

Attached Lecture : Robot Programming and Control Algorithms for Labs

- 1 Introduction
- 2 The programming environment
- 3 Real-time languages for robots
- 4 Computer control architectures
- 5 Three basic control principles
- 6 PID control algorithm
- 7 Fuzzy control algorithm
- 8 Summary



1 Introduction - Robot Programming & Control



1 Introduction - Performance Specifications

Motion commands

- Motion commands are sent to individual controllers.
- Each controller has a feedback control loop.

Concurrency

- There are different time requirements in the task hierarchy.
- Control program is divided into many independent processes.
 - 1) parallel processing (multi-processors)
 - 2) multitasking Operating System
 - 3) concurrent language (time slicing)
- Concurrent processes in a robot can not run in isolation.
- Three ways: shared memory, remote procedure call, and message passing

Inter-process Communication

- Robots need to be synchronised with external events, e.g. initiation events, termination events, error events.



1 Introduction - Performance Specifications

Polling & Interrupt

- The robot needs to be synchronised with external events, e.g. initiation events, termination events, error events.
 - Two event detection methods:
 - **Polling** processes continually check the sensor input.
 - **Interrupt routines** set a flag & handle the trigger events.
-

Sensor variables

- They are used to store the sensor data.
 - Sensor data may different data structures:
a single bit, a binary number or an array.
-

Initialisation

- To place a robot in a known home position and the sensors such as incremental encoders should be zeroed.
-

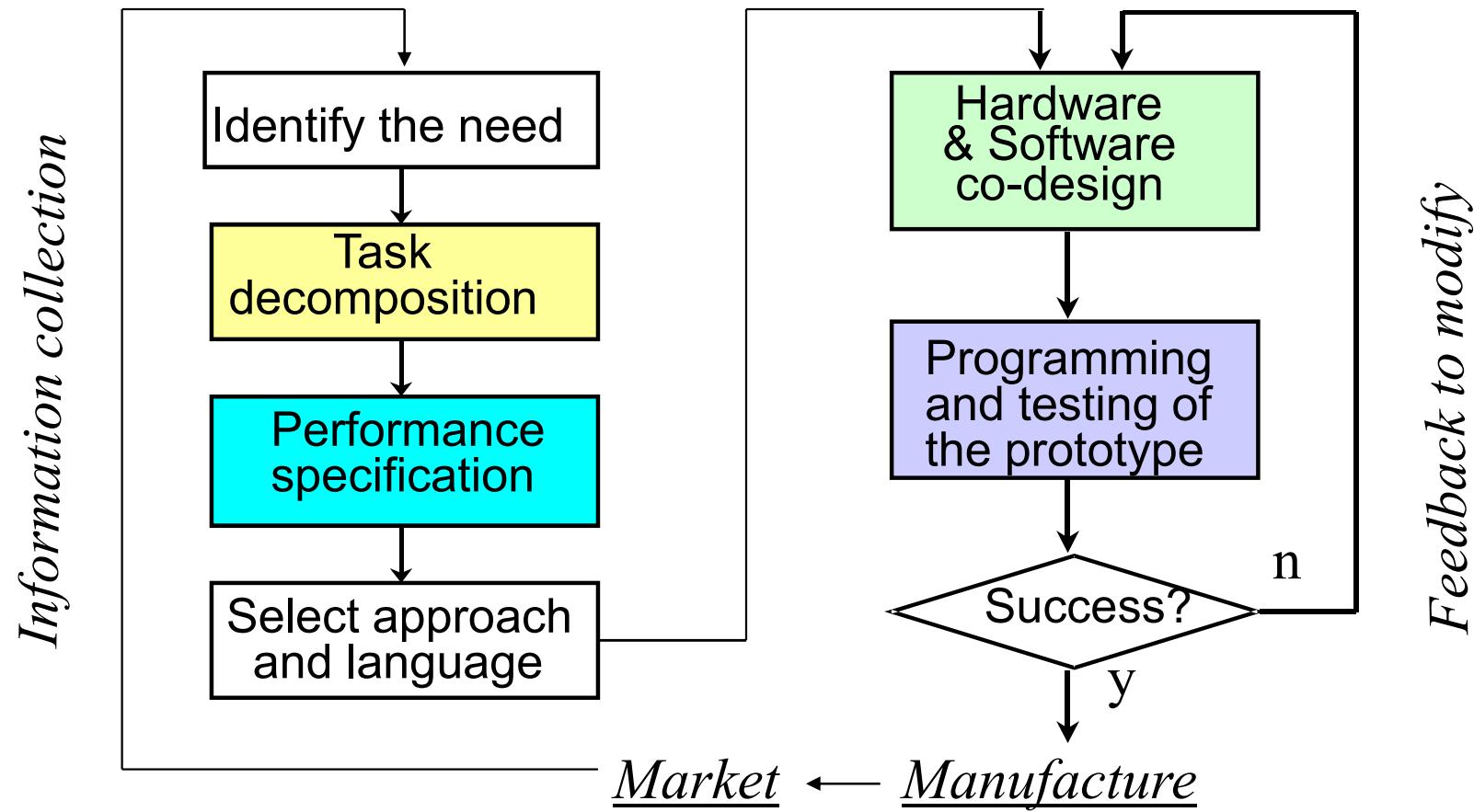
Termination

- Control programs should detect possible failure situations and abort gracefully.
- Watchdog timers are used to detect failures for graceful abort.

