

## soft computing

### evolutionary computing -

Evolutionary computing is a subfield of AI and is used extensively in optimization problems and for continuous optimization problem. It is used to solve problems that have too many variables for traditional algorithms.

Evolutionary computation generally involves techniques which are inspired by biological evolution such as reproduction, mutation, natural selection, survival of the fittest.

Genetic Algorithm - Genetic algorithm is a search based optimization technique based on principle of genetics and natural selection frequently used to find optimal solution to difficult problem which otherwise would take life time to solve.

Genetic algorithm simulate process simulate process of nature selection which means who can adapt to change are able to survive and reproduce to next generation. Each generation consist of population of individuals and each individual represent a point in search space and possible solution. Individual is represented in using strings/integer etc.

## foundation of genetic Algorithm

- Genetic Algorithm are based on analogy with genetic structure and behaviour of chromosomes of population.

Following is foundation of GA analogy -

- individual in population compete for resource, mate

- mate to create more

- gene from fitler move to next generation

- next generation is more suited to environment

## Search Space

Population of individual are maintained with search space. Each individual represent solution in search space.

Individual is coded as finite length vector of component. Component is similar to gene.

fitness score - shows the ability of an individual to "compete".

## operator

1) Selection operator - The idea is to give preference to individuals having higher fitness score.

2) crossover operator - represent mating b/w individual. Two individual are selected using selection operator and crosse site are chosen randomly. The genes at crossover site are exchanged to create new individual.

mutation operator - The key idea is to insert random genes in offspring to maintain the diversity in population.

### Alg0

1) Random initialise population  $P$

2) determine fitness

3) until convergence repeat

    a) Select parents from population

    b) crossover and generate new  $P'$

    c) Perform mutation

    d) calculate fitness for new  $P'$

### feature of GA

-> Robust

-> Provide optimisation over large spaces

-> They do not break on slight change

-> They do not break on slight change

in input or noise.

### Application

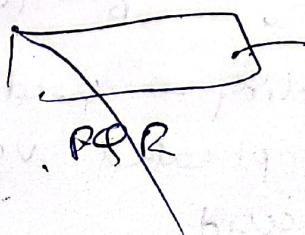
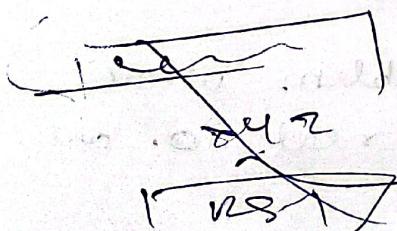
- RNN (Recurrent neural network)

- Mutation test -> genome search

- code breaking

- filtering and signal processing

- learning fuzzy rule base



## Advantage of GA

- easy to understand
- support multi-objective optimisation
- suitable for noisy env.
- robust with respect to local minima/maxima
- work well on mixed discrete function.

## Limitation

- GA implementation is still an art.
- defining objective function and getting representation is difficult.
- computationally expensive
- problem of identifying fitness function.

Encoding - In genetic algorithm an encoding function use to represent mapping of object variable to string code and opposite is decoding.

Encoding is first step in solving the problem which depends upon the problem.

## Encoding method

Binary encoding - chromosomes are strings of

1 and 0 . each position represent characteristic of problem.

chromosome A 1 0 1 1 0 1 0 0

      B 1 0 1 1 0 1 1 1

Value encoding - Used in problem when complicated value i.e real no. are used..

C A 1-23 1-32 5-23  
 C B 1-4 2-4 back

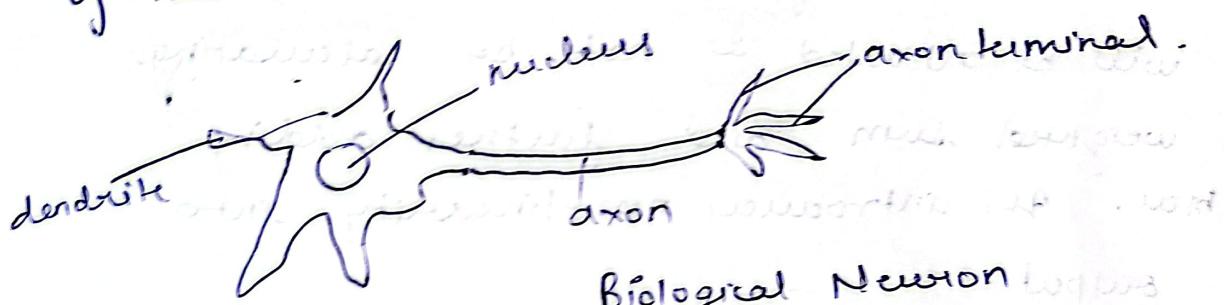
Permutation encoding - Useful for coding problem.

C-A 1 5 3 2 4 6  
 C-B 1 3 2 4 5 6

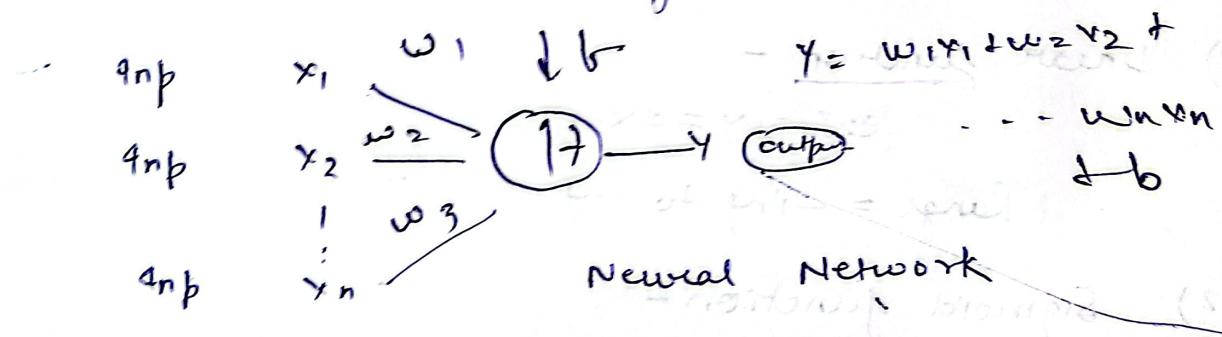
### Neuro computing

It is the information processing performed by network of neurons called neural networks.

Neural Network are derived from biological neural network that develop structure of human brain.



Biological Neuron



### Similarity

Biological Neural Network

Dendrite

Nucleus

Axon

Artificial Neural Network

Input

Nodes

Output

X Y Z

1 1 1

1 1 0

## feature of Neural Network

- It has ability to learn, recall and generalize from given data.
- Extremely powerful computational model.
- ANNs have parallelism which make them very efficient.
- They can learn and generalise from training data to known and unknown of enormous programming.

## Activation function

- Activation function decide whether neuron will be activated or not by calculating weighted sum and further adding bias. It introduces non-linearity into output.

### 1) Linear function -

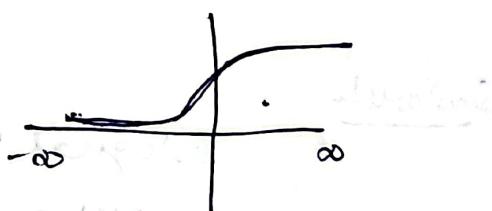
$$\text{Eqn} = y = ax$$

Range = -inf to inf.

