#### **UNIT V FUZZY LOGIC CONTROL**

#### **UNIVERSAL FUZZY SET**

Def<sup>n</sup>: If x is any set then universal fuzzy set of x is denoted by  $\hat{X}$  and defined as  $\hat{X} = d(x, 1) \mid x \in X$ 

Example: Let 
$$X = \{a_1, a_2, a_3, a_4\}$$
 then
$$X = \{(a_1, 1), (a_2, 1), (a_3, 1), (a_4, 1)\}$$

#### **FUZZY "IF THEN" RULE**

It is also called as Fuzzy implication, Fuzzy Rule or Fuzzy conditional statement.

The standard fuzzy if then rule is given below,

@ If x is \( \vec{A}\) then y is \( \vec{B}\)

i.e.  $\vec{R} = (\vec{A} \times \vec{B}) U (\vec{A}^c \times \vec{Y})$ ,  $\vec{Y}$  - Universal fuzzly set

(b) It x is A then y is R else y is C ie. R = (A×B) U (Ac x Z)

### \* Example

ket  $X = \{a, b, c, d\}$  and  $Y = \{1, 2, 3, 4\}$  and  $A = \{(a, 0), (b, 0.8), (c, 0.6), (d, 1)\}$   $B = \{(1, 0.2), (2, 1), (3, 0.8), (4, 0)\}$ 

$$\tilde{C} = \{ (1,0), (2,0.4), (3,1), (4,0.8) \}$$

Determine the implication relations

When 
$$Y = \{(1,1), (2,1), (3,1), (4,1)\}$$

$$A^{c} = \{(a,1), (b,0.2), (c,0.4), (d,0)\}$$

b) If 
$$X$$
 in  $A$  then  $y$  in  $B$  else  $Y$  in  $C$ 

$$A = \{(0,0), (b,0.8), (c,0.6), (d,1)\}$$

$$B = \{(1,0.2), (2,1), (3,0.8), (4,0)\}$$

$$C = \{(1,0), (2,0.4), (3,1), (4,0.8)\}$$

$$A^{c} = \{(a,1), (b,0.2), (c,0.4), (d,0)\}$$

$$A^{c} = \{(a,1), (b,0.2), (c,0.4), (d,0)\}$$

$$A^{c} \times C = \{(a,1), (b,0.2), (c,0.4), (d,0.4)$$

$$A^{c} \times C = \{(a,1), (b,0.2), (c,0.4), (d,0.4)$$

$$A^{c} \times C = \{(a,1), (b,0.2), (c,0.4), (d,0.4)$$

$$A^{c} \times C = \{$$

b) Let  $X = \{a, b, c, d\}$  &  $Y = \{1, 2, 3, 4\}$  be any two sets. If  $\widetilde{A}$  &  $\widetilde{B}$  are the fuzzy sets defined on the X & Y respectively defined by,  $\widetilde{A} = \{(a, 0), (b, 0.7), (c, 0.6), (d, 1)\}$   $\widetilde{B} = \{(1, 0.2), (2, 0.9), (3, 0.5), (4, 0)\}$  then find following fuzzy relation "If X is  $\widetilde{A}$  then Y is  $\widetilde{B}$ "

# Fuzzy Inference System

Mamdani and Sugeneo fuzzy inference system

# Fuzzy Inference System – Concept

Fuzzy inference is the process of mapping from a given input to an output using fuzzy logic.

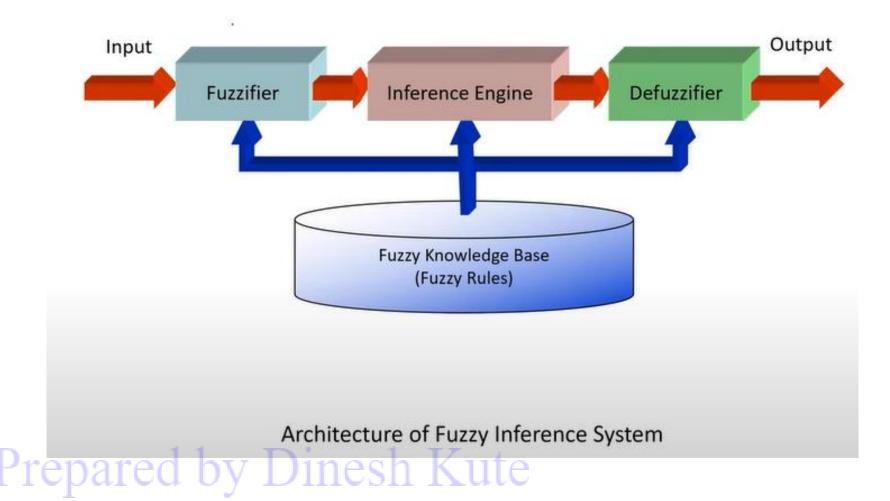
### What is the Fuzzy Inference System(FIS)?