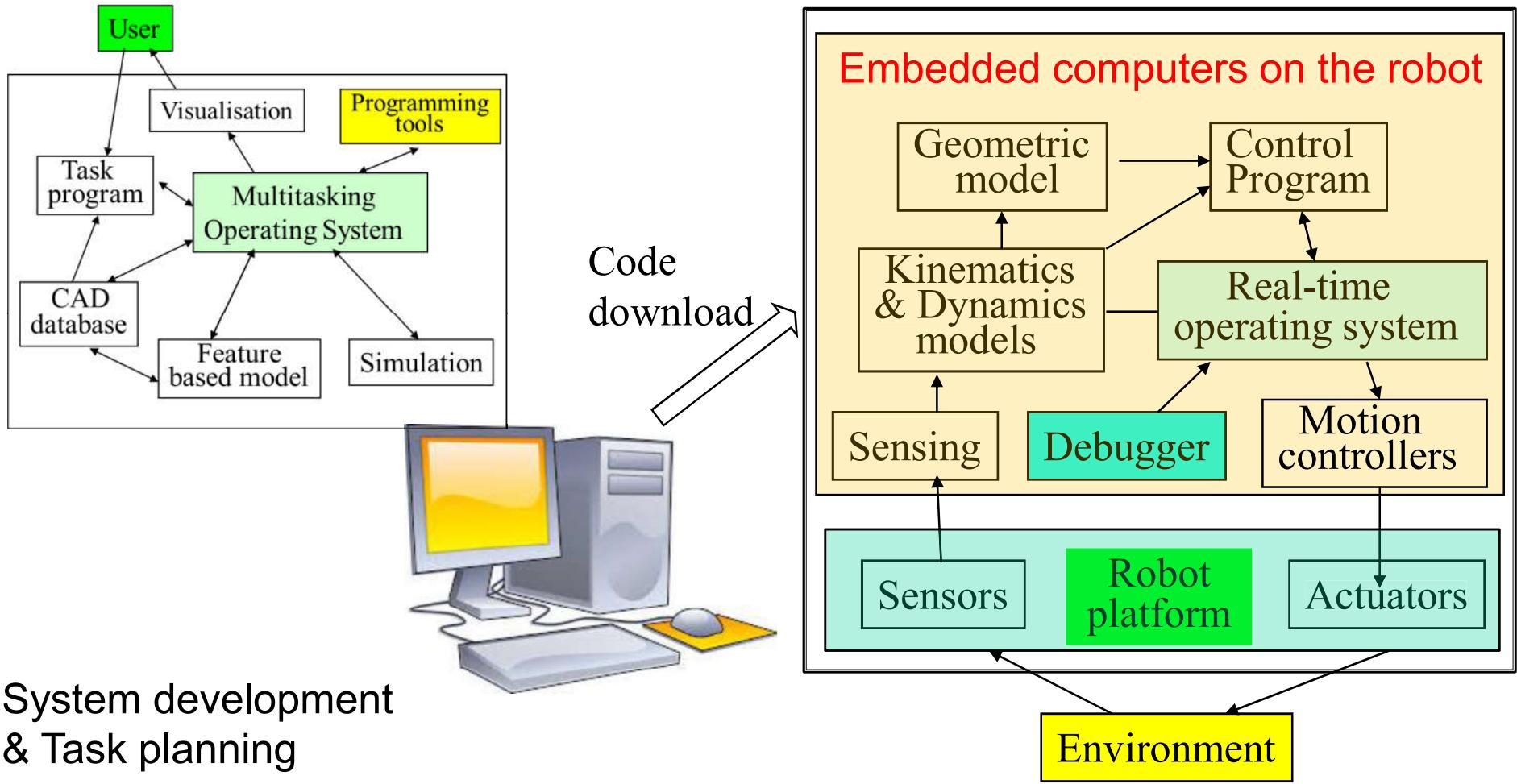


2 The Programming Environment for Robots

The development process

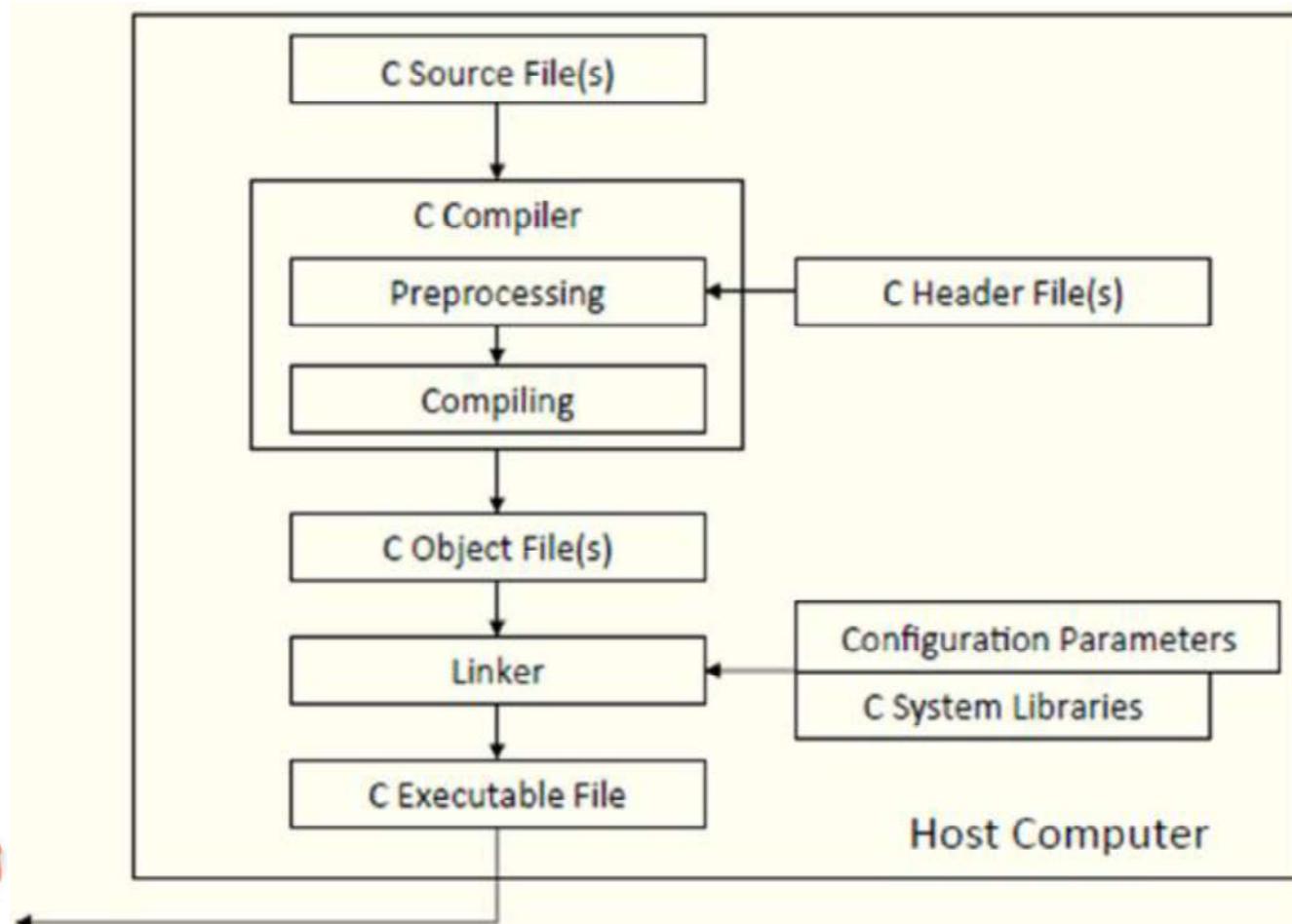
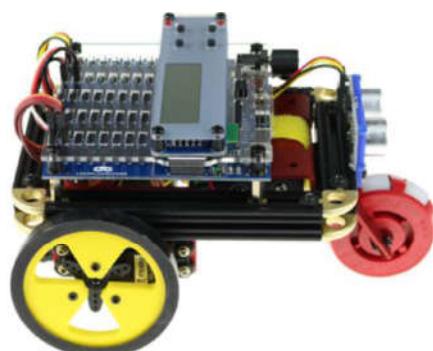


2 The Programming Environment for Robots



2 The Programming Environment for Robots

- C Language is widely used for robot programming.



2 The Programming Environment for Robots

Programming industrial robot

- Online
- Offline



3 Real-time Languages

Scientific language features

- Variables & constants initialisation
- Data type -- points & structure
- Control structures, program layout and syntax
- Scope and visibility rules
- Modularity & compilation methods
- Exception handling

Real-time language features

- All features in scientific languages
- Construction of modules
- Creation and management of tasks
- Handling of interrupts & devices
- Inter-task communication
- Mutual exclusion



3 Real-time Languages

High-level scientific languages

- CORAL - (Woodward, *et al.*, 1970)
- RTL/2 (Barnes 1976)
- Ada (Yong 1972)
- ARGUS (liskov & Scheifler, 1983)
- KONIC (Kramer, *et al.*, 1983)
- CSP (Hare, 1978)
- CUTLASS (Bennett&Linkens,1984)
- FORTH (Brodie, 1986)
- Modula-2 (Wirth, 1982)
- OCCAM (Burns, 1988)
- PEARL/SR (Andrews, 1981/1982)
- C/C++ (Kernighan&Ritchie, 1985)
- Python (Guido van Rossum, 1991)
- Java/Real-time Java (1997)

Assembly languages for real time

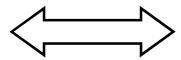
- Assembly languages are processor dependent
- They are widely used for small real-time systems.
- Advantages are:
 - efficient use of CPU
 - easy access interface
 - support interrupts
- Disadvantages:
 - time consuming
 - difficult debugging
 - poor portability



3 Real-time Languages

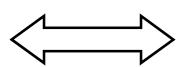
Example: C and Assembly Languages

x = y + 133;



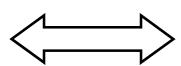
```
MOVE R1, (y) ; Get the value y into R1  
ADD R1, 133 ; Add 133  
MOVE (x), R1 ; Save the result in x
```

If (x >= z)



```
MOVE R2, (z) ; Get the value z  
SUBTRACT R1, R2; Subtract z from x  
JCOND NEG, L101; Skip if the result is negative
```

W = sqrt (z)



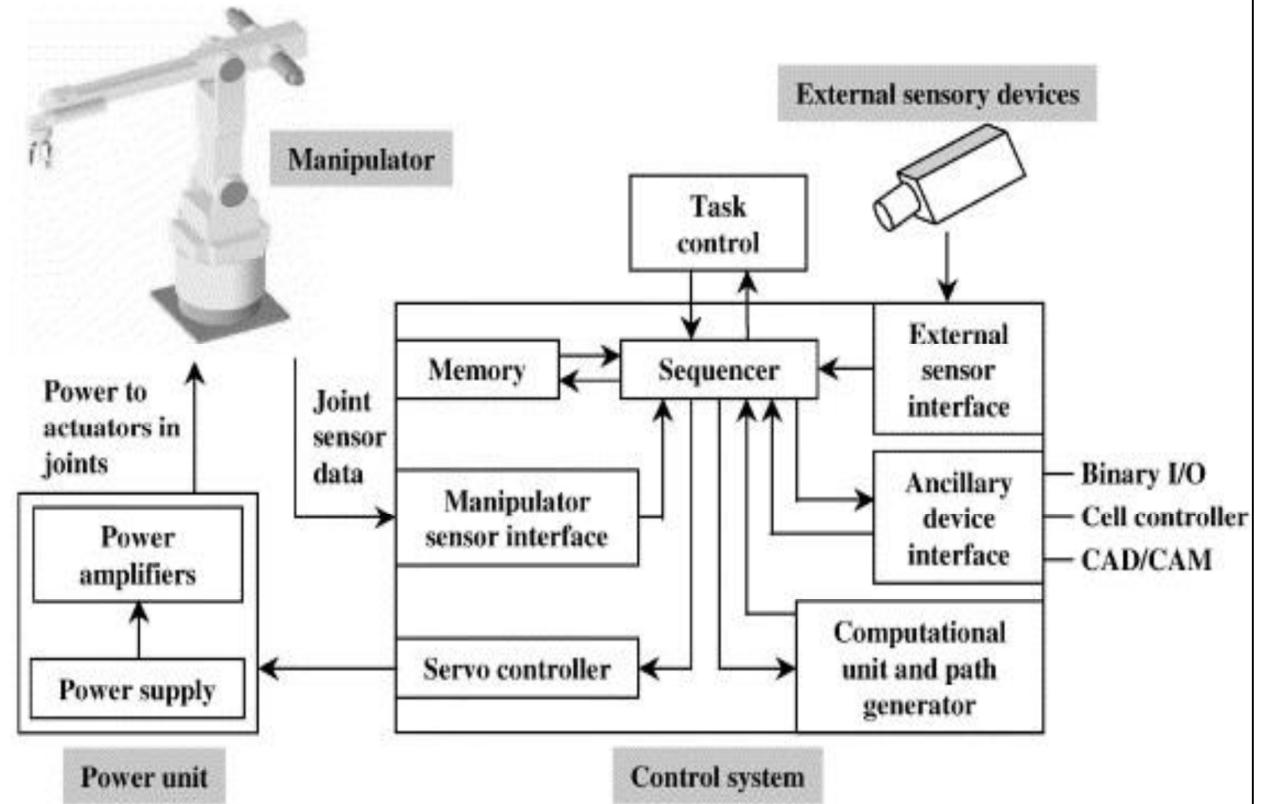
```
MOVE R1, (z) ; Get the value z into R1  
PUSH R1 ; Put the parameter on the stack  
CALL SQRT ; Call the sqrt function  
MOVE (w), R1 ; The result return to R1  
POP R1 ; Throw away the parameter
```



