text{loyal-to}(\text{Marcus}, \text{Caesar})$
- ii) Representation in CNF (conjunctive normal form).

CNF:

a) Eliminate all implications  
 i.e.  $P \rightarrow q \equiv \neg P \vee q$

b) Reduce the scope of all negation to a single term.  
 i.e.  $\neg(A \wedge B \wedge C) \vee D$   
 $\equiv \neg A \vee \neg B \vee \neg C \vee D$

c) Make all variable's name unique  
 $\forall x \text{ man}(x)$  then  
 $\forall x, \exists y \text{ loyal}(x, y)$  cannot use  
 $'x'$

$$A \wedge B \Rightarrow \begin{cases} i) A \\ ii) B \end{cases}$$

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- d) Move quantifiers left. ( $\forall x, \exists y$ )
- e) Eliminate universal quantifiers ( $\forall$ )
- f) Eliminate existential quantifiers ( $\exists$ )
- g) Convert to conjunction or disjunction
- h) Create separate clauses for each conflict.

Ans:

- 1) man (Markus)
  - 2) woman (marcus)
  - $\Rightarrow \exists x \neg \text{man}(x) \vee \text{people}(x)$   
 $\quad \neg \text{man}(x) \vee \text{people}(x)$
  - 3)  $\neg \text{man}(x)$
  - 4) people (y)
  - $\Rightarrow \text{ruler} (\text{Caesar})$   
 $\exists x \neg \text{roman}(x) \vee \text{loyal-to}(x, \text{Caesar})$   
 $\quad \vee \text{hater}(x, \text{Caesar})$
  - 5)  $\neg \text{woman} (y)$
  - 6)  $\text{loyal-to} (y, \text{Caesar})$
  - 7)  $\text{hater} (y, \text{Caesar})$
- $\exists x \exists y \text{ loyal-to}(x, y)$   
8)  $= \text{loyal-to}(p, q)$
- $\neg (\forall x \text{ people}(a) \wedge \text{ruler}(b) \wedge \text{try-to-assassinate}(b, b))$   
 $\quad \vee \neg \text{loyal-to}(a, b)$   
 $\Rightarrow \neg \text{people}(a) \vee \neg \text{ruler}(b) \vee \neg \text{try-to-assassinate}(b, b)$   
 $\quad \textcircled{1} \quad \textcircled{2} \quad \textcircled{3}$   
 $\quad \textcircled{4} \quad \textcircled{5} \quad \textcircled{6}$   
 $\quad \textcircled{7} \quad \textcircled{8} \quad \textcircled{9}$

Now,  $\neg$  loyal to (maxine, caesar)  
is nullified by loyal to (p, q)  
where p is maxine

$\neg$  q is caesar  
(when the new fact is added in the database)

But, when asked that maxine was not loyal to caesar:  
the database exhausts and we know that the statement is true.

28/8/19

## Reasoning

Resolution  
(Proof by contradiction)

forward chaining  
(data-driven)

backward chaining  
(goal-driven)

1 Anyone passing his ks exam and winning the lottery is happy.

$$\forall x \text{ pass-exam}(x, \text{ks}) \wedge \text{win}(x, \text{lottery}) \Rightarrow \text{happy}(x)$$

2 Anyone who studies <sup>or</sup> is lucky can pass <sup>or</sup> his exam.

$$\forall x \forall y \text{ studies}(x) \vee \text{lucky}(x) \Rightarrow \text{pass-exam}(x, y)$$

3. John did not study but, he is lucky.  
 $\neg \text{Studies}(\text{John}) \wedge \text{lucky}(\text{John})$

4) Any one who is lucky wins the lottery.  
 $\text{luck}(x) \rightarrow \text{win}(x, \text{lottery})$

Ex

- 6 -

P

$$\begin{array}{l} (\neg \alpha) \rightarrow R \\ (\beta \vee \gamma) \rightarrow \alpha \\ \hline \end{array}$$