### 2) Sigmoid function -

$$\text{Eqn} = \frac{1}{1+e^{-x}}$$

Nature - non-linear



Value - 0 to 1

Used in binary classification.

### 3) Tanh function - Tangent hyperbolic function

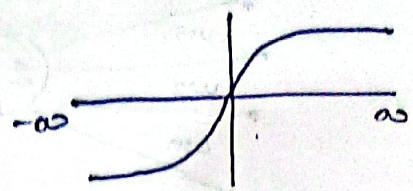
It's actually shifted version of sigmoid function.

$$\tanh = \frac{e^x - e^{-x}}{1 + e^{-x}} - 1$$

$$\text{or } 2 * \text{sigmoid}(x) - 1$$

range = -1 to 1

Nature = non-linear

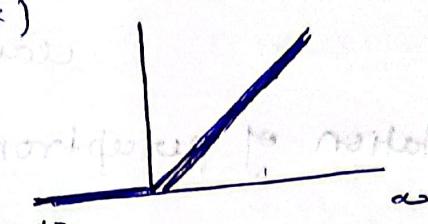


- 4) ReLU - Rectified linear unit implemented in hidden layer, more expensive than tanh and sigmoid, as it involve more mathematical calculation.

$$\text{eq}'' - A(x) = \max(0, x)$$

value = [0, ∞)

Nature = non-linear



- 5) Softmax function - Also a type of sigmoid function but is handy to handle classification problem.

function based on softmax (S-shaped function)

Nature = non-linear

usually used in output layer.

Perceptron - Perceptron is machine learning for supervised learning of various binary classification task. It is one of the simplest neural network. It is a single layer neural network with four parameter

-> Input

-> Bias

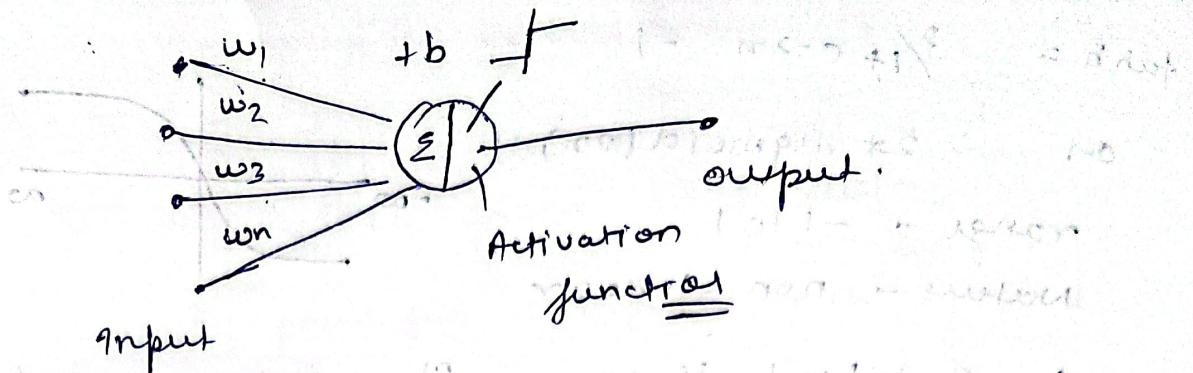
-> Sum

-> Activation function.

Type - single layer

multi layer

• feed forward



$$\sum_{i=1}^n w_i x_i + b \rightarrow \text{Activation function} \rightarrow \text{output}$$

$0 \rightarrow 1$

clean 1 clean -2

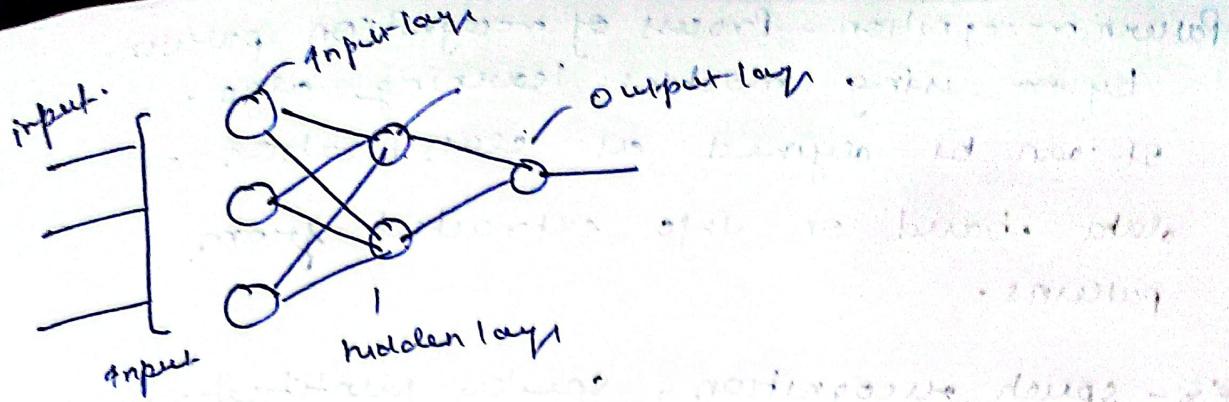
limitation of perceptron model -

- 1) The output of perceptron can only be a binary (0 or 1) due to hard limit transfer function.
- 2) Perceptron can only be used to classify linearly separable set of input vector.

Feed forward neural Networks also called

Multilayer perceptron

The model are called feedforward because information flows in one direction till the output comes. There are no feedback connection in which output are fed back to itself.

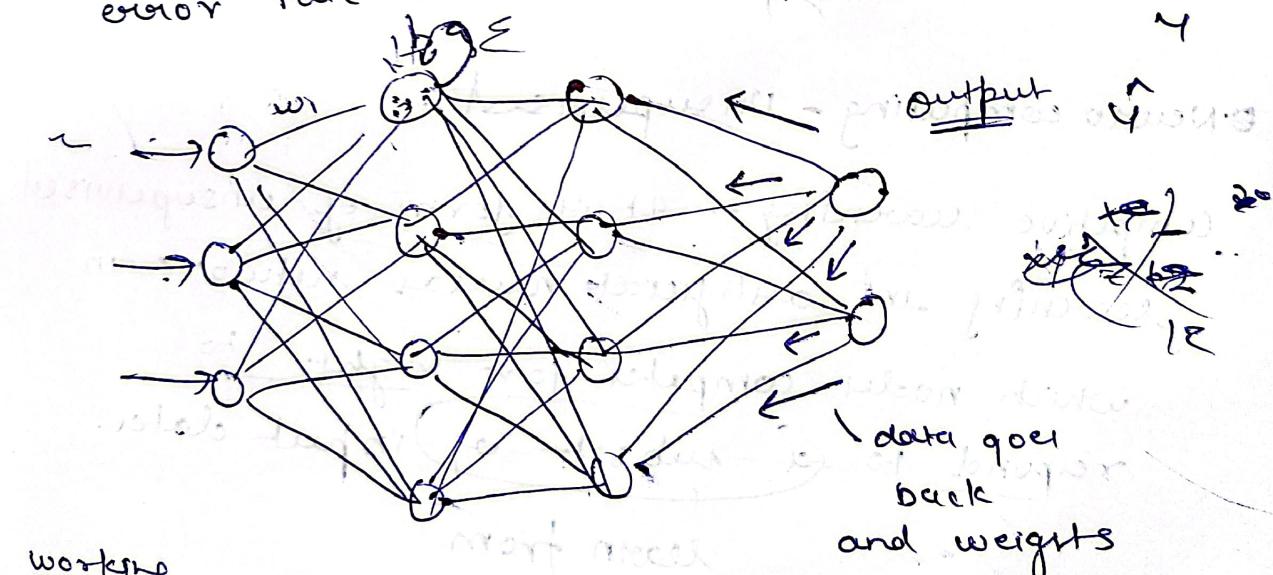


### limitation of multilayer Perceptron

- computation are difficult and time consuming
- it is difficult to predict how dependent variable affect independent variable.
- The model function depend on quality of training.