A nonlinear mapping that derives its output based on fuzzy reasoning and set of fuzzy if then rules.

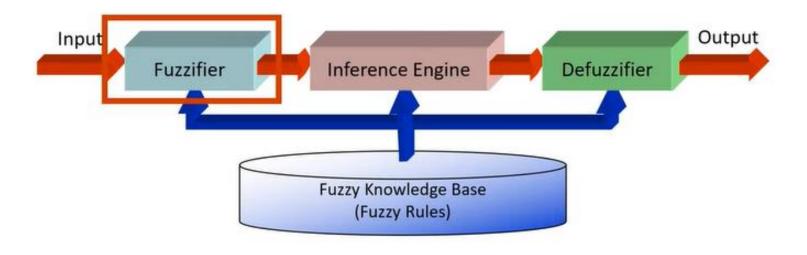
Fuzzy inference systems have been successfully applied in various fields such as automatic control, data classification, decision analysis, expert systems, computer vision, etc.

Fuzzy Logic Toolbox<sup>TM</sup> software supports two types of fuzzy inference systems:

- Mamdani systems
- Sugeno systems by Dinesh Kute



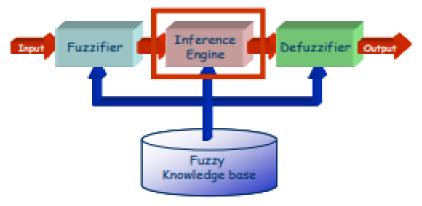
### **Fuzzy Inference System**



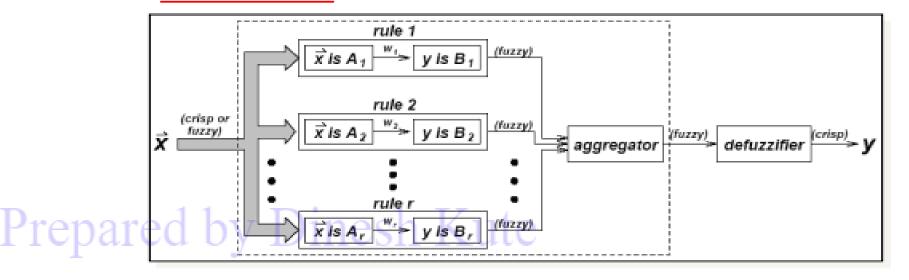
#### **Fuzzifier:**

Covert crisp input to fuzzy input (or linguistic variable)

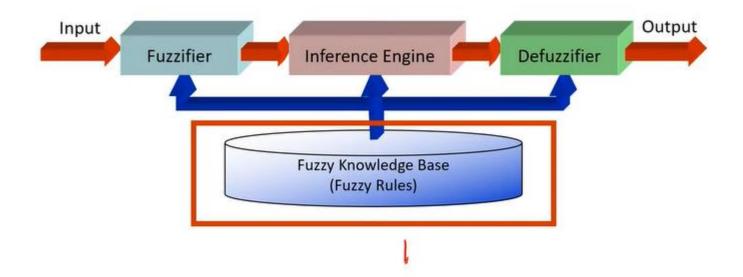
### Inference Engine



Using If-Then type fuzzy rules converts the fuzzy input to the fuzzy output.