4 Computer Control Architectures

1. Centralised control

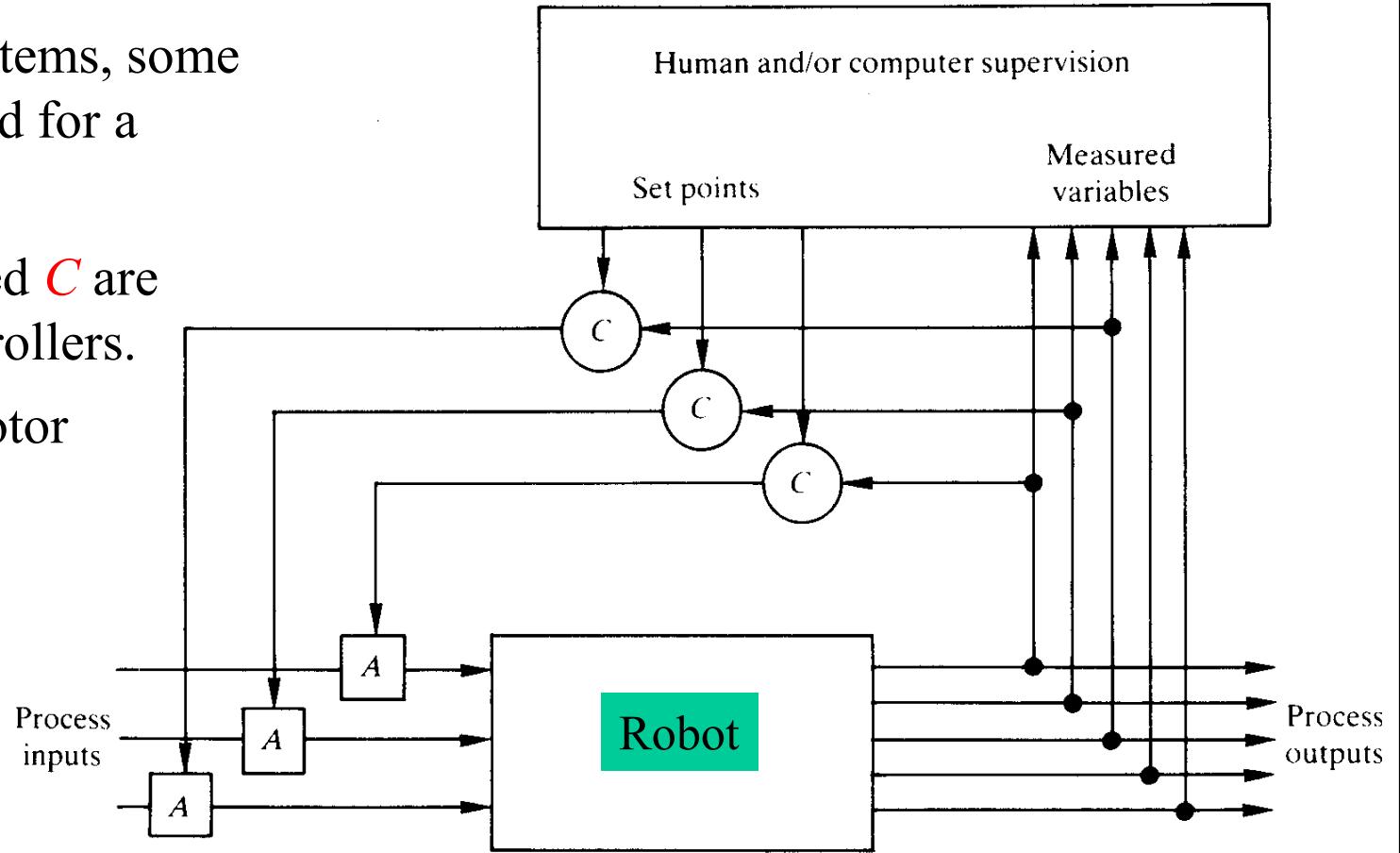
- ❑ Centralised computer control is very popular in 1960-1980, as computers were very expensive.
- ❑ A centralised computer has to deal with many different types of tasks and operations.
- ❑ Difficult programming, testing and debug.



4 Computer Control Architectures

2. Supervisory control

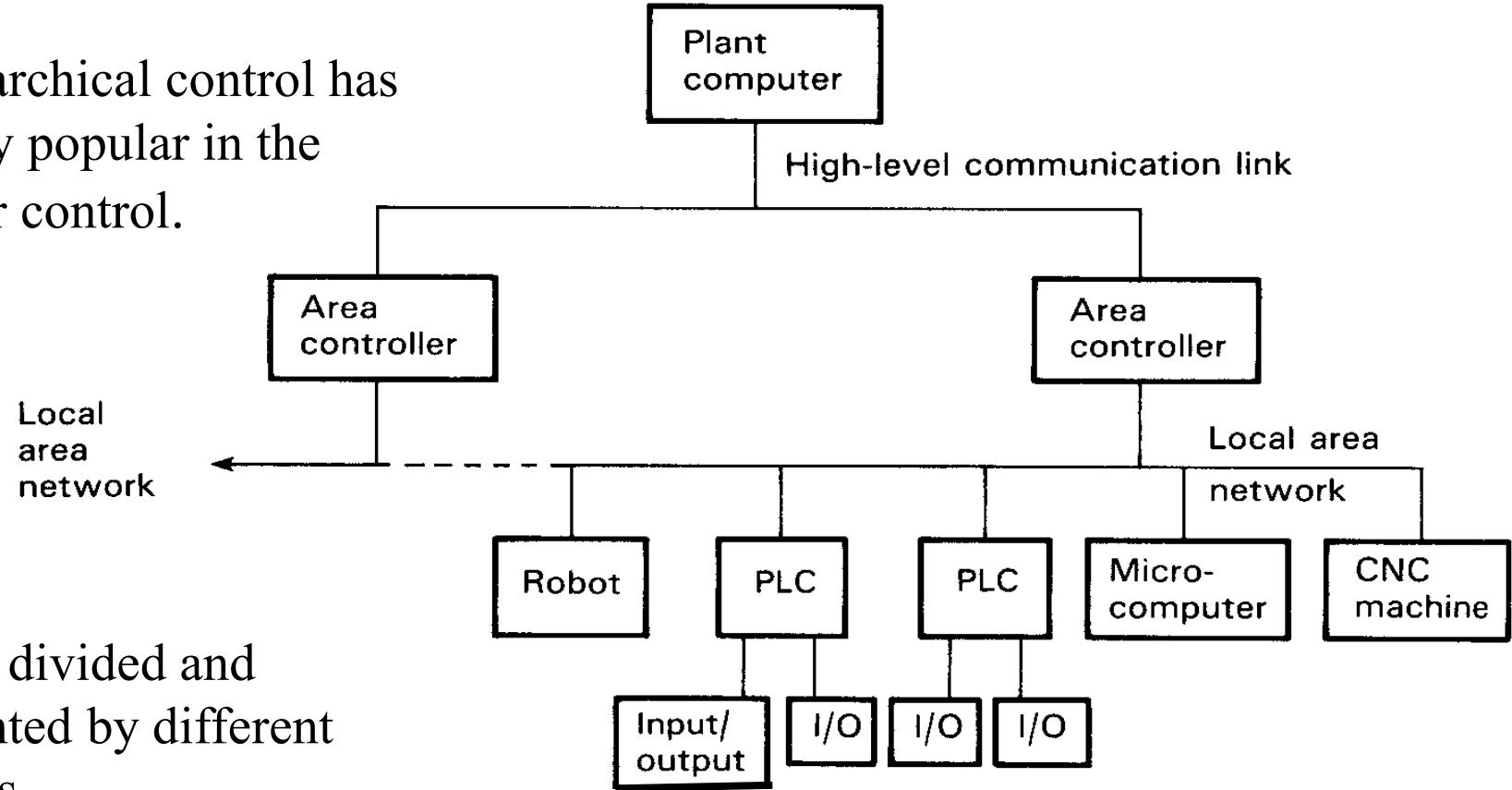
- In many robot systems, some computers are used for a supervisory role.
- The circles labelled **C** are the feedback controllers.
- The **A** means a motor or a actuator.
- The supervisory computer adjusts set points to the feedback controllers.



4 Computer Control Architectures

3. Hierarchical control

- The hierarchical control has been very popular in the computer control.



- Tasks are divided and implemented by different computers.