### Back propagation learning

- it is the method of fine tuning weights of neural network based on error rate obtained in previous pass.



### working

- input layer receive inputs these are adjusted.
- input is multiplied with wt. and A-f is applied.
- output is calculated.
- evaluation of error.
- To decrease error weight are adjusted by going back in hidden layer. Repeat till error is min.

Pattern recognition - Process of recognition patterns by using machine learning algo.  
It can be defined as classification of data based on info extracted from patterns.

Ex - speech recognition, speaker identification, finger print

#### Advantages

- Pattern recognition solve classification problem
- solve biometric detection
- help useful for visually impaired

#### Disadvantages

- require large dataset
- complex to implement

Application - image processing, segmentation

Radar signal classification

Speech recognition

Fingerprint identification

#### • Neuro computing - Unsupervised

Competitive learning - it's a form of unsupervised learning in artificial neural network in which nodes compete for right to respond to ~~a subset of~~ input data.

Or - learn from

it's a winner takes all strategy. In this type

of learning when an input pattern is

sent to network all neuron compete and

winning neuron have weight adjustment

III. Deep learning - deep learning is a kind of neural network

## Hebb learning rule

It is one of first and earliest learning rule in neural networks. It used for pattern classification. If it's a single layer neural network, input layer can have many units, output have one unit, Hebbian rule works by updating weights between neurons in Neural Networks for each training sample.

### Algo

- > Set all weight to 0 and bias to 0
- > for each input vector  $s_i$  and  $t$  (target vector) repeat below 3 rule.
- > set activation for input unit with vector  $x_i = s_i$  for  $i=1$  to  $n$
- > set corresponding output value

Output neuron,  $y = t$

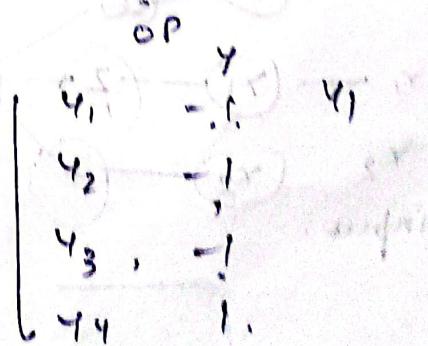
→ update weight and bias by hebb rule  
for  $i=1$  to  $n$

$$w_i(\text{new}) = w_i(\text{old}) + x_i y_i$$

$$b(\text{new}) = b(\text{old}) + y$$

### Implementing and gette

	$x_1$	$x_2$	$b$
$x_1$	-1	-1	1
$x_2$	-1	1	1
$x_3$	1	-1	1
$x_4$	1	1	1



$$w = [0 \ 0 \ 0]$$

$$x_1 = [-1 \ -1 \ 1]$$

$$y_1 = [-1]$$

$$x_2 = [-1 \ 1 \ 1]$$

$$y_2 = [-1]$$

$$x_3 = [1 \ -1 \ 1]$$

$$y_3 = [-1]$$

$$x_4 = [1 \ 1 \ 1]$$

$$y_4 = [1]$$

Received output for 4th choice

Step =  $w_1 = w_{old} + x_i y_i$  (variable extension)

$$= [0 \ 0 \ 0]^T + [-1 \ 1 \ -1]^T [-1]$$

$$= [1 \ 1 \ -1]^T$$

of bold bars 0 of help was done

Second =  $w_{new} = [1 \ 1 \ -1]^T + [2 \ 1 \ 1]^T [1]$

After water was taken from

office lines =  $[2 \ 0 \ -2]^T$

Third method not possible

~~Second~~  $w_{new} = [0 \ 0 \ -2]^T + [1 \ 1 \ 1]^T [1]$

$$w_{new} = [1 \ 1 \ -3]^T$$

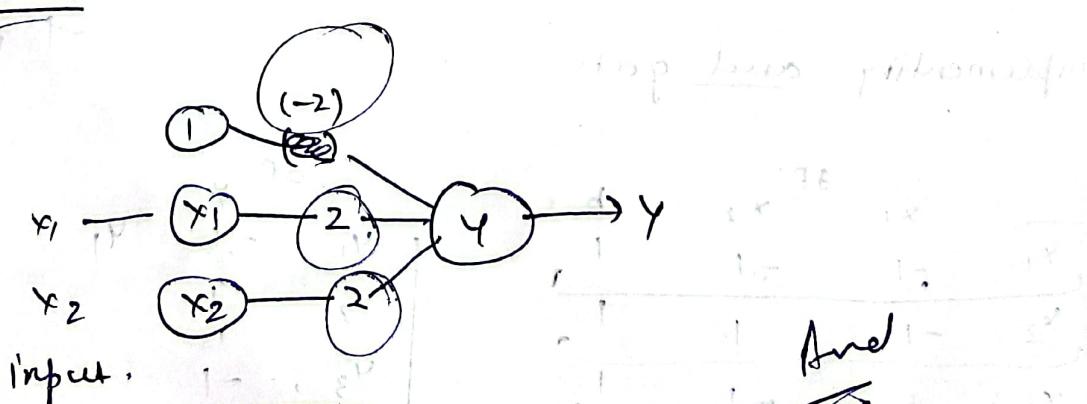
This did not work so sprout

fourth iteration -  $[1 \ 1 \ -3]^T + [1 \ 1 \ 1]^T [1]$

$$w_{new} = [2 \ 2 \ -2]^T$$

$w_{final}$  weights

Hebb net

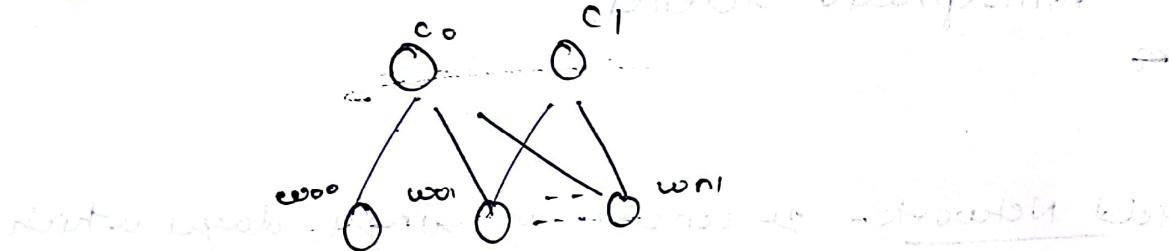


## Kohonen self organising map (SOM)

It is a type of ANN which is also inspired by biological model of neural network. It follows an unsupervised learning approach.

SOM is used for clustering and mapping techniques to map multi dimensional data onto lower dimensional space which reduce complex problem for easy interpretation.

SOM has two layers - input layer & output self organising map.



Working - let say input data of size  $m \times n$  where  $m$  is number of training examples,  $n$  is feature. It initialise weights of size  $n \times c$  where  $c$  is cluster.