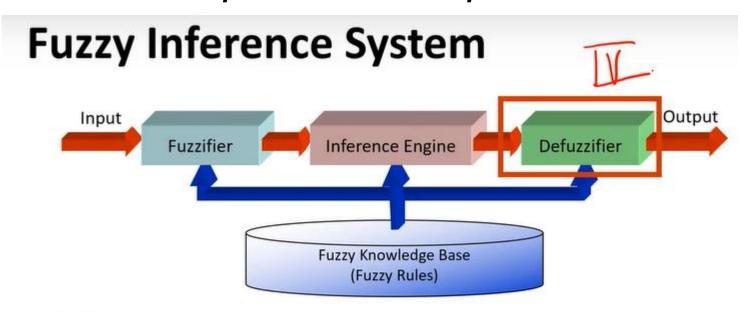
### **Fuzzy Inference System**



#### **Fuzzy Knowledge Base:**

The rule base referred to as the knowledge base.

- A rule base contains a number of fuzzy IF-THEN rules;
- A database which defines the membership functions of the fuzzy sets used the fuzzy rules



#### Defuzzifier:

- It converts the fuzzy output of the inference engine to crisp.
- Here are some commonly used defuzzification methods are as follows:
  - Weighted average method conter of sum method
  - > Center of gravity method
  - Mean of maximum (MOM)
  - > Smallest of maximum (SOM)
  - Largest of maximum (LOM)

# Sugeno fuzzy inference system

Sugeno fuzzy inference, also referred to as Takagi-Sugeno-Kang fuzzy inference, uses *singleton* output membership functions that are either constant or a linear function of the input values.

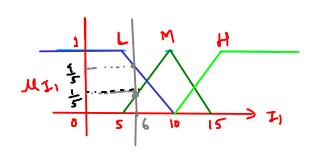
The defuzzification process for a Sugeno system is more computationally efficient compared to that of a Mamdani system, since it uses a weighted average or weighted sum of a few data points rather than compute a centroid of a two-dimensional area.

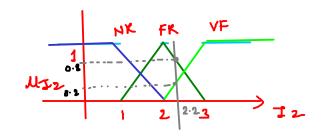
### Difference Between Mamdani and Sugeno Fuzzy Inference System:

Mamdani FIS			Sugeno FIS		
•	Output membership function is present	•	No output membership function is present		
•	The output of surface is discontinuous	•	The output of surface is continuous		
•	Distribution of output	•	Non distribution of output, only Mathematical combination of the output and the rules strength		
•	Through defuzzification of rules consequent of crisp result is obtained	•	No defuzzification here. Using weighted average of the rules of consequent crisp result is obtained		
•	Expressive power and interpretable rule consequent	•	Here is loss of interpretability		
•	Mamdani FIS possess less flexibility in the system design	•	Sugeno FIS possess more flexibility in the system design		
•	It has more accuracy in security evaluation block cipher algorithm	•	It has less accuracy in security evaluation block cipher algorithm		
•	It is using in MISO (Multiple Input and Single Output) and MIMO (Multiple Input and Multiple Output) systems	•	It is using only in MISO (Multiple Input and Single Output) systems		
•	Mamdani inference system is well suited to human input	•	Sugeno inference system is well suited to mathematically analysis		
•	Application: Medical Diagnosis System	it	Application: To keep track of the change in aircraft performance with altitude		

#### **EXAMPLE ON SUGENO INFERENCE SYSTEM**

Example: Find the comput of the following fuzy midel for input I1 = 6 and I2 = 2.2 Using sugare inference system





with the following firezy rules

RMC1: IF II is L and I2 is FR then y=I1+2I2

2! II L

te VF then y= I1+3I2

I) M I2 FR then  $y = 2I_1 + 2I_2$ 

II

M I2 UF then y = 2I 1+ 3I2

$$\frac{Sol7}{M_{p}(n)} = \frac{N-5}{10-5} = \frac{N-5}{5} : M_{p}(6) = \frac{1}{5}$$

$$M_{p}(n) = \frac{10-n}{10-5} = \frac{10-n}{5} : M_{p}(6) = \frac{4}{5}$$

$$\therefore \mathcal{M}_{m}(6) = \frac{1}{5}$$

$$\mathcal{L}_{L}(n) = \frac{10-n}{10-5} = \frac{10-n}{5}$$

$$\therefore \mathcal{A}_{L}(6) = \frac{4}{5}$$

$$M_{VF}(n) = \frac{n-2}{3-2} = \frac{n-2}{1} \therefore M_{VF}(2\cdot 2) =$$

$$L_{VF}(2\cdot 2) = \frac{0\cdot 2}{2}$$

$$\mathcal{M}_{FR}(n) = \frac{3-n}{3-2} = \frac{3-n}{2}$$
 .:  $\mathcal{M}_{FR}(2\cdot 2) = \underline{0\cdot 8}$   
Prepared by Dihesh Kute