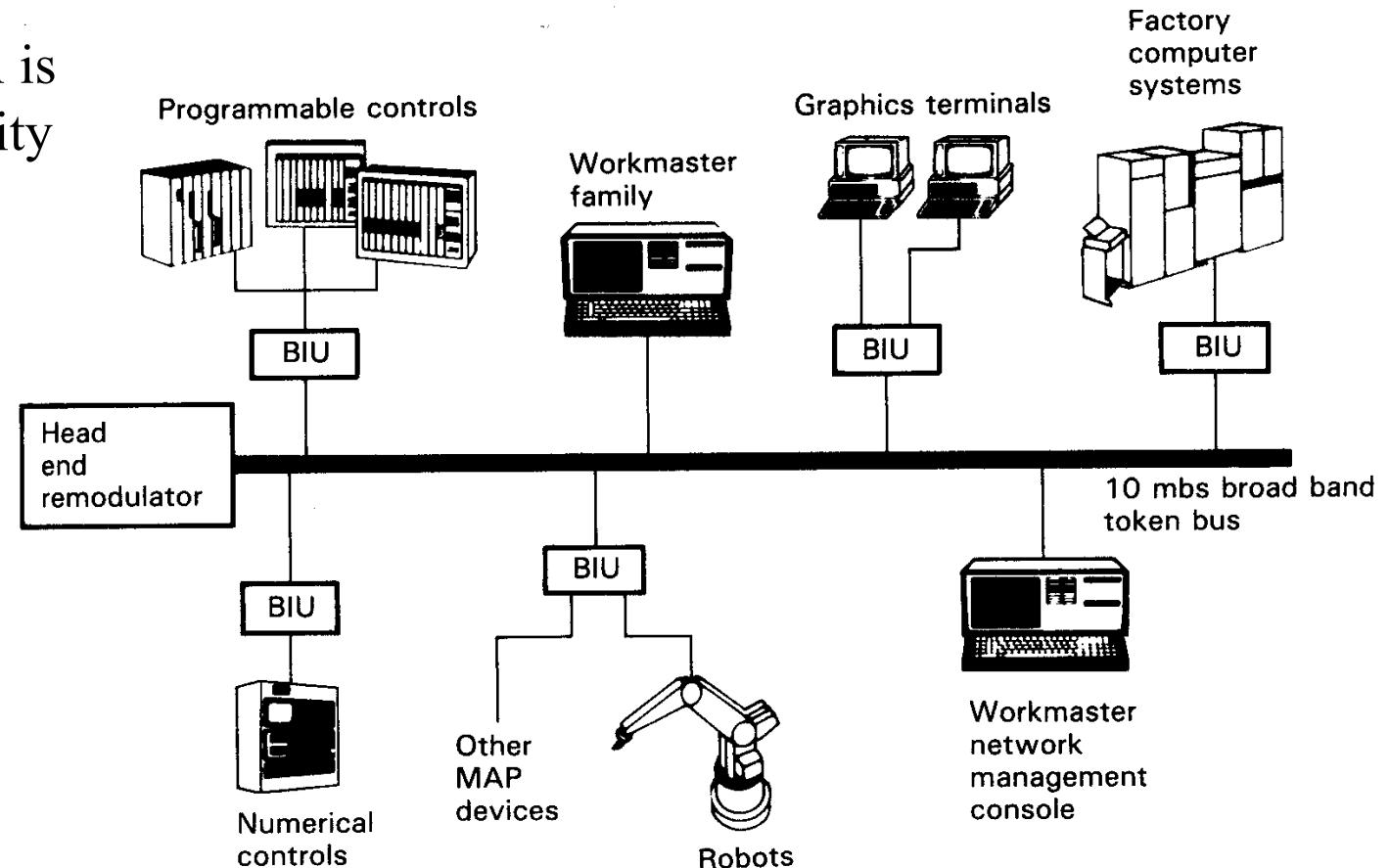


4 Computer Control Architectures

4. Distributed control

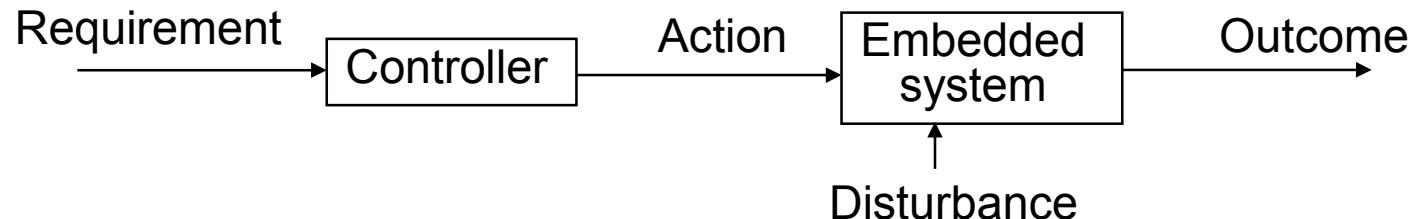
- Distributed control is to achieve scalability and reliability.
- Many computers perform similar tasks in parallel.
- High-bandwidth data highway is necessary.

Many fieldbuses: CAN & LonWorks

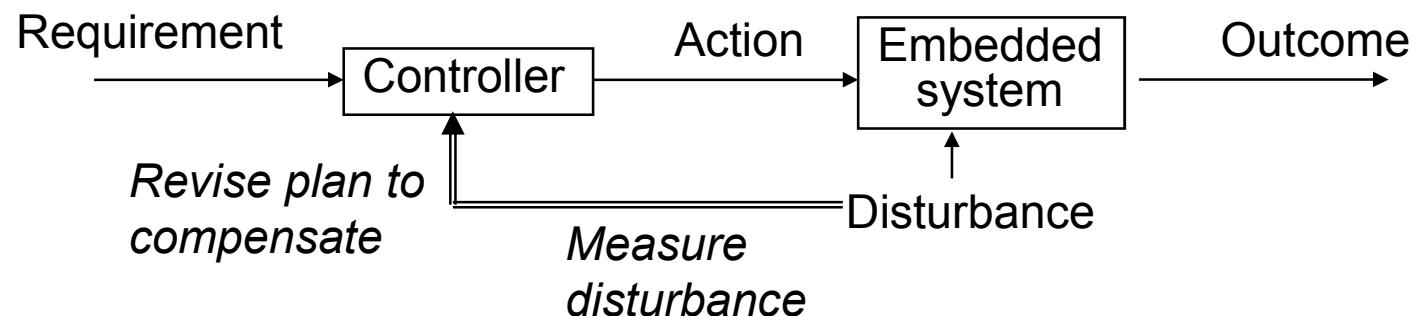


5 Three Basic Control Principles

1. Open-loop control -- a simplest form & predefined strategy



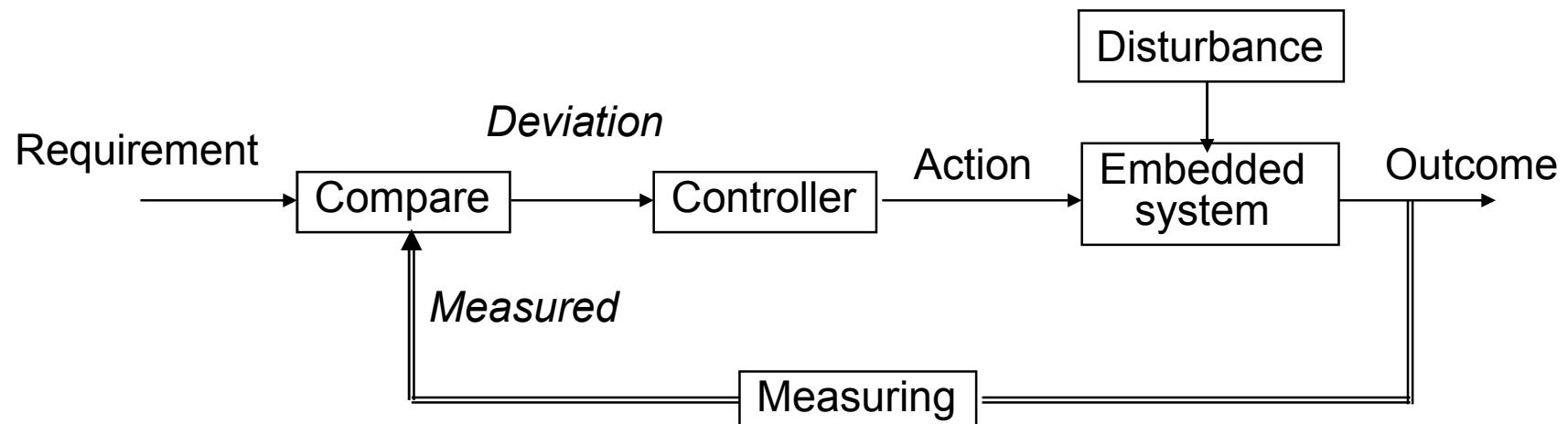
2. Feedforward control -- monitor & compensate disturbance



5 Three Basic Control Principles

3. Close-loop or Feedback control

- measuring disturbance effect
- calculating a correct action to minimise deviation.



$$\text{Deviation} = \text{requirement} - \text{measured value}$$



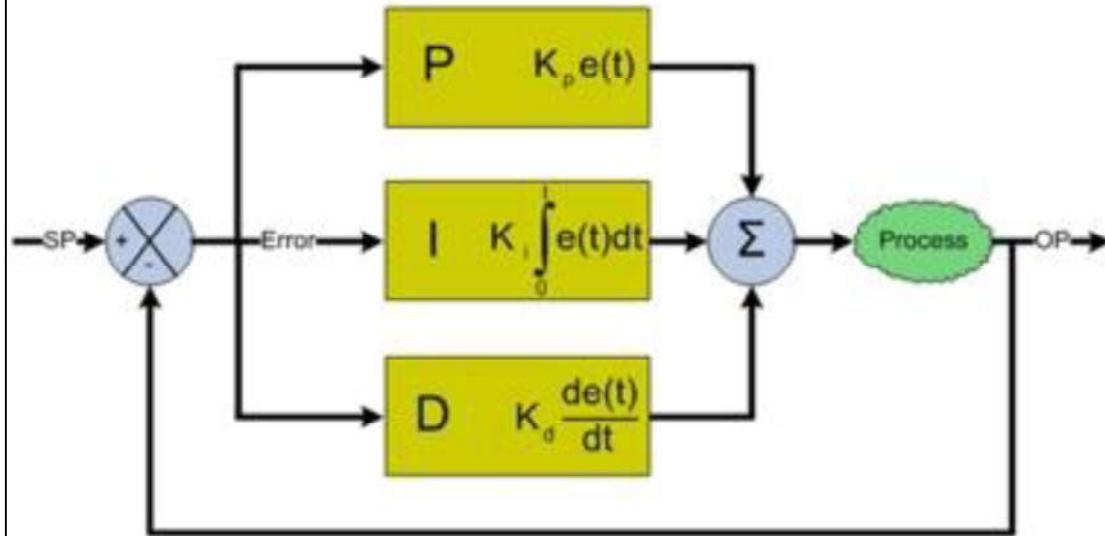
6 PID Control Algorithm

Control law: PID (Proportional+Integral+Derivative) control algorithm

- A well-established analogy control algorithm
 $e(t) = r(t) - f(t)$ -- error or deviation;
 $r(t)$ -- set points; $f(t)$ -- measured value

Differential equation:

$$V_o(t) = K_p e(t) + K_i \int_0^t e(t) dt + K_d \frac{de(t)}{dt}$$



The discrete PID:
(difference equation)

$$V_o = k_p e_n + K_i \sum_{i=1}^n e_i + K_d (e_n - e_{n-1})$$

where n is the present sample
 $n-1$ is the previous sample



6 PID Control Algorithm

- ***Proportional action*** is the simplest form of control and produces an output signal directly proportional (by an amplifying factor K_p) to the error input.