• weight updation -

$$w_{ij}^k = w_{ij}^{(old)} + \alpha + (x_i^k - w_{ij}^{(old)})$$

$\alpha$  is learning rate.

$i, j$  denotes winning vector

$x_i^k$  is  $i^{th}$  training example

$k$  denotes  $k^{th}$  training example.

Let we have few training examples  $(x_1, x_2, x_3, x_4)$  then  $x_1 = (x_{11}, x_{12}, x_{13})$

in matrix form  $(x_{11}, x_{12}, x_{13}) [x_{12}, x_{13}] [x_{11}, x_{12}, x_{13}]$

## Algorithm

- 1 - weight initialization
- 2 - for 1 to N epochs
- 3 - select training example
- 4 - compute winning vector
- 5 - update winning vector
  - Repeat 3,4,5
  - continue till sample.

## Application of SOM

- Analysis of financial stability
- Fault diagnosis of plant
- Atmospheric science

Hopfield Network - It consists of single layer which

contain one or more fully connected

recurrent neurons. Hopfield network is

commonly used for auto-correlation

and optimisation task.

Discrete hopfield network - It is fully interconnected neural network where each

(unit i) is connected to every other unit.

It behaves in discrete manner giving finite

distinct output.

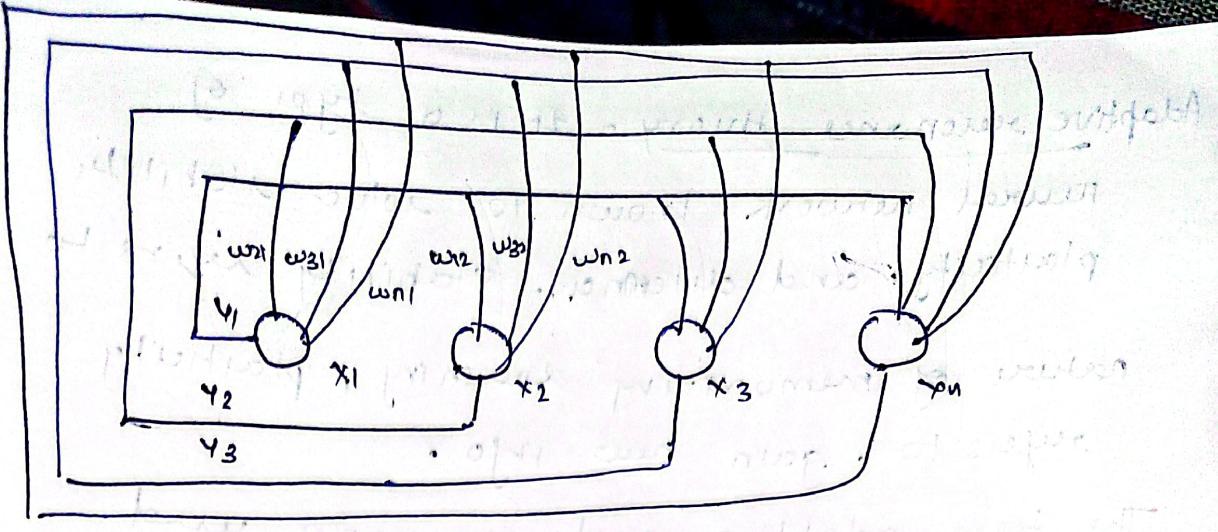
Binary (0,1)

or Bipolar (-1,1)

slp)  $p=1$  to  $P$   $s(p)=s_i(p)$

Binary  $\rightarrow w_{ij} = \sum_{i=1}^P [2s_i(p)-1] [2s_j(p)-1]$   $w_{ij}$  for all  $i, j$

$x_1, x_2, \dots, x_n$  - Input to neuron  
 $y_1, y_2, \dots, y_n$  - Output return  
 $w_{ij}$  = weight's  
 for storing input pattern  
 $s_i(p)$  weight is given by  
 $w_{ij}$  for all  $i, j$



Boltzmann machine - It is unsupervised deep learning model in which every node is connected to every other node.

There are two type of nodes -

visible node - those nodes which we can measure and do not consider

hidden node - those nodes which we cannot measure or do not consider

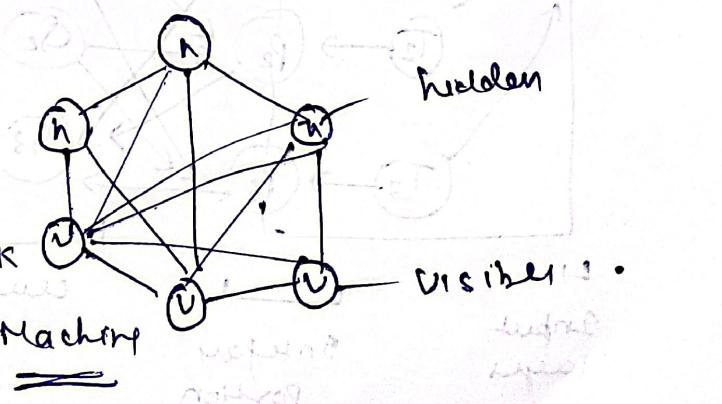
Although node are different but machine consider them same and work as single system.

training dataset feed into Boltzman m/c and wt. are adjusted accordingly.

It helps in understand abnormalities by learning about working of system in normal condition.

Types -

- Restricted BM
- Deep belief network
- deep Boltzman Machine



Adaptive resonance theory - It's a type of neural network known to solve stability, plasticity, and dilemma. Stability refers to nature of memorizing learning; plasticity refers to gain new info.

The term adaptive and resonance used here suggest they are open to learn new without discarding previous old information. with help of below

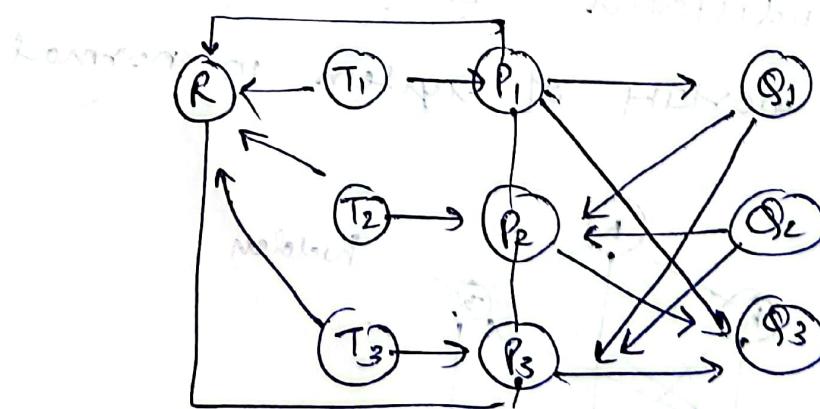
### Advantage of ART

- 1) Target recognition
- 2) Medical diagnosis
- 3) Signature verification
- 4) Mobile control robot.

### Types of ART

ART1 - Simplest ART capable of binary input value.

ART2 - capable of clustering continuous value data.



• Input layer  
• Integrate portion

center unit

- Application of evolutionary computing in image processing / computer vision.
- soft computing in mobile - ad hoc network
- Application of fuzzy in pattern recognition.

## soft computing

An intelligent machine is technologically advanced machine that is prone to world. It can learn from its experience. It includes AI-based software system such as chatbots.

### characteristics

- 1) Real time simulation.
- 2) learning is based on MC
- 3) Action based on sensing data.

knowledge based system is form of AI that aims to capture the human experts to support decision making.

