

• 2nd half

- predicate calculus
- inferences —  $\left. \begin{array}{l} \text{resolution} \\ \text{refutation} \end{array} \right\}$  on clauses.

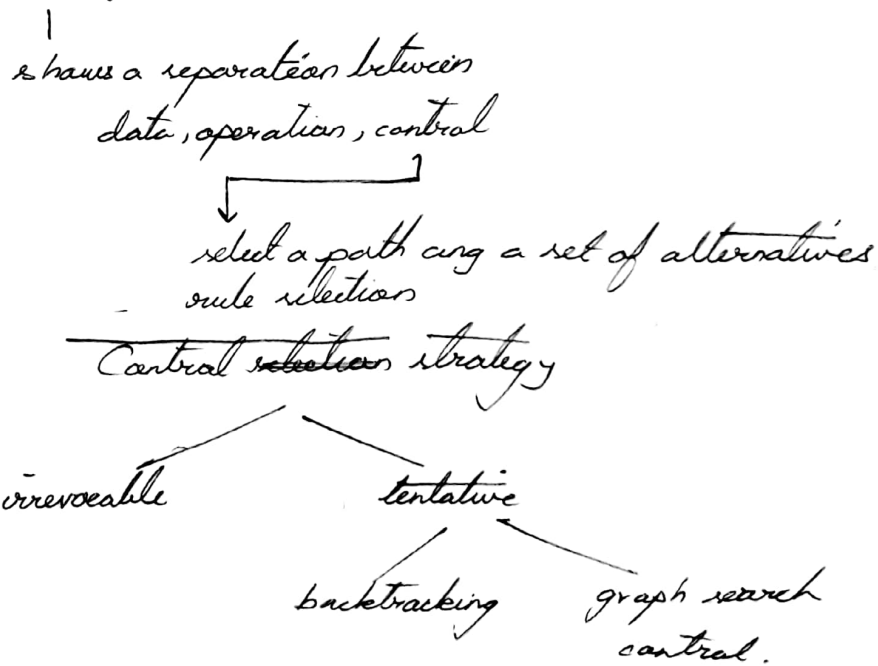
question: i) given a set of sentences, can we prove a given sentence?

ii) uncertainty maintenance

→ game playing

→ neural networks (NN study next week), single layer perceptrons.

AI Production systems:



eg: 8 puzzle problems (4 rules)

Any search problem can be characterised by 4 ~~by~~ tuples:

{ Start node, End node, ~~the~~ <sup>whole</sup> Transition node, Intermediate node }  
node function

procedure production:

1. data = initial data base / variable
2. until data satisfies termination condition 2:

begin: an operator

- select some rule  $R$  in the set of rules that can be applied to data
  - data is the result of applying  $R$  to data
- 

8 puzzle problem:

1		3
2	4	5
7	8	6

1. replace with left
  2. replace with right
  3. replace with bottom
- replace with top inapplicable

} Control strategy determines which one is to be chosen.

FOPL :

Syntax: alphabet of symbols and how wff is formed.  
well formed formula.

Components : predicate symbol

var "

function "

constant "

Nielson Rhode - Principles of AI

• Write (Nielson, Principles of AI) // Predicate Calculus

Write (X, Principles of AI)  $\rightarrow$  Out: X = N. R.

Write (X, Y)

• John's brother and John's sister are siblings to each other

~~Sib~~ ~~Father (J)~~

~~Bro~~

~~Sibling (~~

- ~~• X = Brother (John)~~
- ~~• Y = Sister (John)~~
- ~~• Sibling (X, Y)~~

~~Sil~~

Brother (John) // functions

Sister (John) // functions

Sibling ( Brother (John), Sister (John) ) ✓

• The house is yellow.

↓  
constant.