Note that:

Choosing the value of K involves a compromise:

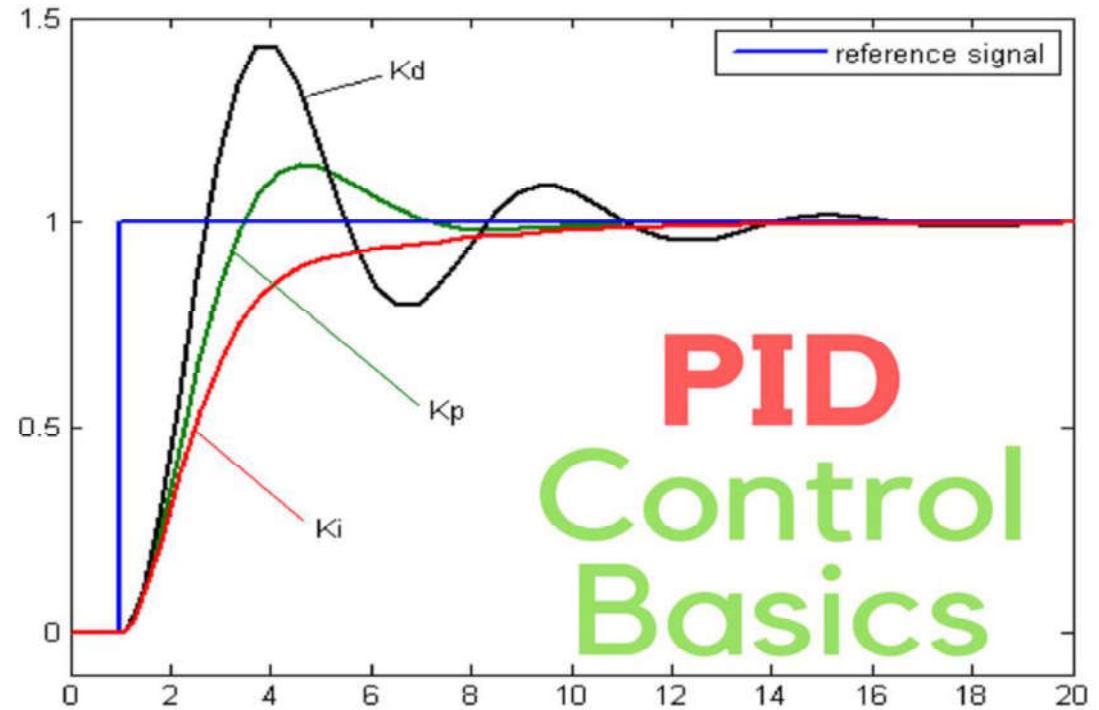
- A high value of K gives a small steady-state error and a fast response, but the response may be oscillatory and the system is unstable.
- A low value gives a slow response and a large steady-state error.



6 PID Control Algorithm

□ *Integration action*

generates an output signal proportional to the mathematical integral of the error, K_i , i.e. the summed history of the error. By adding integral action, the system will have zero steady-state error.



□ *Deviation action* provides an output signal proportional, K_d , to the change rate of the errors. It anticipates the error and reduce it quickly.



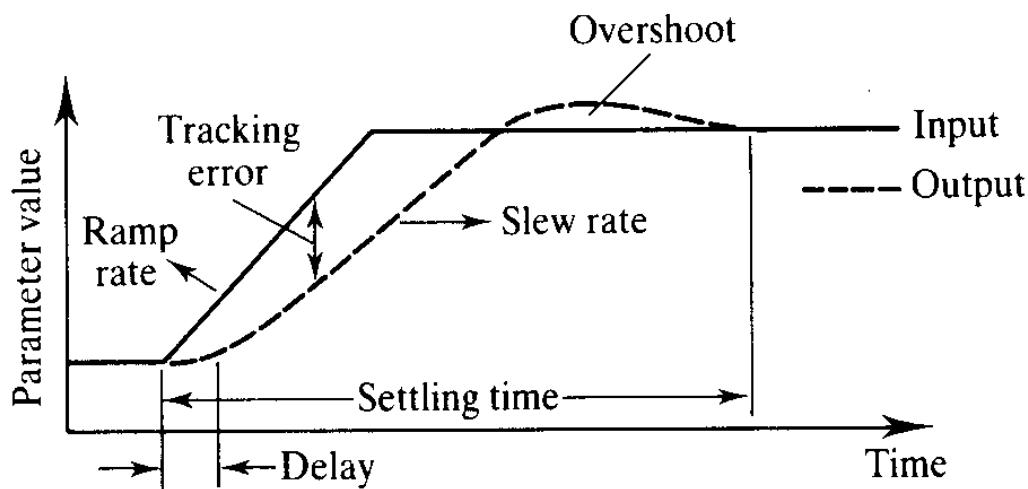
6 PID Control Algorithm

- **Response delay**

It is time between the input change and the output starts to change, as shown in the following figure.

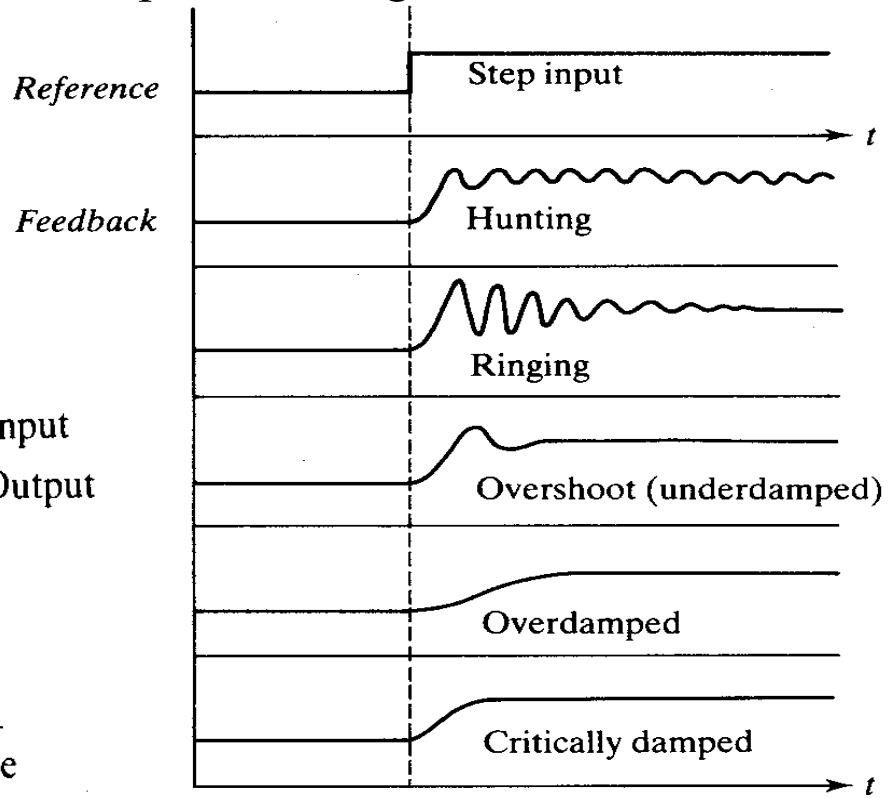
- **Response time**

It is to measure the maximum slew rate of the system between 10-90%



- **System stability**

A stable system should be critically damped. Hunting is unstable...



6 PID Control Algorithm

Example: A PID controller is used to control the speed of a car, which has the parameters: $K_p = 0.8$, $K_i = 0.5$ and $K_d = 0.4$.

$$V_o = k_p e_n + K_i \sum_{i=1}^n e_i + K_d(e_n - e_{n-1})$$

The speed of the car is set to be 50 Km/h for running 5 minutes. Its measured speed is 5 Km/h at the end of the 1st minute, 12 Km/h at the 2nd minute, 22 Km/h at the 3rd minute, 35 Km/h at the 4th minute, and 50 Km/h at the 5th minute. Calculate the controller output at the end of the 5th minute.

At the end of the 1st minute: $e_1 = 50 - 5 = 45$; At the end of the 2nd minute: $e_2 = 50 - 12 = 38$

At the end of the 3rd minute: $e_3 = 50 - 22 = 28$; At the end of the 4th minute: $e_4 = 50 - 35 = 15$

At the end of the 5th minute: $e_5 = 50 - 50 = 0$

Controller Output = $0.8 * 0 + 0.5 * (45 + 38 + 28 + 15 + 0) + 0.4 * (0 - 15) = 0 + 63 - 6 = 57$