Architecture of knowledge based system -  
Interface - enable user to query the knowledge based system

User - interact with knowledge base engine to get insights to make some decision.

Knowledge - expert knowledge encoded base rules

Solution to old problem  
(new ones are represented  
as cases)

## Uses of KBS

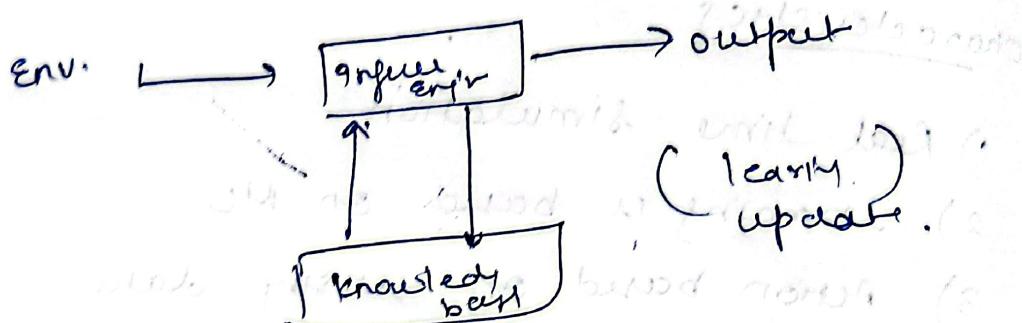
Healthcare - clinical decision support

Industrial equipment fault diagnosis

Bank cash management -

knowledge based system are slightly differ

AI.



A knowledge based agent must do following -

- 1) It must represent state
- 2) It should incorporate new percepts
- 3) can update internal details
- 4) can deduce internal details
- 5) can take Action

knowledge based representation and processing.

### 1) Logical representation -

- It is language with some concrete rules

- It deals with proposition

- Logical representation means drawing conclusion on various condition.

- It consists syntax and semantic which sound inference.

Each sentence can be translated to logic.

### Syntax -

- rules which define how to construct sentence in logic.
- it defines which symbol can be used
- How to write

### Semantics -

rules which we can interpret from logic.

- it means assigning meaning to sentence.

a) Propositional logics

b) Predicate logics

### Advantages -

- ↳ help in logical reasoning
- ↳ logical representation in basis of programming language

### Disadvantages -

- it have some restriction.
- it may not be very natural and efficient.

### Semantic Network Representation -

it semantic network are alternative of predicate logic for knowledge representation

we can represent knowledge in the form of graphical network.

Network consist of nodes representing object and arc which describe relationship b/w object.

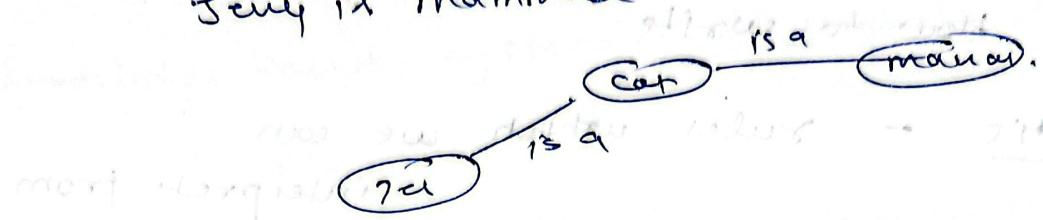
Type - is a relation

Kind of relation.

### Statements

Ex) Jerry is cat

Jerry is mammal



### Drawback

- ↳ more computation power required.
- ↳ Try to imitate human memory which is not possible.
- inadequate representation
- Not intelligent system.

Adv - Semantic or natural representation of knowledge.

- It conveys meaning
- simpler & easy to understand.

### Frame Representation

↳ Representation in the form of

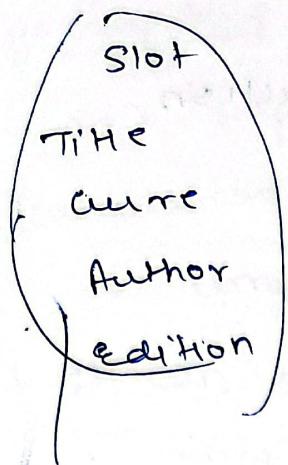
frame i.e into record like

structure

It consists of slot & their values.

Advantages:

useful for integration of knowledge base



filter.

Artificial sense

Space

None

third

of multiple eg

more versatile

Facets.

frame are derived from semantic network.

and later evolved to modern object and  
object

frame contain collection of frame, might be  
system. multi frame is not useful.

They are widely used in Natural  
language processing.

Advantages -

1) Frame knowledge representation make  
programming easy.

2) flexible

3) Add new slot, attributes.

4) Easy to understand.

Disadv

- Inference mechanism is not easily  
done in frame processing.

- It can not be smoothly proceeded

- Much generalised approach.

## Production Rules

It consists of condition and action.

If condition then action

### L-3 Parts

- set of production rule
- working memory
- recognise act cycle.

Production check condition then perform corresponding action thus cycle is called recognise act cycle.

working memory - contains the description of current state of problem - solving.

If new situation generate multiple production can be fired called conflict set. In this agent needs to select rule called resolution of conflict.

Adv - expressed in Natural language.

Highly modular i.e. can be changed easily.

Disadv -

- inefficient because of many

- No learning active rules.

No learning capabilities do not result more result.

## soft computing

Soft computing is use of approximate calculation to provide usable result to complex computational problem.

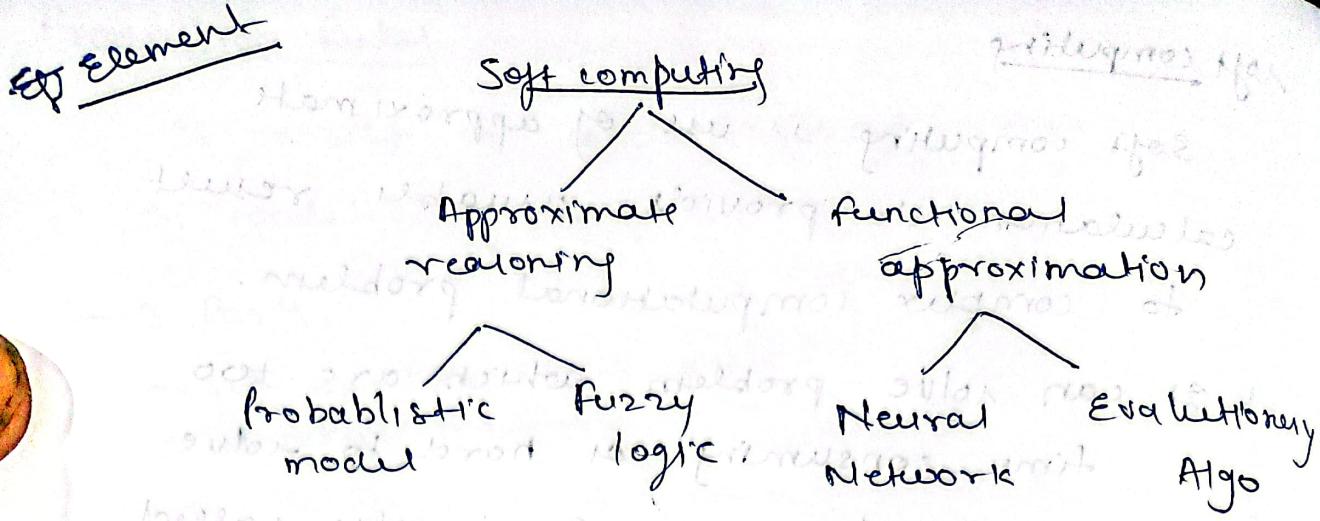
- ↪ It can solve problem which are too time consuming or hard to solve with hardware. It is also called computational intelligence.
- ↪ It can map human mind and try to do calculation & computation like human.