Rune (i)	wi	yi
1	川(6)×从 <sub>FR</sub> (2·2) = 0·64	91 = I1 + 2 I2 = (+ 2(2.2) = 10.4
2	以 <sub>し</sub> (6)× 从Vを(2·2) = 0·16	92= 7+3 12= 12·(
3	Mm (6) x Mfr (2.2)	y3 = 2I1+2I2=16.4
4	Mm (6) X My (2.2) = 0.04	44 = 2I 1+ 3I2 = 18.6

By sugeno inference system

(nip cwrput = y = 
$$\frac{\sum w^{i}y^{i}}{\sum w^{i}}$$

$$y = (0.64 \times 10.4) + (0.1(\times 12.6) + (0.16 \times 16.4) + (0.04 \times 18.6)$$

$$0.64 + 0.(6 + 0.16 + 0.04)$$

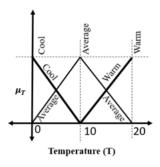
$$= 12.04$$

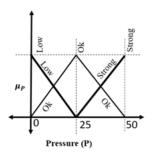
#### MAMDANI INFERENCE SYSTEM

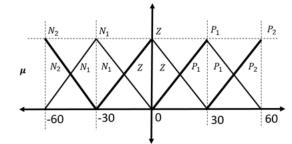
- In 1975, Professor Ebrahim Mamdani of London University built one of the first fuzzy systems to control a steam engine and boiler combination.
- He applied a set of fuzzy rules supplied by experienced human operators.

#### **EXAMPLES**

Consider the design of a fuzzy controller for a steam turbine. Assume the input of the fuzzy controller as temperature and pressure with 3 descriptors and output will be throttle setting of a steam turbine with 5 descriptors given below,







 $N_2$ : Large Negative N<sub>1</sub>: Small Negative Z: Zero

 $P_1$ : Small Positive  $P_2$ : Large Positive

Throttle Setting of Steam Turbine

Find throttle position of the turbine for temperature = 8 & pressure = 40 using Mamdani Inference System and defuzeification method middle of Maxima with following

funy RWU,

	Low	Ok	Strong
Cool	$P_2$	Z	$N_2$
Average	$P_2$	Z	$N_1$
Warm	$P_1$	$N_2$	$N_1$

sil": step I: Identify input and output variables and decide descriptor for the same.

### Descriptors for Input variable

Temperature

Presture

1 Cool

1 LOW

2 Average

@ OK

3) Warm

3 stong

Temperature (T)

Descriptor for the output variables

Throttle setting for steam turbine

- 1 N2 = large negative
- @ NI = small negative
- 3 Z = 2000
- @ Pi = small positive
- B P2 = large positive

Step I ! Find membership value of given input variables.

case I: When temperature = 8

$$W^{cD}(x) = W^{cool}(x) = \frac{10-x}{10}$$

Eqn of line co:

$$\frac{y-y_1}{x-x_1} = \frac{y_2-y_1}{x_2-x_1}$$



$$\mathcal{M}_{(00)}(8) = \frac{10-8}{10} = \frac{2}{10} = \frac{1}{5}$$
  $\mathcal{M}_{(00)}(8) = \frac{1}{5}$ 

$$M_{AB}(n) = M_{Average}(n) = \frac{n}{10}$$

for of line AB:

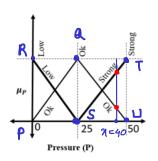
$$\frac{y-o}{x-o} = \frac{1-o}{10-o} \implies y = \frac{x}{10}$$