CLAYOSIS

1

$$7P \vee 7Q \vee R$$

טז טו ו

575 V B  
477 V Q

T

四

78

78

$\neg P \vee \neg Q \vee R$

18

P

7 TV 8

78

77

nil

1

$\therefore$  TR is wrong  
 $\Rightarrow$  R is correct

(Proof by contradiction)

Ex.:

man (Makus)

pompeian (maroon)

$\forall x \text{ pompean}(x) \rightarrow \text{roman}(x)$

water (lagoon)

$\forall x \text{ roman}(x) \rightarrow \text{loyal-to}(x, \text{caesar}) \vee \text{hatred}(x, \text{caesar})$

$\forall x \exists y \text{Loyal}(x, y)$

$\forall x \forall y \text{ person}(x) \wedge \text{muler}(y) \wedge \text{try-to-eliminate}_{(x,y)} \Rightarrow$   
 $\neg \text{loyal-to}(x,y)$

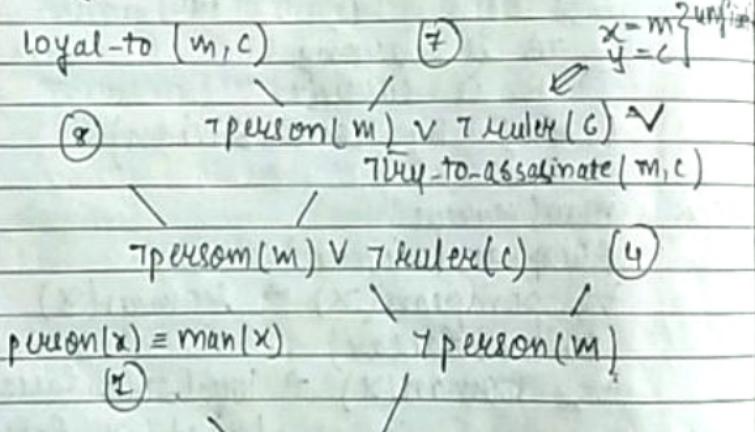
$\neg \text{try-to-assassinate}(\text{markus}, \text{caesar})$

Was markus loyal to caesar?

$\neg \text{loyal-to}(\text{markus}, \text{caesar})$

- 1) man(markus)
- 2)充沛人(markus)
- 3)  $\neg \text{person}(x) \vee \text{human}(x)$
- 4) ruler(caesar)
- 5)  $\neg \text{human}(x) \vee \text{loyal-to}(x, \text{caesar}) \vee$   
hated(x, caesar)
- 6) loyal-to(x, y)
- 7)  $\neg \text{person}(x) \vee \neg \text{ruler}(y) \vee$   
 $\neg \text{try-to-assassinate}(x, y) \vee \neg \text{loyal-to}(x, y)$
- 8)  $\neg \text{try-to-assassinate}(\text{markus}, \text{caesar})$

$\therefore$  By intuition we know,  $\neg \text{loyal-to}(m, c)$  is true, therefore, we start with its negation.



$\therefore$  Our statement:  $\neg \text{try-to-assassinate}(m, c)$  is  $\phi$

wrong and true, we proved that Marcus was not loyal to Caesar.

Ex: Prove that John is happy

$\rightarrow \neg \text{happy}(\text{John}) \quad (1)$

$\neg \text{pass-exam}(J, KS) \vee \neg \text{win}(J, \text{lottery})$

$\neg \text{pass-exam} \wedge \neg \text{lucky}(J) \quad (2)$

$\neg \text{studies}(J) \wedge \neg \text{lucky}(J)$

$\neg \neg \text{pass-exam}(J, KS) \quad (2)$

$\therefore \text{John is happy}$

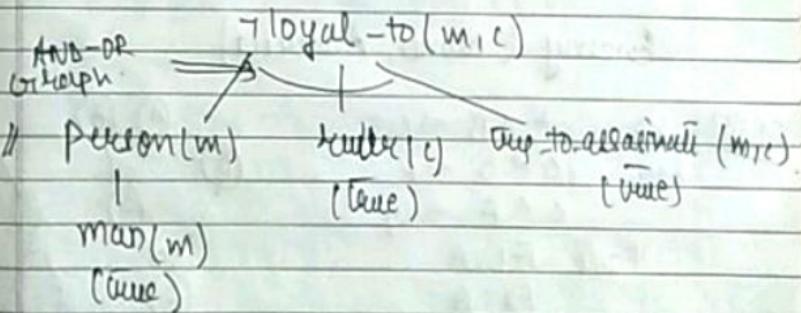
$\neg \neg \text{studies}(J) \vee \text{pass-exam}(J, KS)$   
 $\neg \neg \text{lucky}(J) \vee \text{pass-exam}(J, KS)$