→ yellow (House 1). // predicate  
or  
color (h1, yellow) ✓

Connectives :

- 1) conjunction
- 2) negation
- 3) disjunction
- 4) implication

• John lives in a yellow house

~~lives (John, h) ∧ house (~~

~~col lives (John, h1)~~

~~live~~ (John, h1) ∧ color (h1, yellow)

~~color h1~~

John lives in yellow house

$$\text{lives}(\text{John}, h1) \wedge \text{color}(h1, \text{yellow})$$

John plays chess as plays badminton

$$\text{plays}(\text{John}, \text{chess}) \wedge \text{plays}(\text{John}, \text{Badminton})$$

If car belongs to John, then its grey

$$\text{Belongs}(\text{John}, c1) \Rightarrow \text{color}(c1, \text{grey})$$

• All elephants are grey

$$\forall x \text{ Elephant}(x) \Rightarrow \text{color}(x, \text{grey})$$

• There is a person who wrote principles of AI

$$(\exists x) \text{ person}(x) \wedge \text{write}(x, \text{P.A.I.})$$

• Whenever statement exists Variables are bounded by quantifiers (bounded variable)

Propositional logic  $\rightarrow$  EOP, FO Predicate logic

$\downarrow$   
So Predicate logic.

(considers quantifiers for functions)

$$\sim (\exists x) P(x) \equiv \forall x (\sim P(x))$$

For every set  $X$  there is set  $Y$  such that cardinality of  $Y$  is greater than  $X$

$$(\forall x) \text{ set}(x) :-$$

$$(\forall x) \text{ set}(x) \rightarrow ($$

$$(\forall x) \text{ set}(x) \Rightarrow (\exists y) (\text{set}(y) \wedge \text{card}(y) > \text{card}(x))$$

$$\nexists (\forall x) \text{ set}(x) \Rightarrow (\exists y) (\text{set}(y) \wedge \text{greater}(\text{card}(y), \text{card}(x)))$$

$$(\forall x) \text{ set}(x) \Rightarrow (\exists y) (\text{set}(y) \wedge \text{card}(x, u) \wedge \text{card}(y, v) \wedge \text{greater}(v, u))$$

### Rules of inference

1)  $w_1 \Rightarrow w_2$

$w_1$  true ...,  $w_2$  true Modus ponens.

### 2) Universal specialisation

$$(\forall n) (w_1(n) \Rightarrow w_2(n))$$

$w_1(A) = \text{true}$ , implies  $w_2(A) = \text{true}$

3)

Substitution  $\rightarrow \{A/n\}$

$$\{ \} \xrightarrow{R_1} \{ \} \xrightarrow{R_2} \{ \}$$

path of  
a solution

$\downarrow$   
 $\{wff\}$

proof

Unification: finding substitutions of terms ~~all~~ for variables

$t/v$   
 $\hookrightarrow$  term can be ruled by  $v$

$\rightarrow c$   
 $\rightarrow f$ , provide does not have  $v$

$$P[u, f(v), B]$$

$$P[3, f(w), B] \quad - \quad S\{3/u, w/v\}$$

$$P[u, f(A), B] \quad - \quad S\{A/v\}$$

$$P[g(3), f(u), B] \quad - \quad S\{g(3)/u, u/v\}$$

$$P[c, f(A), B] \quad - \quad S\{c/u, A/v\}$$

alphabetic variable - ~~variable~~ variable/variable  
 ground instance - ~~can't~~ can't/variable.

$$P(\quad) \quad s_1 = \{ \quad \}$$

$E, s$  (Notation)  
 $\downarrow$  expression  
 $\hookrightarrow$  substitution

$E, s_1, s_2$  (Composition)

$$\frac{\{g(u, v)/z\}}{s_1} \quad \frac{\{A/u, B/v, C/w, D/z\}}{s_2}$$

Not taken since already sub<sup>s</sup>.

$$\cancel{g(A, B)/z} \quad D$$

$$\cancel{g(A, B)/z} \rightarrow w$$

$$\cancel{g(A, B)}$$

$$\{g(A, B)/z, A/u, B/v, C/w\}$$

$\rightarrow$  Substitution applied by applying  $s_2$  to the terms of  $s_1$ , and add any pair of  $s_2$  having variables not occurring in the variables of  $s_1$ .