### Characteristic

- ↪ Provide approximate result
- ↪ algorithm are adaptive
- ↪ It learn from experimental data.
- ↪ It solve real world problems
- ↪ based on fuzzy logic, genetic algo, ML, ANN, expert system.

### Application - image processing

- ↪ Robotics
- ↪ Manufacturing
- ↪ Quality control
- ↪ pattern recognition
- ↪ handwriting detection.
- ↪ medical diagnosis
- ↪ speech recognition
- ↪ image compression
- ↪ robot navigation
- ↪ decision making



Fuzzy logic - It nothing but mathematical logic which tries to solve

problem with range of data, not just with exact values or conditions.

ANN - imitation of human brain so that computer can think like a human does.

Genetic Algorithm - genetic algorithm are a adaptive, heuristic search algorithm that belong to evolutionary algorithms.

They are intelligent exploitation of random search provided with historical data.

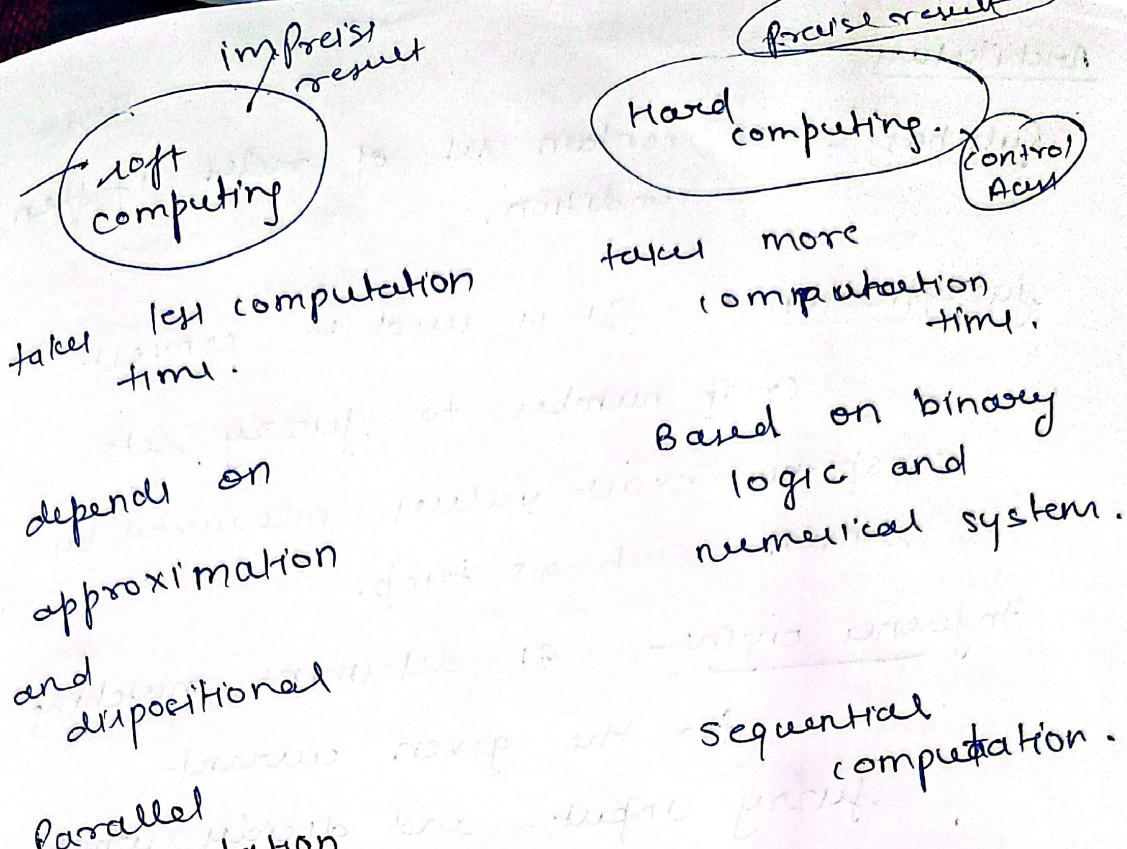
- Provide high quality solution for optimisation problem.

- Simulate process of Natural selection.

Evolutionary computing - subfield of AI used to solve complex optimisation problem.

It is based on biological evolution theory.

It uses principle of inheritance i.e derive info from previous generation.

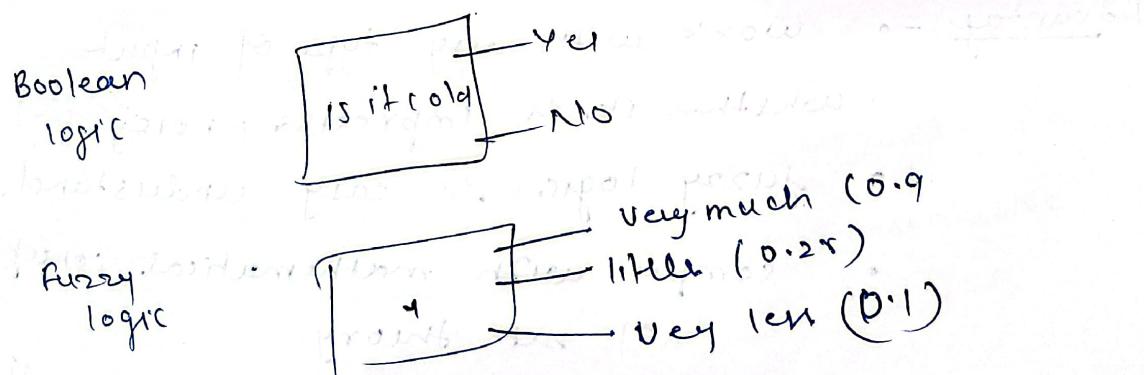


Approximate result  
Parallel computation

exact result.  
Any traditional problem.

neural Network

fuzzy logic →  
when we can not determine situation in  
yes or no.



Control areas of hard computing →  
- Vague and normally  
- Ambiguous and  
- not well defined.

## Architecture

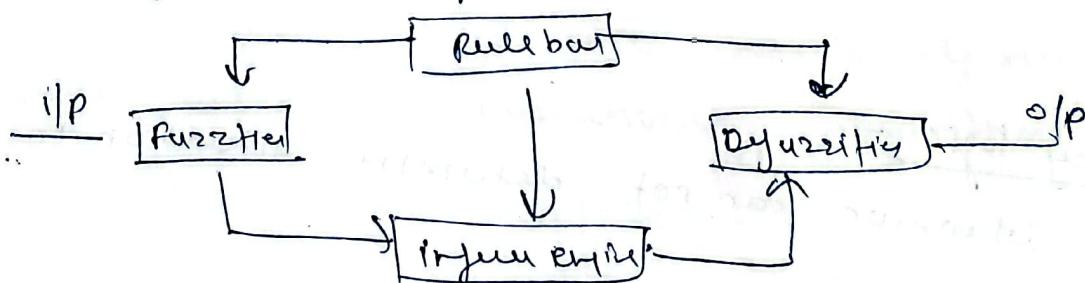
Rule base - It contains set of rules if then condition.

fuzzification - It is used to convert crisp number to fuzzy sets.

crisp no. exact value measured by sensor such as temp.