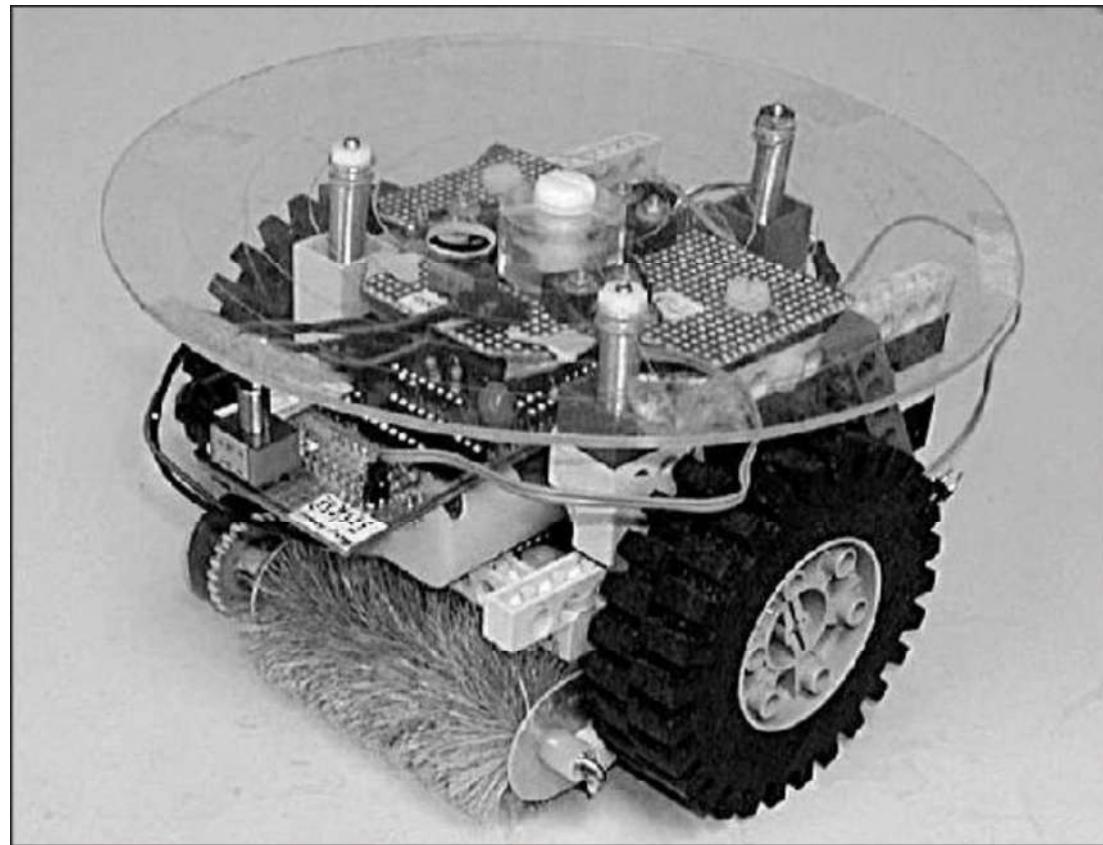
6 PID Control Algorithm-Application



6 PID Control Algorithm-Application

Simple PI controllers for a differential-driving robot, Rug Warrior

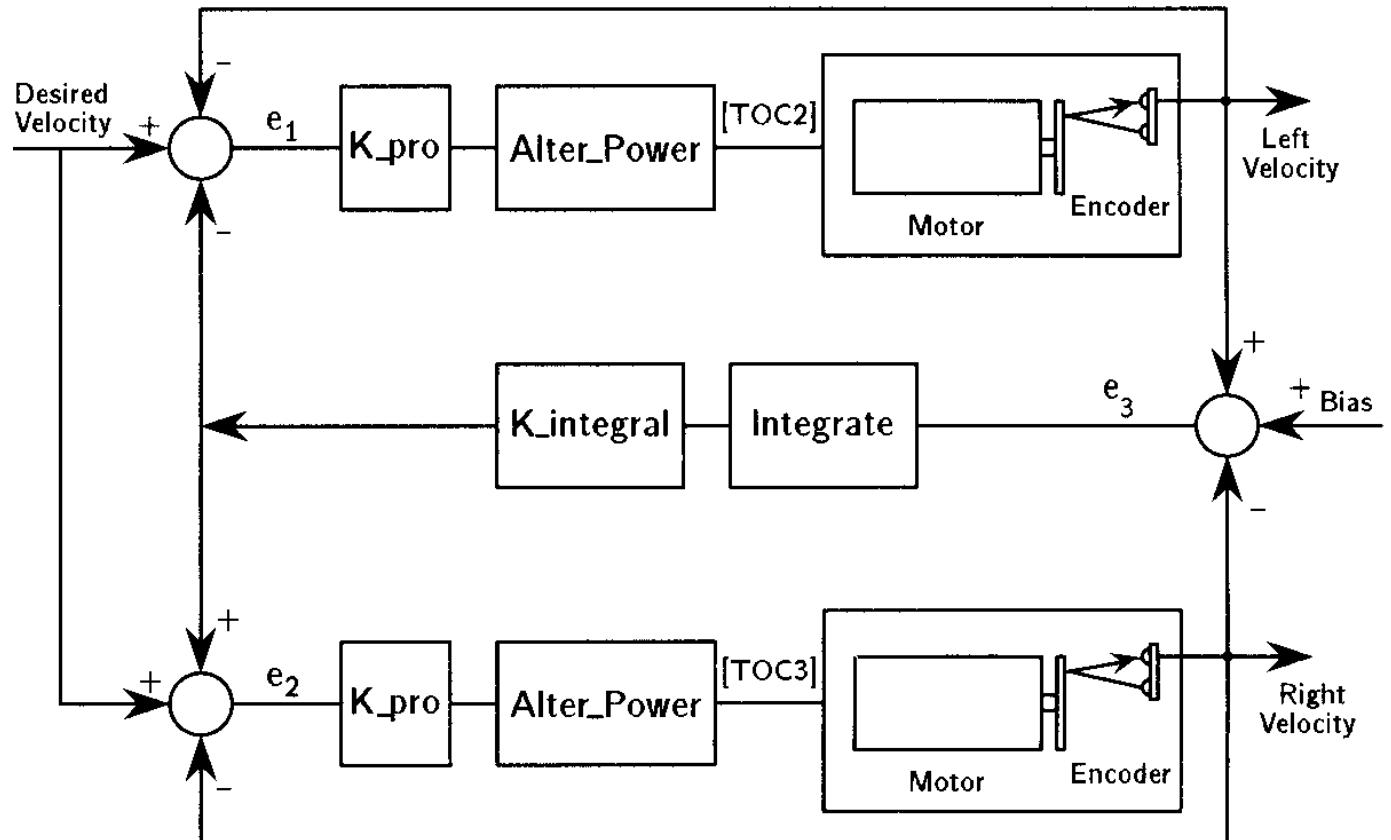
- ❑ There are two optic encoders used to measure the motor speed.
- ❑ Two proportional controllers are used to control two motors.
- ❑ An integration control, is used to synchronise two motors.



6 PID Control Algorithm-Application

Simple PI controllers for a differential-driving robot, Rug Warrior

- ❑ There are 3 control loops in this figure.
- ❑ Two proportional controllers are used to control 2 motors.
- ❑ An integration control, is used to synchronise two motors.
- ❑ Bias signal balances the difference of two motor speeds to achieve straight line motion.



6 PID Control Algorithm-Application

A simple Interactive C routines: (*“Mobile Robots” by JL Jones & AM Flynn at MIT*)

```
float control_interval=0.25; /* Run servo loop at this rate */
float des_vel_clicks = 0.0; /* Desired velocity, clicks/interval */
float des_bias_clicks = 0.0; /* Desired bias, clicks/interval */
float power[2] = {0.0,0.0}; /* Power command to motor */
float integral = 0.0; /* Integral of velocity difference */
float k_integral = 0.10; /* Integral error gain */
float k_pro = 1.0; /* Proportional gain */
float k_clicks = 8.0 / 100.0;

/* set power level */
void alter_power(float error, int motor_index)
{ power[motor_index]=limit_range(power[motor_index]+error, 0.0, 100.0);
  pwm_motor(power[motor_index], motor_index); }

float integrate(float left_vel, float right_vel, float bias)
{ integral=integral+left_vel - right_vel + bias;
  return integral;}
```



6 PID Control Algorithm-Application

```
void speed_control()
{ float left_vel, right_vel, integral_vel, left_error, right_error;
  while (1)
    { left_vel = get_left_vel ();           /* get current velocity using encoder readings */
      right_vel = get_right_vel ();
      integral_error = k_integral * integrate(left_vel, right_vel, des_bias_clicks);
      left_error = k_pro * (des_vel_clicks - left_vel - integral_error);
      right_error = k_pro * (des_vel_clicks - right_vel + integral_error);
      alter_power(left_error, 0);
      alter_power(right_error, 1);
      sleep (control_interval);          /* Run speed_control periodically */
    }
}

void start_speed_control ()
{ init_velocity ();
  init_pwm ();
  start_process (speed_control ());
}
```