$$(s_1, s_2) s_3 \xrightarrow{\text{same}} s_1(s_2, s_3)$$

- Composition of substitution is associative

$$s_1 s_2 \neq s_2 s_1$$

- They are not commutative

$$E = \{P[u, f(y), B], P[u, \cancel{B}, f(B), B]\}$$

$$s = \{ /, /, / \}$$

$$s = \{A/u, B/y\} \rightarrow \text{unifier}$$

If I find an  $s$  such that set of expression becomes singleton set

- If all the substitutions are not necessary for singleton set, then  $s$  is not most general unifier

$$\cancel{P[u]} \quad \cancel{[P(u)]} \quad E = \{P(u), P(A)\}$$

$$s = \{A/u\}$$

$$\{P[f(u), y, g(y)], P[f(u), z, g(\cancel{u})]\}$$

$$s = \{y/z\} \quad (MGU)$$

$$\text{Singleton set: } P[f(u), \cancel{y}, g(y)]$$

$$s = \{ \cancel{y/z} \quad u/z \}$$

$$s = \{y/z, \cancel{u/y}, y/u\}$$

MGU



## Disagreement Set

### Unification algorithm iterative

Step 1: Set  $k = 0$  and ~~MGU at  $k$  = null~~  
 $MGU(k) = \text{null}$ .

Step 2: If set  $MGU_k$  is a singleton.  
then stop;  $MGU_k$  is ~~most~~ MGU of  $E$

~~If~~  
otherwise  
find disagreement set  $D_k$  of  $E \setminus MGU_k$

Step 3:  
If there is variable  $v$  and term  $t$  in  $D_k$  such that  
 $v$  does not occur in  $t$ , put  $MGU_{k+1} = \text{~~MGU~~$

$$= MGU_k \{t/v\}$$

Set  $k = k+1$  and return to step 2.

otherwise  
stop  
 $E$  is not unifiable

---

\* Nilsson - 2nd version

$$E = \{P(x, z, y), P(w, v, w), P(A, v, v)\}$$

$$D_0 = \{\cancel{x}, \cancel{w}, \cancel{A}, \cancel{z}, \cancel{v}, y, w, v\}$$

$$D_0 = \{u, w, A \quad z, v \quad y, w, v\}$$

$$\therefore s = \{A/x\}$$

$$D_1 = \{A, w \quad z, v \quad y, w, v\}$$

$$\cancel{P(A, v, v)}$$

$$\cancel{A/u, A/w, v/z}$$

$$s = \{A/u, A/w\}$$

$$D_2 = \{A, z, v, \underline{y}, A, v\}$$

$$\# \quad A/u, A/w, \cancel{A/v}, \cancel{v/z}, \cancel{A/z}, A/y\}$$

$$A, z, y, A, z, A/v, A/z$$

§

$$MSU = \{A/u, A/w, A/v, A/z, A/y\}$$

$$\text{Singleton } S = \{P(A, A, A)\}$$



$\bar{A} \wedge \bar{B}$

1) If  $\rightarrow$  false form

Resolution

$$(x_1) \{ P(x) \Rightarrow \{ \forall y [ P(y) \Rightarrow P(f(u,y)) \wedge \neg(y) ] \} \}$$

$$[ Q(u,y) \Rightarrow P(y) ]$$

$$(x_1) \{ P(x) \Rightarrow \{ \forall y [ P(y) \Rightarrow P(f(u,y)) \wedge \neg(y) ] \} \}$$

1. Eliminate  $\Rightarrow$   $A \Rightarrow B : (A \vee B)$

2. Reduce scope of negation.

3. Standardise var

$$4. \text{Eliminate } \exists \quad [ \forall y ] ( \forall y ) [ ( \exists y ) P(u,y) ]$$

5. Convert to Prenex

6. Put matrix in CNF

7. Put matrix in CNF

8. Eliminate  $\forall$

9. Separate into clauses.

10. Rename vars

$$(x_1) \{ P(x) \Rightarrow \{ \forall y [ P(y) \Rightarrow P(f(u,y)) \wedge \neg(y) ] \} \}$$

$$(x_1) \{ \neg P(x) \wedge \dots \}$$

11) If I just have  $\exists x P(x)$  then (No ~~forall~~  $\forall$ )

then ~~P~~  $P(c)$

$\rightarrow$  Skolem constant

Skolemization (to remove existential quantifiers)