Q. Prove  $\text{hated}(m, c)$

$\neg \text{lucky}(J)$

Backward Chaining

$\rightarrow$  No need to convert in CNF.



$\because$  All are true facts,  $\neg \text{loyal-to}(m, c)$  is correct.

Ex: Law says that it is a crime for an American to sell weapons to hostile nations. The country Nono, an enemy of America, has some missiles, and all of its missiles were sold to it by Col. West who is American.

1. Prove that Col. West is criminal.

$\rightarrow$  American (x)  $\wedge$  weapon (y)  $\wedge$  sells (x, y, z)  $\wedge$  hostile (z)  $\rightarrow$  criminal (x)

$\exists x \text{ Drone } (\text{Nono}, M_i) \wedge \text{Missile } (x)$

$\forall x \text{ Missile } (x) \wedge \text{ Drone } (\text{Nono}, x) \rightarrow$   
 $\text{Sells } (\text{West}, x, \text{Nono})$

Missile (x)  $\rightarrow$  weapon (x)

Enemy (x, America)  $\rightarrow$  Hostile (x)

American (West)

Enemy (Nono, America)

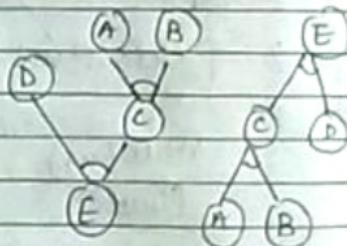
29/8/19 KB: A  $\wedge$  B  $\rightarrow$  C  
Rules: C  $\wedge$  D  $\rightarrow$  F  
C  $\wedge$  F  $\rightarrow$  G

Fact: F1: A

F2: B

F3: D

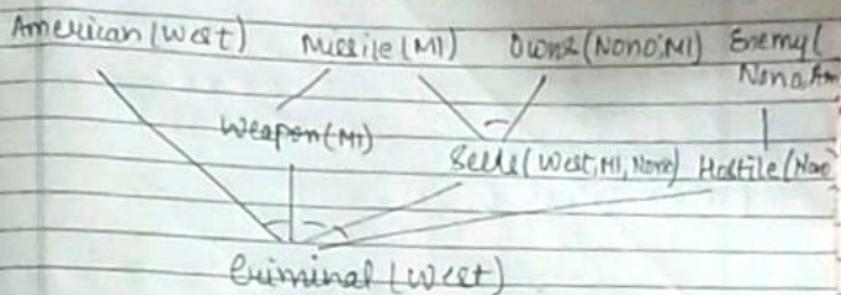
E?



Forward Chaining

Backward Chaining

Forward chaining  
LC West is Criminal Phen.



- ⇒ FC is data-driven, automatic, unconscious processing
- BC is goal driven, appropriate for problem solving & not lesser complexity

- ⇒  $\exists x \text{ Dog}(x) \wedge \text{Owner}(\text{Juck}, x)$
- $\forall x (\exists y \text{ Dog}(y) \wedge \text{Owner}(x, y)) \rightarrow \text{AnimalLover}(x)$
- $\forall x \text{ AnimalLover}(x) \rightarrow (\forall y \text{ Animal}(y) \rightarrow \text{Kills}(x, y))$
- $\text{Kills}(\text{Juck}, \text{Tuna}) \vee \text{Kills}(\text{Curiosity}, \text{Tuna})$
- $\text{Cat}(\text{Tuna})$
- $\forall x (\text{at}(x) \rightarrow \text{Animal}(x))$