:. 
$$\mu_{\text{Average}}(8) = \frac{8}{10} = \frac{4}{5}$$
 :.  $\mu_{\text{Average}}(8) = \frac{4}{5}$ 

case I : When present = 40

$$M_{QU} = M_{OK}(\pi) = \frac{50 - \pi}{25}$$

Egn of line QU:



$$\frac{y-1}{x-25} = \frac{0-1}{50-25} \Rightarrow y-1 = \frac{-(x-25)}{25}$$

$$\Rightarrow y = 1 - 25$$

$$\exists y = \frac{50 - \chi}{25}$$

$$... \mathcal{M}_{0K}(40) = \frac{50-40}{25} = \frac{10}{25} = \frac{2}{5} \qquad ... \mathcal{M}_{0K}(40) = \frac{2}{5}$$

$$M_{OK}(40) = \frac{2}{5}$$

$$M_{ST}(\lambda) = M_{Strong}(\eta) = \frac{\chi - 25}{25}$$

Eqn of line ST:

$$\frac{y-0}{2x-25} = \frac{1-0}{50-25} \implies y = \frac{2x-25}{25}$$

:. 
$$\mathcal{M}_{\text{Strong}}(40) = \frac{40-25}{25} = \frac{15}{25} = \frac{3}{5}$$
 :.  $\mathcal{M}_{\text{Strong}}(40) = \frac{3}{5}$ 

step II: Fuzzy rule chalustion

When temperature = 8 and pressure = 40

: 
$$u_{(00)}(8) = \frac{1}{5}$$
  $u_{0K}(40) = \frac{2}{5}$ 

 $M_{\text{A versuse}}(8) = \frac{4}{5}$   $M_{\text{Strong}}(40) = \frac{3}{5}$ 

	LAGIZOUS				
		Low	Ok	Strong	
	Cool	$P_2$	Z	$N_2$	
19-	Average	$P_2$	Z	$N_1$	
	Warm	$P_1$	$N_2$	$N_1$	

Rule 1: Temp is cool and Present is  $\frac{0K}{1}$   $R_1 = \min \left\{ \frac{1}{5}, \frac{2}{5} \right\} = \min \left\{ 0.2, 0.4 \right\} = \frac{0.2}{1}$ 

Rue 2: Temp is cool and Pressure is strong  $R_2 = \min \left\{ \frac{1}{5}, \frac{3}{5} \right\} = \min \left\{ 0.2, 0.6 \right\} = \underline{0.2}$ 

Rune 3: Temp is Average and Pressure is 0KR3 = min  $\left\{\frac{4}{5}, \frac{2}{5}\right\}$  = min  $\left\{0.8, 0.4\right\}$  = 0.4Prepared by Dinesh Kute

RWE 4: Temp is Average and Pressure is Strong  $R_4 = \min \left\{ \frac{4}{5}, \frac{3}{5} \right\} = \min \left\{ 0.8, 0.6 \right\} = 0.6$ 

### Step II. Defuzzification method

By Middle of maxima method

Throttle position of = max & R1, R2, R3, R4} the Turbine

= 
$$\max \{ 0.2, 0.2, 0.4, 0.6 \}$$

$$= \underline{0 \cdot 6} \left( = \frac{3}{5} \right)$$

Hence it is corresponding RME 4 When temp is Average and Procorum is Strong

$$M_{N_1}(n) = 0.6$$

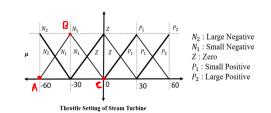
\* Membership function of N,

$$\frac{y-y_1}{x-x_1}=\frac{y_2-y_1}{x_2-y_1}$$

$$\frac{y-0}{x+60} = \frac{1-0}{-30+60}$$

# Pressore

		Low	Ok	Strong
_	Cool	$P_2$	Z	$N_2$
Temp-	Average	$P_2$	Z	$N_1$
	Warm	$P_1$	$N_2$	$N_1$



$$y = \frac{x + 60}{30}$$

$$\therefore M_{AG}(n) = \frac{n+60}{30}$$

1 Eyn of line BC:

$$\frac{y-y_1}{x-x_1} = \frac{y_2-y_1}{x_2-x_1}$$

$$\frac{9-1}{3+3\delta} = \frac{0-1}{0+3\delta}$$

$$\therefore \quad \forall -| = - \frac{30}{30}$$

$$\therefore \quad y = 1 - \frac{(\chi + 30)}{30}$$

$$y = -\frac{\pi}{30}$$

$$\therefore M_{BC}(n) = -\frac{n}{30}$$

$$0.6 = \frac{\chi + 60}{3 v}$$

and 
$$0.6 = -\frac{\eta}{30}$$

$$\Rightarrow \sqrt{x = -42}$$

and 
$$\chi = -18$$

Throttle setting of Twobine = 
$$\frac{-42-18}{2} = -30$$

Design a counter to determine the wash time of a domestic washing machine. Assume the imput is dirt and grease on cloths. Use three descriptors for imput variables and five descriptors for output variables wash time as below