5) Prenex form: All  $\forall$  quantifiers are in front of expression

~~Preform~~ is  $\forall$  part is prefix  
remaining part is matrix.

c)  $n_1 \wedge (n_2 \vee n_3)$

$$-(m_1 \wedge m_2) \vee (m_1 \wedge m_3)$$

Example

$$\textcircled{1} (A_n) \vee (A_j \wedge [A \wedge (P(y) \wedge P(f(y)))]$$

$$\wedge \quad \tilde{\psi}^2(Y) [\tilde{\psi}^2(q(Y) \wedge p(Z))] \quad (\textcircled{3} \text{ done before})$$

$$\textcircled{a} \quad (f_n) \left( \alpha(P_n) \vee (\chi_f[\alpha(P_f) \wedge P(f_n, y)]) \right)$$

$$\exists z [ \varphi(n, z) \vee \sim P(z) ] )$$

$$b) \quad (A) \left( {}^N(P(A)) \vee ((A) [ {}^N(P(A)) \wedge P(A \cup A) ]) \wedge (A) [ Q(A, z) \wedge N(P(z)) ] \right)$$

$$4) \text{ (iii)} \quad \left( \nu(P_M) \vee ((\nabla y) [\nu(P_M) \wedge P(\#f(y))]) \right)$$

$$\bigwedge [Q(h, h(n)) \vee \sim P(h(n))]$$

$$\textcircled{5} (f_n)(x) \left\{ n(P(n)) \vee [n(P(x)) \wedge P(f(n,x))] \right\}$$

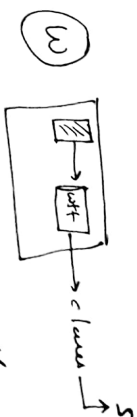
$$v_1 [q(n, h(n)) \vee v_2 p(h(n))]$$

③ Replace  $n_1 \wedge n_2$  into set of clauses  $\{n_1, n_2\}$

④ Remove Replace variables.

Parent Clauses	Resolvent	Converged
$P \text{ and } \neg P \vee Q$	$Q$	Modus Ponens
$P \vee Q \text{ and } \neg P \vee \neg Q$	$Q$	Merge
$P \vee Q \text{ and } \neg P \vee \neg Q$	$P \vee P \text{ and } Q \vee \neg Q$	Tautology
$\neg P \text{ and } P$	NIL	empty clause
$\neg P \vee Q \text{ and } \neg Q \vee R$	$\neg P \vee R$	chain clause

Sign of contradiction



Whether is logically follows from S

\* We would be using Resolvent Refutation along with resolution to prove it.

• We appear to be S of  $\{S \vee \neg S\}$  ultimately gives NIL, then it follows from S. Which 2 parent clauses must be taken so that NIL is produced (search strategy)

## Resolution System for RP

- let  $S$  be set of clauses (base set)

Procedure Resolution:

- Step 1: clauses  $\leftarrow S$
- Step 2: until NIL  $\in$  clauses
- Step 3: begin
- Step 4:
  - select 2 distinct variables clauses  $c_i$  and  $c_j$  from clauses
- Step 5:
  - compute a resolvent  $R_{ij}$  of  $c_i$  and  $c_j$
- Step 6:
  - not produced but adding  $R_{ij}$  to clauses

Example:

- 1) Whence can Read is literate
- 2) Dolphins are not literate
- 3) Some dolphins are intelligent

~~Prove that:~~ Some who are intelligent cannot read.