6 PID Control Algorithm-Application

Rug Warrior
robot follows a
wall by using
its onboard
sonars

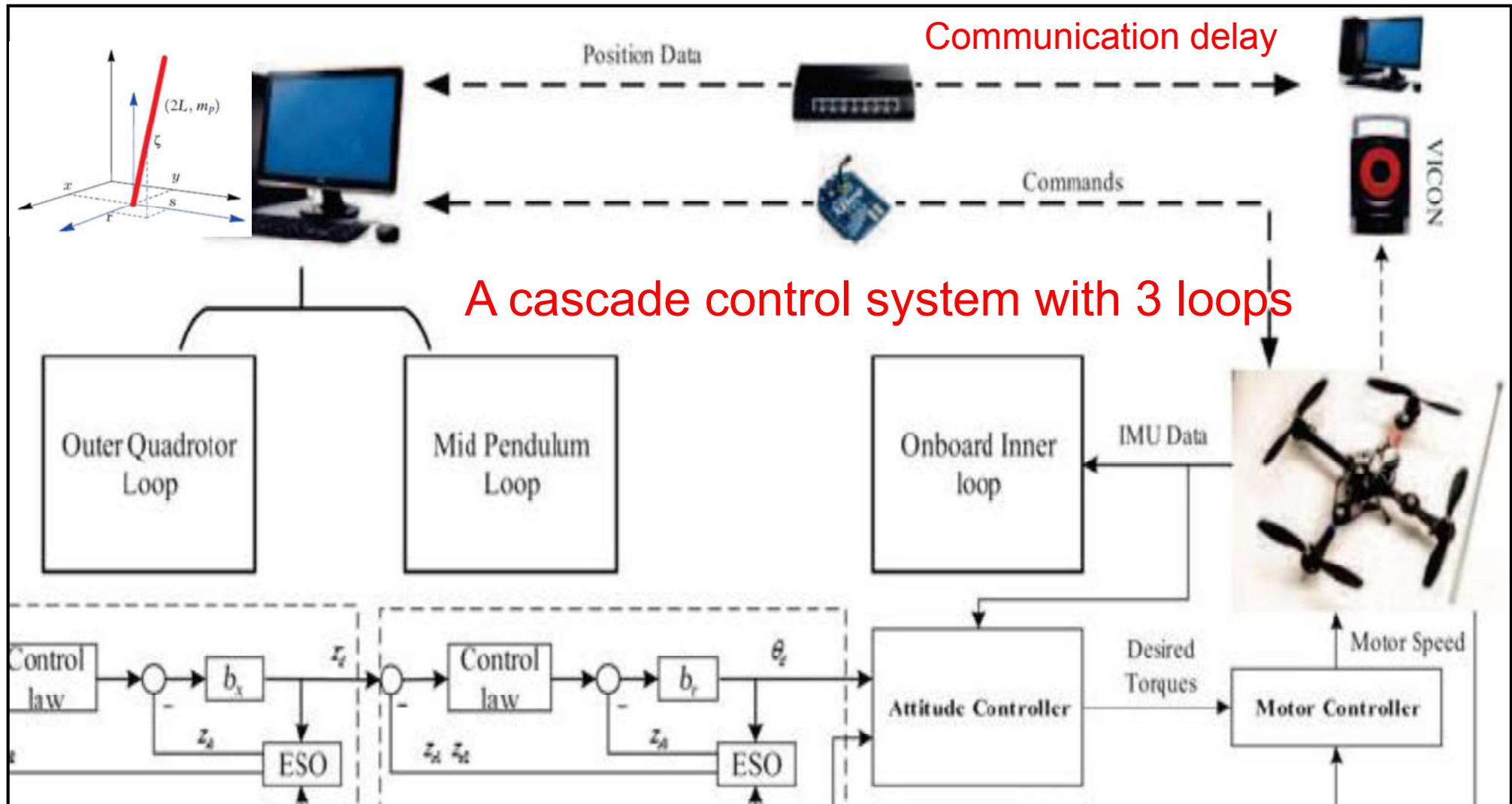


6 PID Control Algorithm-Application

PID control of a car



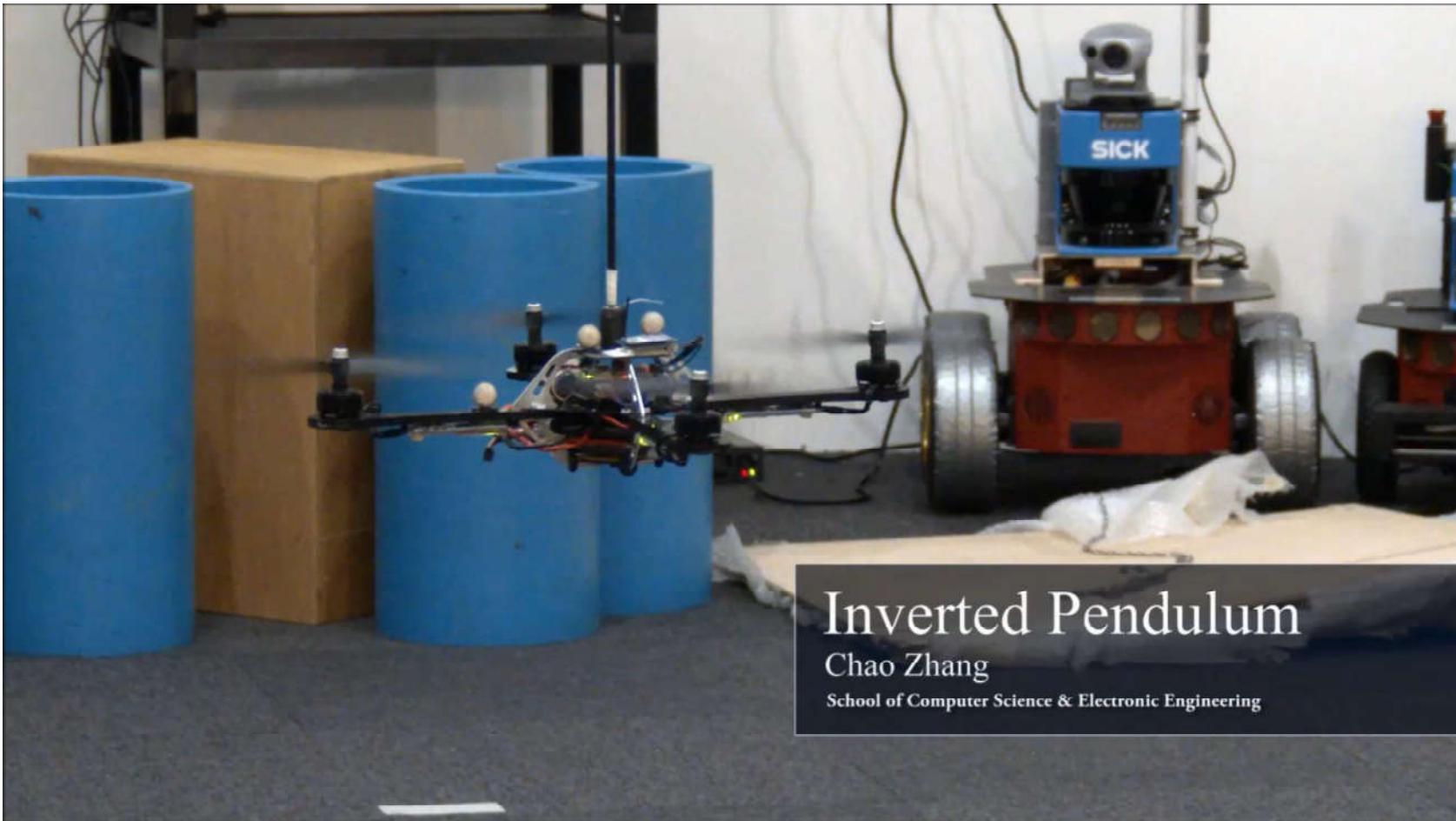
6 PID Control Algorithm-Application



Week 21



6 PID Control Algorithm-Application



7 Fuzzy Control Algorithm

7.1 Introduction

7.2 Set theory: Classic vs Fuzzy

7.3 Fuzzy membership functions

7.4 Linguistic variables

7.5 Fuzzification & Defuzzification

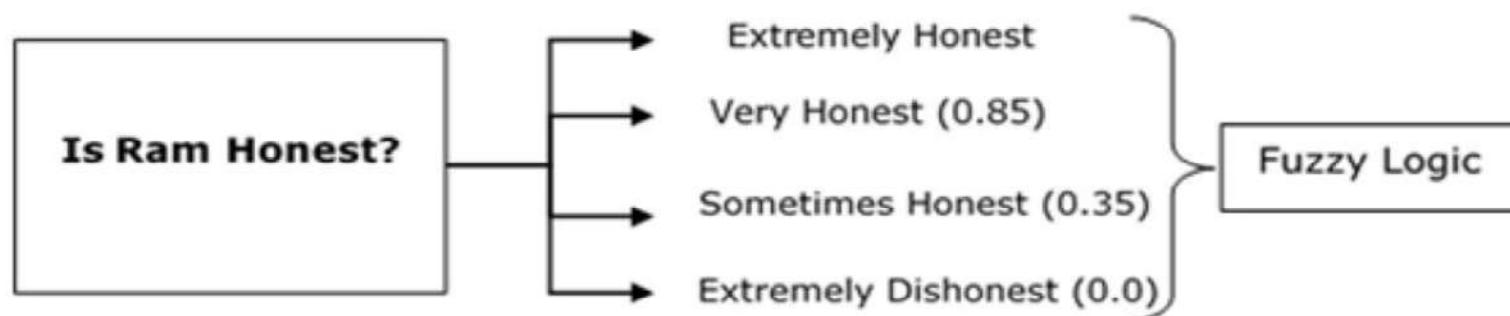
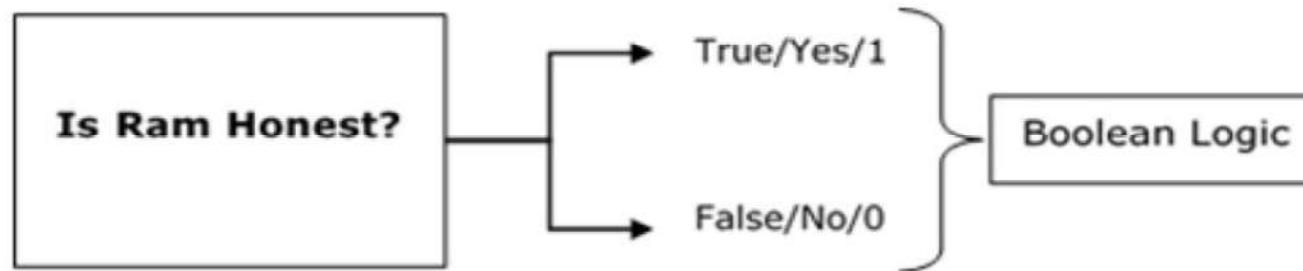
7.6 Fuzzy inference system