Dirt = { SD, MD, LD}, Crocase = { NG, MG, LG}

SD = Small dist

MD = Medium dirt

LO = Large dirt

NG = No grease

MG = Medium greax

LG = Large grense

Wash Time = { VS, S, M, L, VL}

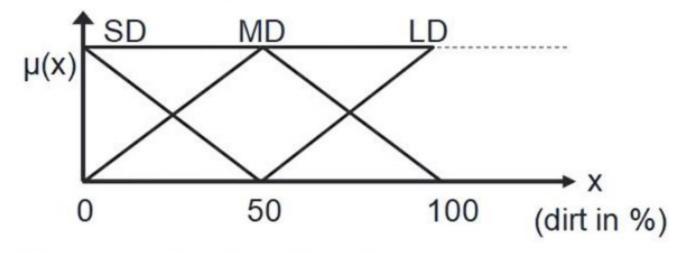
VS = very shoot m = medium VL = Very Large.

S = Shoot L = Large

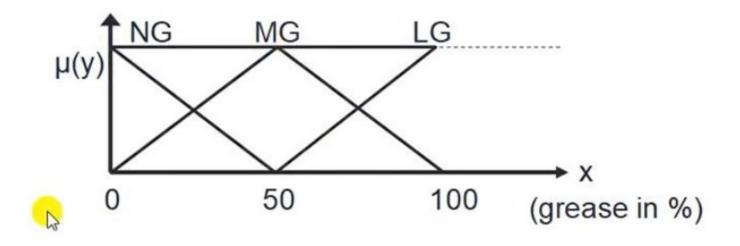
Find the wash time of washing machine for dirt = 60% and greate = 70% using defuzzificant method - middle of maxima and fuzzy nues given below,

		greux				
		NG	MG	LG		
	az	V5	M	L		
dirt	MD	S	M	L		
	LD	M	L	٧L		

### (1) Membership function for dirt:

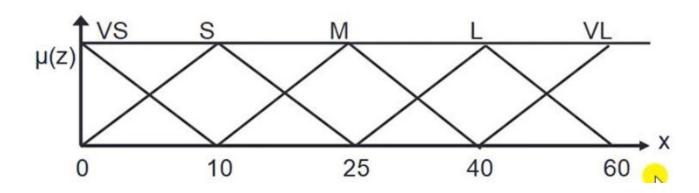


### (2) Membership function for grease:



Prepared by Dinesh Kute

### (3) Membership function for Wash time:



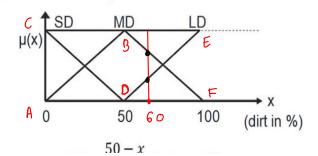
5:17: Step I: Identity input and output variables and decide descriptor for the same.

Step I ! Find membership value of given input vanables.

When dirt = 60%.

### Eq" of line DE;

(1) Membership function for dirt:



$$\frac{y-y_1}{y-y_1} = \frac{y_2-y_1}{y_2-y_1} \implies \frac{y-0}{y-50} = \frac{1-0}{100-50} \implies y = \frac{y-50}{50}$$

$$\therefore \mathcal{M}_{DE}(n) = \mathcal{M}_{LD}(n) = \frac{n-50}{50}$$

.. 
$$\mathcal{M}_{LD}(60) = \frac{60-50}{50} = \frac{1}{5} = 0.2$$
 ..  $\mathcal{M}_{LD}(60) = 0.2$ 