$$a) \neg (\text{Read}(x) \Rightarrow \text{literate}(x))$$

$$b) \neg \text{literate}(\text{Dolphin}(x)) \Rightarrow \text{literate}(x)$$

$$c) (\exists x) (\text{Dolphin}(x) \wedge \text{Intelligent}(x))$$

~~( $\exists x$ )  $\neg$~~

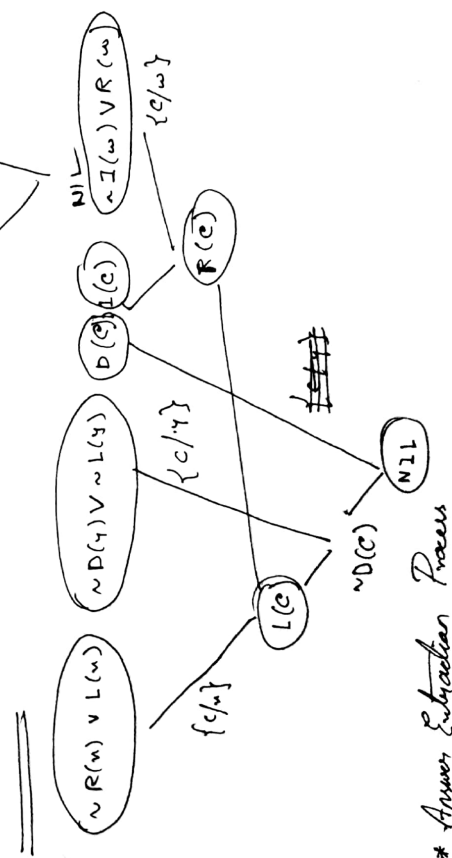
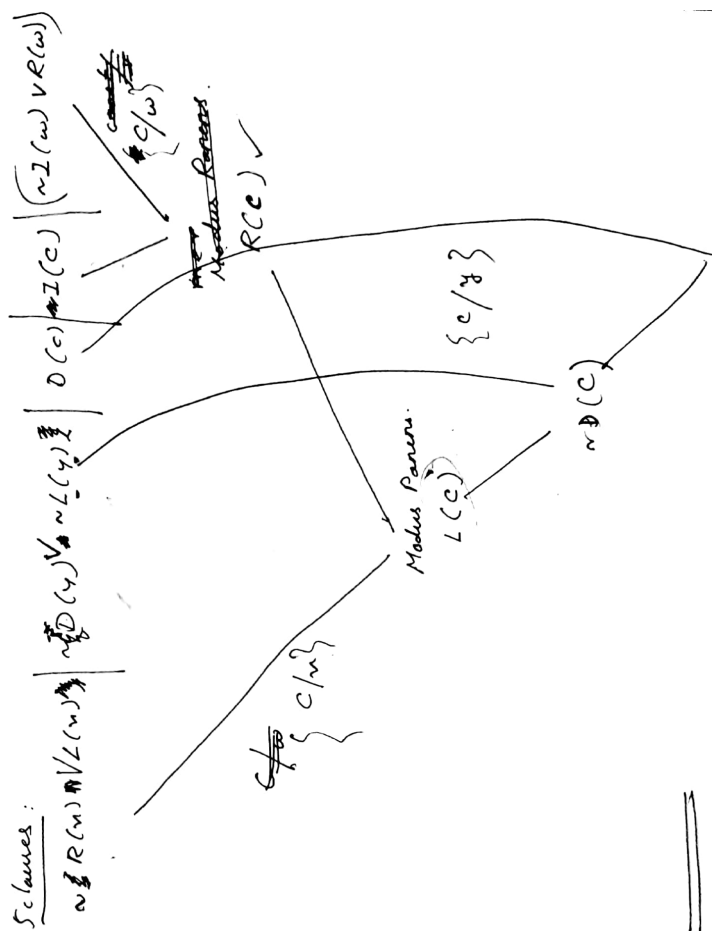
$$a) (\forall u) (\text{Read}(u) \rightarrow \text{L}(u))$$

$$b) \neg \text{D}(y) \rightarrow \neg \text{L}(y)$$

$$c) (\exists z) (\text{D}(z) \wedge \text{I}(z))$$

$$d) (\exists \omega) (\text{I}(\omega) \wedge \neg \text{R}(\omega))$$

- a)  $\sim(R(\omega) \wedge L(\omega))$   
 b)  $\omega(D(\gamma) \vee \sim L(\gamma))$   
 c)  $D(C) \wedge I(C)$   
 d)  $\sim L(C) \wedge \sim R(C)$   
 e)  $\sim W = \sim(I(\omega) \wedge \sim R(\omega))$   
 f)  $\sim W = \sim(I(\omega) \vee R(\omega))$   
 g)  $\sim W = \sim(I(\omega) \vee R(\omega))$



\* Answer Extraction Process

6/11/19

- 

order of preference → → - - derived w/ff / goal w/ff.