Inference engine - It determines matching for the given current fuzzy input and decides which rule to be fired.

Defuzzification - It is used to convert fuzzy sets obtained by inference engine to crisp values.



- work with any type of input whether it is imprecise, noisy.
- fuzzy logic is easy understand.
- complex with mathematical concept of set theory.
- efficient solution to complex problem.

Disadv - - Different way to solve problem thru ambiguity

- work on precise as well as imprecise data so inaccurate.

## Application

- NLP
- Expert System
- Decision making
- Neural Network.
- Automotive system.

## Rough sets

Rough set is a new mathematical approach to imperfect knowledge.

## Application

Artificial intelligence

- Machine learning
- Knowledge discovery
- Data mining
- expert ~~discovery~~ system
- pattern recognition

Rough set are generalization of classical set. It can used for feature selection

feature extraction, data reduction.

Stored in form of table.

Indiscernibility - A way of reducing table size to store only one representative object for every set of same attributes.

After this reduction we can apply other methods.

allow subset of

## Decision System -

	$A_{SI}$	Lens	Walk
$n_1$	16-30	50	44
$n_2$	16-30	6	No
$n_3$	31-45	1-25	No
$n_4$	31-45	1-25	No
$n_5$	46-60	26-48	No
$n_6$	46-30	26-48	No
$n_7$	46-60	26-48	No

$$GND(A_{SI}) = \{n_1, n_2, n_3\} \cup \{n_3, n_4\} \cup \{n_5, n_7\}$$

$$GND(\text{Lens}) = \{n_3, n_4\} \cup \{n_5, n_7\} \cup \{n_2\}$$

$$GND(\text{Lens}, A_{SI})$$

$$= \{n_3, n_4\} \cup \{n_5, n_7\} \cup \{n_6\} \cup \{n_1\} \\ \cup \{n_2\}$$

Set approximation

→ formal approximation of crisp set.

Upper approximation, Lower approximation.

Probability reasoning -

with knowledge representation we write

$A \rightarrow B$  means A is true then B

is true but when we are not sure.

about A then we can express this

statement. then it's uncertainty:

So, to represent uncertain knowledge. we

need to probabilistic reasoning.

Probabilistic reasoning - way of representation

where we apply concept of probability.

∴ we combine probability with logic  
to produce results.

Need when there is unpredictable outcomes.  
↳ unknown error experiment

it involves two ways to solve problem

- 1) Baye's rule
- 2) Bayesian statistics

$$P(A|B) = \frac{P(B|A) \cdot P(A)}{P(B)}$$

---

$$P(B|A)$$

Bayes' formula



$$P(A|B) = \frac{P(B|A) \cdot P(A)}{P(B)}$$

Probability of A given B

Previously



Probability of A given B

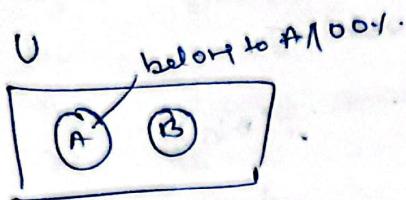


## Crisp set

$U = \text{All student}$

$A = 104$

$B = 124$



Do not share boundary.

$$A = \{a, \mu(a)\} \quad (\mu) \text{ degree of goodness.}$$

## membership function

support - set of all point such that  $\mu_A(x) > 0$

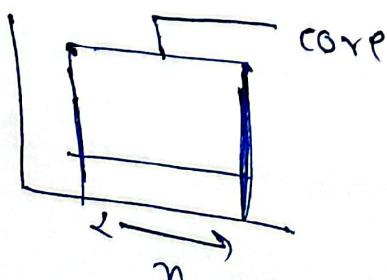
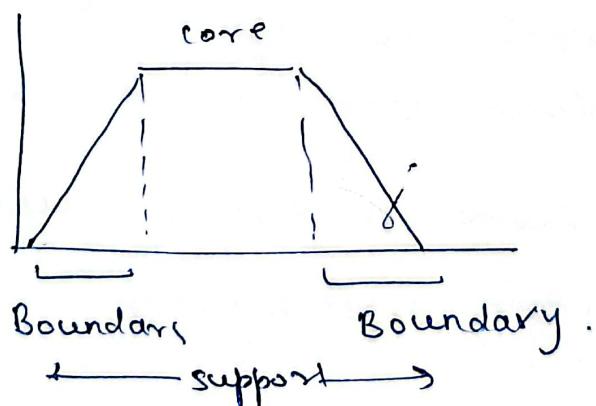


$$\text{support } A = \{x \mid \mu_A(x) > 0\}.$$

$$\text{core } \underline{\underline{\mu_A(x) = 1}}$$

$$\text{core}(A) = \{x \mid \underline{\underline{\mu_A(x) = 1}}\}.$$

## Boundary -



operation

Union -  $(A \cup B)$

$$\mu_{(A \cup B)}(x) = \max(\mu_A(x), \mu_B(x))$$

Intersection -  $(A \cap B)$

$$\mu_{(A \cap B)}(x) = \min(\mu_A(x), \mu_B(x))$$

$$A = \{(n_1, 0.6), (n_2, 0.7), (n_3, 0.4)\}$$

$$B = \{(n_1, 0.3), (n_2, 0.2), (n_3, 0.5)\}$$

$$A \cup B = \{(n_1, 0.6), (n_2, 0.7), (n_3, 0.5)\}$$

$$A \cap B = \{(n_1, 0.3), (n_2, 0.2), (n_3, 0.4)\}$$

complement

$$\mu_{(A^c)}(x) = 1 - \mu_A(x)$$

$$A = \{(n_1, 0.6), (n_2, 0.7), (n_3, 0.4)\}$$

$$A^c = \{(n_1, 0.4), (n_2, 0.3), (n_3, 0.6)\}$$

Product =  $A \cdot B$

$$\mu_{A \cdot B}(x) = \mu_A(x) \cdot \mu_B(x)$$

Scalar product  $(\alpha \times A)$

$$\mu_{\alpha \cdot A}(x) = \alpha \times \mu_A(x)$$

$$\text{Power } (A^\alpha) \quad \mu_{A^\alpha}(x) = (\mu_A(x))^\alpha$$

$$A = \{(n_1, 0.6), (n_2, 0.7), (n_3, 0.4)\}$$

$$B = \{(n_1, 0.3), (n_2, 0.2), (n_3, 0.5)\}$$

$$A \cdot B = \{(n_1, 0.18), (n_2, 0.14), (n_3, 0.20)\}$$

$\mathcal{L} \rightarrow \text{otol. including } 0 \text{ or } 1$

Sum =  $(A+B)$

$$\mu_{A+B}(x) = \mu_A(x) + \mu_B(x) - \mu_A(x)\mu_B(x)$$

Difference =  $(A-B)$

$$\mu_{A-B}(x) = \mu_A\mu_B^c(x)$$

Disjunctive sum -  $A \oplus B$

$$A-B \cup B-A$$

$$A \cap B' \cup B \cap A'$$

$$(A \cap B \cup B \cap A)' = A \cap B' \cup B \cap A'$$

Cartesian product

$$\mu_{A \times B}(x, y) = \min \{\mu_A(x), \mu_B(y)\}$$

$$A(x) = \{(\bar{x}_1, 0.2), (\bar{x}_2, 0.3), (\bar{x}_3, 0.5)\}$$

$$A(y) = \{(\bar{y}_1, 0.6), (\bar{y}_2, 0.4), (\bar{y}_3, 0.3)\}$$

	$y_1$	$y_2$	$y_3$
$x_1$	0.2	0.2	0.2
$x_2$	0.3	0.3	0.3
$x_3$	0.5	0.8	0.3

Fuzzy relation

$$A = \{(\bar{x}_1, 0.6), (\bar{x}_2, 0.2), (\bar{x}_3, 0.3)\}$$

$$B = \{(\bar{y}_1, 0.7), (\bar{y}_2, 0.3), (\bar{y}_3, 0.4)\}$$

	$y_1$	$y_2$	$y_3$
$x_1$	0.6	0.3	0.4
$x_2$	0.2	0.2	0.2
$x_3$	0.3	0.3	0.3

Fuzzy if then implication  
conditional statement.