Eqn of line BF:

$$\frac{9-91}{2N-2N} = \frac{9^2-91}{2N-2N} \implies \frac{3-1}{2N-2N} = \frac{D-1}{2N-2N} \implies \frac{3-1}{2N} = \frac{-(N-2N)}{2N}$$

$$\therefore \lambda = 1 - \frac{20}{3 - 20} = \frac{20}{100 - 3}$$

:. 
$$M^{BE}(y) = M^{MD}(y) = \frac{20}{100 - x}$$

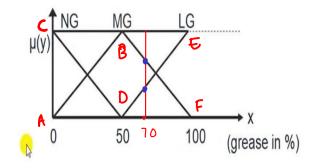
:. 
$$\mu_{MD}(60) = \frac{100-60}{50} = \frac{4}{5} = 0.8 \Rightarrow \mu_{MD}(60) = 0.8$$

### When grewe = 70%.

### Eqn of line DE:

$$\frac{y-y_1}{y-y_1} = \frac{y_2-y_1}{y_2-y_1}$$

### (2) Membership function for grease:



$$\frac{3}{3} \frac{3-0}{3-0} = \frac{100-20}{1-0} \Rightarrow 3 = \frac{20}{3-20}$$

$$\therefore M_{OE}(n) = M_{LG}(n) = \frac{n-50}{50}$$

$$\therefore \mathcal{M}_{LG}(70) = \frac{70-50}{50} = \frac{2}{5} = 0.4 \quad \therefore \mathcal{M}_{LG}(70) = \underline{0.4}$$

$$\frac{N-N1}{N-N1} = \frac{N_2-N1}{N^2-N1} \Rightarrow \frac{N-ND}{N-ND} = \frac{100-SD}{100-SD} \Rightarrow S-1 = \frac{SD}{(N-SD)}$$

$$\therefore A = 1 - \frac{20}{3 - 20} \Rightarrow A = \frac{20}{(00 - 3)}$$

$$\therefore MBL(u) = MMR(u) = \frac{100 - u}{20}$$

$$\frac{1}{\text{Prepared 59}} = \frac{3}{\text{50}} = \frac{3}{$$

### step II: Fuzzy rule chalustion

When dirt = 60% and great = 70%.

$$\mathcal{L}_{\text{LD}}(60) = 0.2$$

		NG	grews MG	LG	
	as	V5	M	L	_
dirt	MD	S	·W	L	
	LD	M	L	٧L	

RWe 1: Dirt is MD and Grease is MG  $R_1 = \min \{0.8, 0.6\} = \underline{0.6}$ 

Rule 2: Dirt is MD and Great is 29  $R_2 = min \{0.8, 0.43 = 0.4$ 

RMr 3: Dirt is LD and Greax is MG

R3 = { o. 2, o.6} = o. 2

Prepared by Dinesh Kute

Ruse 4: Dirt is LO and Growse is LG
$$R4 = \begin{cases} 0.2, 0.4 \\ \end{cases} = 0.2$$

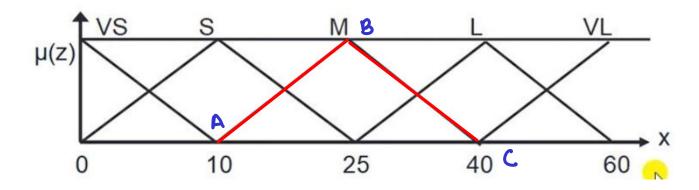
Step II. Defuzzification method

By middle of maxima

It correspond to Rune 1 where Dirt is MD and Greax is MG

.. Hence output wash time is M

### (3) Membership function for Wash time:



Egn of line AB:
Prepared and Bressh Kute

$$\frac{y-0}{n-10} = \frac{1-0}{25-10} \implies y = \frac{n-10}{15}$$

:. 
$$MBB(n) = \frac{N-10}{15}$$

$$\frac{y-1}{N-25} = \frac{0-1}{40-25} \implies y-1 = \frac{-(N-25)}{15}$$

$$y = 1 - \frac{n-25}{15} = \frac{40-n}{15}$$

$$\therefore M_{B_{\zeta}}(n) = \frac{40-n}{15}$$

$$\therefore \quad \text{MAB}(n) = 0.6$$

$$\frac{31-10}{15} = 0.6$$

$$\frac{\zeta_0 - \lambda}{\zeta_0 - \lambda} = 0.6$$

and 
$$n = 31$$

:. Wash time = 
$$\frac{19+31}{2} = 25 \text{ min}$$