Diagram illustrating a proof structure:

- Root node:  $\{u, y\}$
- Left child of root:  $\sim P(u)$
- Right child of root:  $\sim Q(u)$
- Left child of  $\sim Q(u)$ :  $P(A)$
- Right child of  $\sim Q(u)$ :  $\{x/u\}$
- A dashed line descends from  $\sim P(u)$ , labeled "cases are (2), case (5)", leading to "nil".



→ If Fido goes whenever John goes, and John goes to school, where is Fido.

$$① (\forall x) [ \text{place}(\text{Fido}, x) \Rightarrow \text{place}(\text{John}, x) ]$$

~~place(Fido, School)~~

$$② \text{place}(\text{John}, \text{School})$$

$$③ (\exists x) \text{place}(\text{Fido}, x)$$

$$a) \neg \text{place}(\text{John}, x) \vee \text{place}(\text{Fido}, x)$$

$$b) \text{place}(\text{John}, \text{School})$$

$$c). (\exists x) \text{place}(\text{Fido}, x) \quad \text{goal with} \quad \text{Skolem}$$

$$\text{Skolem} \quad \neg (\exists x) \text{place}(\text{Fido}, x) \rightarrow (\forall x) (\neg \text{place}(\text{Fido}, x))$$

~~Goal~~ ~~for~~ ~~negate~~ ~~the~~ ~~goal~~

$$\neg \text{place}(\text{John}, x) \vee \text{place}(\text{Fido}, x)$$

$$\neg \text{place}(\text{John}, x) \vee \text{place}(\text{Fido}, x)$$

$$\text{place}(\text{Fido}, x)$$

$$\text{place}(\text{John}, x)$$

To get Answer: ③ Opposite to each clause arising from negation of goal with its own negate.

③ Following structure of refutation tree perform some resolutions as before until some clause is obtained at the root.

③ Use the clause at the root as an answer statement

This tree is called "modified proof tree"



# Game Trees

Root  $\rightarrow$  decision on what is the best single move to make next.

my turn  $\rightarrow$  MAX  
 else MIN

And possible legal moves.

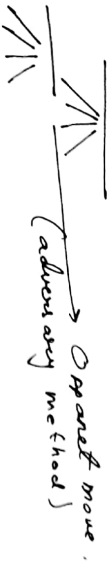
- In each level  $\rightarrow$  MAX/MIN.
- Nodes corresponding to MIN's and max have successors that are like AND nodes.

• Nodes  $\dots$  MAX's  $\dots$

$\dots$  like OR nodes

Game  $\rightarrow$  # nodes in complete game tree

Chess 10<sup>40</sup>  
 120  
 Chess 10



The tree  $\rightarrow$  conventional search was fast. (OR-graphs)

$\rightarrow$  If I have a wire and a recorder, I could install the light



Install lights  
 AND  
 - hypergraph  
 - hyperarc



On each node, some heuristic state evaluation function is applied.

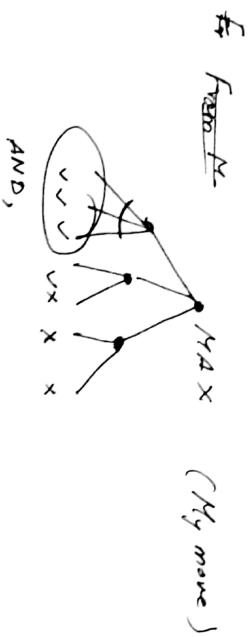
If  $f(n)$  is large +ve, it is a winning config. for max  
according to my config  
 $f(n) =$