$$\text{if } n \in A \text{ then } y \in B$$

$$R: A \rightarrow B$$

if temp is high then pressure is low

$$T_{\text{high}} = \{ (25, 0.1) (30, 0.2), (35, 0.5), (40, 0.6) \}$$

$$T_{\text{low}} = \{ (2, 0.3), (5, 0.5), (8, 0.4) \}$$

$$\text{if } T_h \rightarrow T_{\text{low}}$$

compositional result

	2	5	8
25	0.1	0.1	0.1
30	0.2	0.2	0.2
35	0.3	0.5	0.4
40	0.3	0.8	0.4

fuzzy to crisp:

Defuzzification

- 1) lambda cut
- 2) maxima method
- 3) weighted sum
- 4) centroid method.

$$\text{lambda cut} = \lambda \cap A = \{ n | u_A(n) \geq \lambda \}$$

$$0 \leq \lambda \leq 1$$

$$A = \{ (n_1, 0.2), (n_2, 0.4), (n_3, 0.6) \}$$

$$\lambda = 0.3$$

$$A = \{ (n_1, 0), (n_2, 1), (n_3, 1) \}$$

lambda w.  
fuzzy relation

$$\begin{bmatrix} 0.2 & 1 \\ 0.3 & 0.6 \end{bmatrix} = A = \begin{bmatrix} 0 & 1 \\ 0 & 0 \end{bmatrix}$$

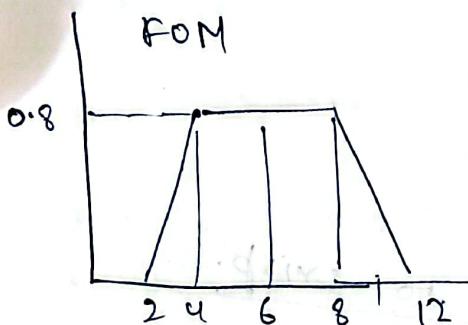
$$A = 0.5 \quad \begin{bmatrix} 0 & 1 \\ 0 & 1 \end{bmatrix}$$

Maxima methods

First of maxima.

Last of maxima

Mean of maxima.



$$\text{Last of Maxima} \quad \begin{bmatrix} 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 \end{bmatrix} \rightarrow \underline{\underline{8}}$$

first element having  
max membership value

$$\underline{\underline{x^* = 4}}$$

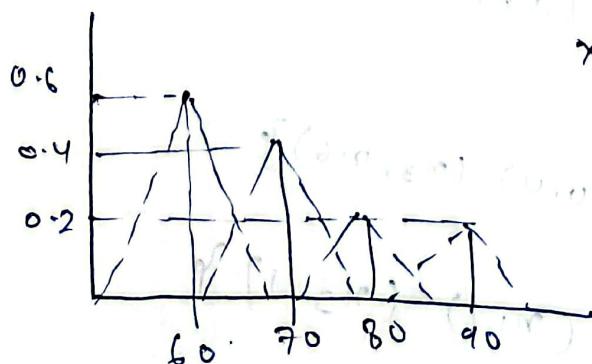
Mean of maxima

$$= \frac{4+6+8}{3}$$

$$= \frac{18}{3} = 6$$

$$\underline{\underline{x^* = 6}}$$

Weighted Average method

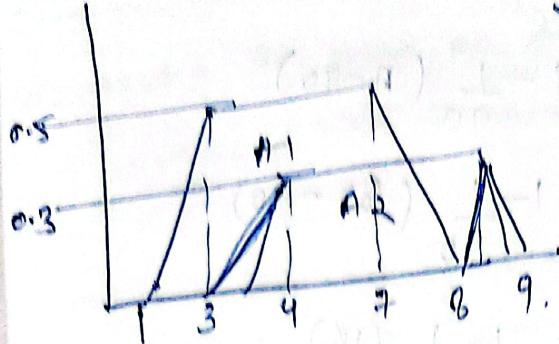


$$x^* = \frac{\sum \mu(x) \times x}{\sum \mu(x)}$$

$$= \frac{60 \times 0.6 + 70 \times 0.4 + 80 \times 0.2}{0.6 + 0.4 + 0.2 + 0.2}$$

$$\underline{\underline{x^* = 70}}$$

### Centre of SSM



$$x^* = \frac{A_1 \times c_1 + A_2 \times c_2}{A_1 + A_2} + \text{center of each area}$$

$$A_1 = \frac{1}{2} [7+4] \times 0.5 = 2.75$$

$$A_2 = \frac{1}{2} (9-3+8) \times 0.3 = 1.5$$

$$x^* = 2.75 \times \frac{5 + 1.5 \times 6}{2.75 + 1.5}$$

(Centre of)

Triangle -

R = Right angled

I = Isosceles  $\Delta$

E = equilateral  $\Delta$

gR = Isosceles Right  $\Delta$

T - combination of other  $\Delta$

membership value of Right  $\Delta = \frac{1}{2} - \frac{1}{90} |A - 90^\circ|$

$$\text{gIsosceles } \Delta = 1 - \frac{1}{60} \min \{ |A-B|, |B-C| \}$$

$$\text{gIsosceles Right} = 1 - \frac{1}{180} |A - 90^\circ|$$

$$\text{gIsosceles Right} = \underline{\text{gNR}}$$

$$\begin{aligned} \text{membership of all} &= g = (R \cup I \cup E)^c \\ &= R^c \cap g^n \cap E^n \end{aligned}$$

$$A, B, C = 80, 65, 35$$

membership of right =  $1 - \frac{1}{90} (A - 90)$

$$= 1 - \frac{1}{90} (80 - 90)$$

$$= 1 - \frac{1}{90} (10)$$

$$= 8/9$$

90 system =  $1 - \frac{1}{60} \left( \frac{(80-65)}{15} \cdot \frac{(65-35)}{30} \right)$

$$= 1 - \frac{1}{60} \left( \frac{15}{60} \right)$$

$$= 3/4$$

Equilateral =  $1 - \frac{1}{180} (80 - 35)$

$$= 1 - \frac{1}{180} (45)$$

$$= 1 - \frac{1}{4} = 3/4$$

$g_R = g_n R$

$$= 3/4$$

all =  $\left( \frac{8}{9}, \frac{3}{4}, \frac{3}{4} \right)$

$$= \left( \frac{1}{9}, \frac{1}{4}, \frac{1}{4} \right)^T$$

$\frac{1}{9}$