$= +\infty$  // really won  
 $= -\infty$  // really lost

Eval function for me = no. of 3 lines open for me  
..... opponent

For here:  
weighted features  
 $w_1 f_1 + w_2 f_2 + \dots$

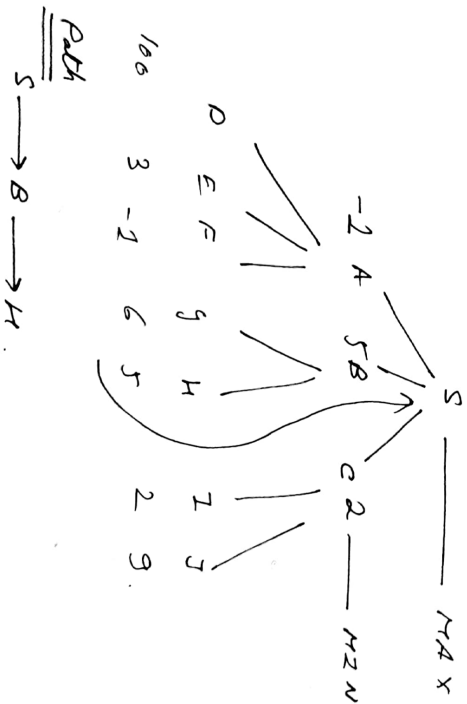
Game tree:



I have to consider the move such that ~~max~~ all  
moves my opponent makes ~~lead~~ lead to my winning

# Searching game tree using MIN-MAX

- ① Create start node as MAX node (my turn to move) with current board config
- ② Expand nodes upto some depth (ply) ~~as~~ as lookahead
- ③ Apply evaluation func. at leaf
- ④ Backup values at each of the non-leaf nodes until values are computed at root.
- ⑤ At MIN node, backed up value is minimum of values associated with successors
- ⑥ At MAX node, max of values associated with child nodes
- ⑦ Pick operator associated with child node ~~with~~ where backed up value determined value at root.



- Although 100 gives max winning score we do not choose A, ~~because~~ because apparent ~~at~~ can go to F.

$\alpha$ -Branching:

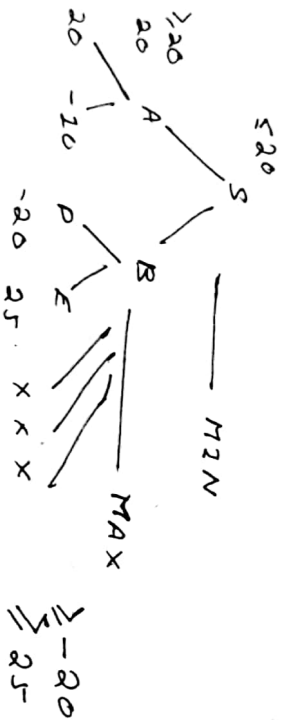


$\alpha$ -cutoff (MIN)

$\alpha$ -But value

can be pruned because after 20 these branches do not contribute to S score.

$\beta$ -cutoff (MAX)



Check — 35 (Branching factor is reduced to 5)

Worst case  $\rightarrow b^d$

best  $\rightarrow (2b)^{d/2}$

\* Horizon effect: (lookahead problem)

## Uncertainty Handling (Gap)

[SI (in-nodes) (out-nodes)]

In-nodes  $\rightarrow$  list of all nodes that must be IN for this node to be

Out-nodes  $\rightarrow$  OUT, ..., True

Reverse: always value, in-list, out-list always empty.

Normal

deduction:

## ANN (Neurocomputing Intro)

( Constant Model

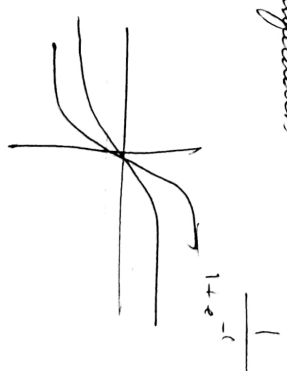
Parallel distributed processing (PDP) // Rumel Hart  
(protein secondary structure)

$\rightarrow$  Hopfield Nets // clustering (unsupervised)

• Multilayer Perceptron  $\rightarrow$  classification

sigmoid  $\therefore$

$$\frac{1}{1 + e^{-(\theta_0 - \theta)}} \quad \text{slope}$$



- separated as batch training
- 24 non-linearly separable, linear