7.7 Fuzzy controller & applications



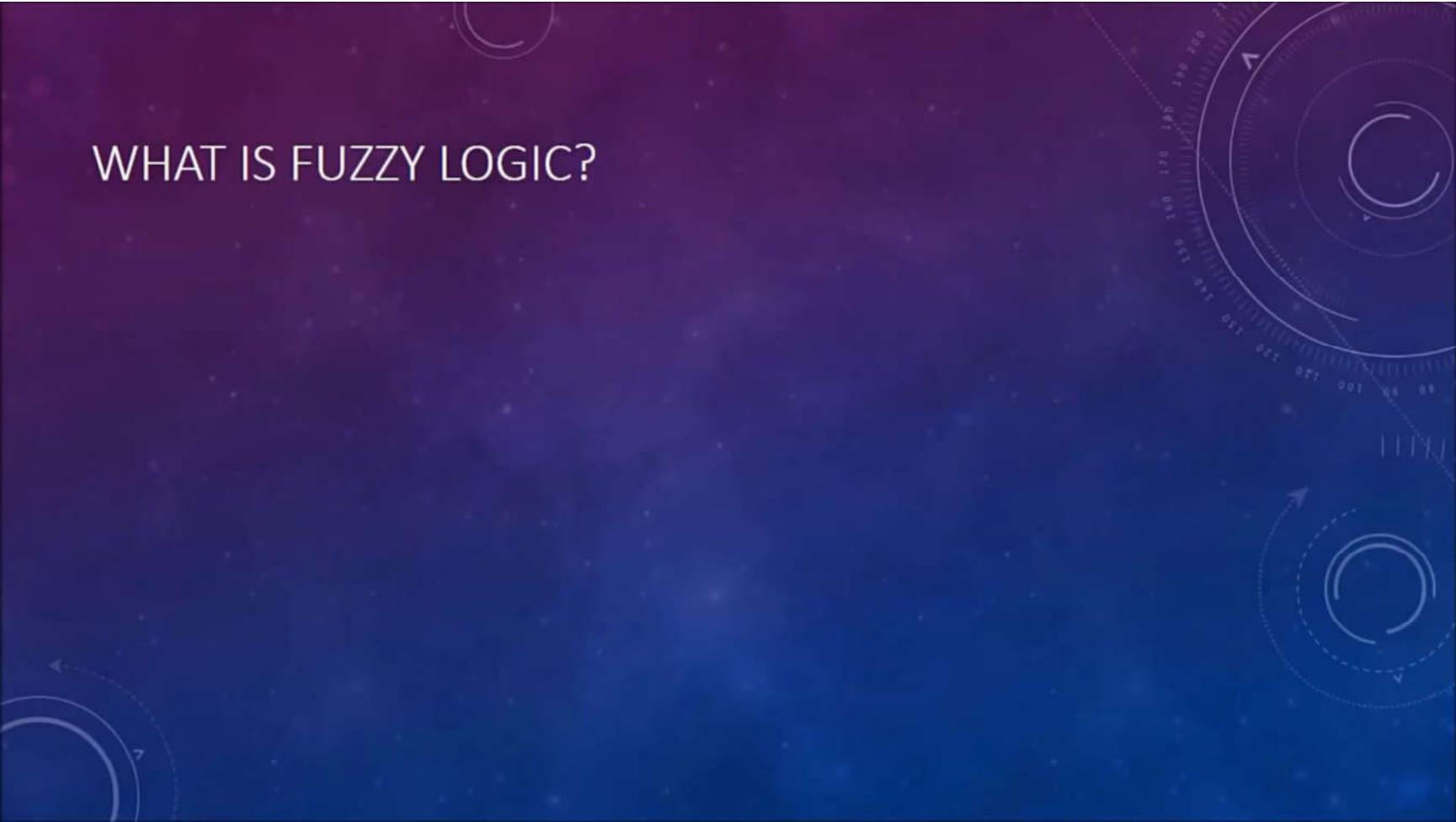
7.1 Introduction

- ❑ Fuzzy Logic was introduced by Professor Lofti A. Zadeh in 1965, i.e. his research paper “Fuzzy Sets”.
- ❑ Fuzzy Logic resembles the human decision-making methodology. It deals with vague and imprecise information.



7.1 Introduction

WHAT IS FUZZY LOGIC?

The background of the slide features a dark blue gradient with three concentric circular patterns. The innermost circle is light blue with a dashed outer edge. The middle circle is white with a solid black outer edge. The outermost circle is light blue with a dashed outer edge. There are also several small, thin-lined arrows pointing in various directions across the background.

7.2 Set Theory: Classic vs Fuzzy

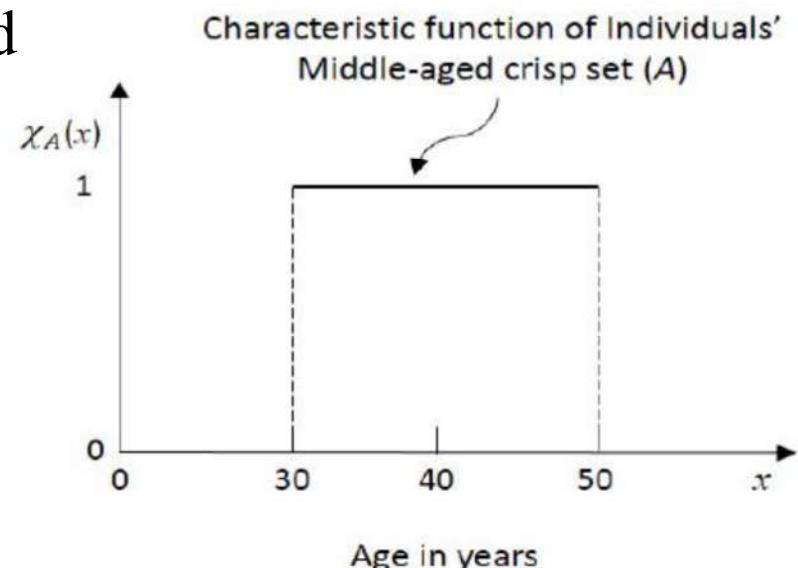
- A classic set is an unordered collection of different elements.
- It can be written explicitly by listing its elements using the set bracket.
- If the order of the elements is changed or any element of a set is repeated, it does not make any changes in the set.

Example: A set of individuals' middle aged

$$A = \{ x \mid 30 \leq x \leq 50 \}$$

Its full membership function is

$$\chi_A(x) = \begin{cases} 1, & \text{for } 30 \leq x \leq 50 \\ 0, & \text{for otherwise} \end{cases}$$



7.2 Set Theory: Classic vs Fuzzy

1. Mathematical Representation:

Roster or Tabular Form

- A classic set is represented by listing all the elements comprising it.
- The elements are enclosed within braces and separated by commas.
e.g. Set of odd numbers less than 10, $B=\{1,3,5,7,9\}$

Set Builder Notation

- The classic set is described as $A=\{x:p(x)\}$
e.g. The set $\{1,3,5,7,9\}$ is written as $A=\{x:1 \leq x < 10 \text{ and } (x \% 2) \neq 0\}$
- If an element x is a member of any classic set S , it is denoted by $x \in S$
- If an element y is not a member of classic set S , it is denoted by $y \notin S$.
e.g. If $S = \{1,1.2,1.7,2\}, 1 \in S, \text{ but } 1.5 \notin S$



7.2 Set Theory: Classic vs Fuzzy

2. Types of Classical Sets

- **Finite Set** contains a definite number of elements is called a finite set.
e.g. $S = \{x | x \in N \text{ and } 70 > x > 50\}$
- **Infinite Set** contains infinite number of elements is called an infinite set.
e.g. $S = \{x | x \in N \text{ and } x > 10\}$
- **Subset** - Y is a subset of set X if its elements are the elements of set X.
e.g. Let $Y = \{1, 2, 3, 4, 5, 6\}$ and $X = \{1, 2\}$. Hence, we can write $Y \subseteq X$.
- **Universal Set** is a collection of all elements in a particular context and represented as U. Example: if U is the set of all animals on earth, then a set of all fishes is a subset of U
- **Empty Set or Null Set** is finite set without elements, denoted by \emptyset .



7.2 Set Theory: Classic vs Fuzzy

Concept of Fuzzy Sets

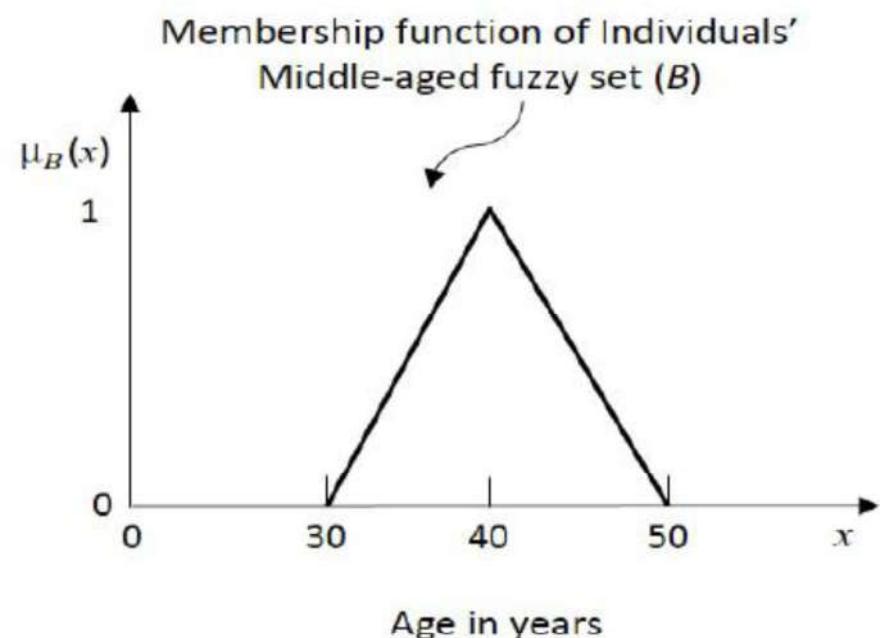
Fuzzy sets extend the concept of classical sets by providing a means of calculating intermediate values between absolute false and absolute true with values (0.0 ~ 1.0). Example: we can define the individuals' middle-aged set into a fuzzy set

$$B = \{ (x, \mu_B(x)) \mid 30 \leq x \leq 50 \}$$

Its graphical representation is shown →

Its membership degrees between 0 and 1 can be mathematically expressed by

$$\mu_B(x) : X \rightarrow [0, 1]$$



7.2 Set Theory: Classic vs Fuzzy

Basic Properties of Fuzzy Sets

Suppose B is a fuzzy set of elements, denoted by x , defined on the universe of discourse X , and represented by a membership function $\mu_B(x)$, then:

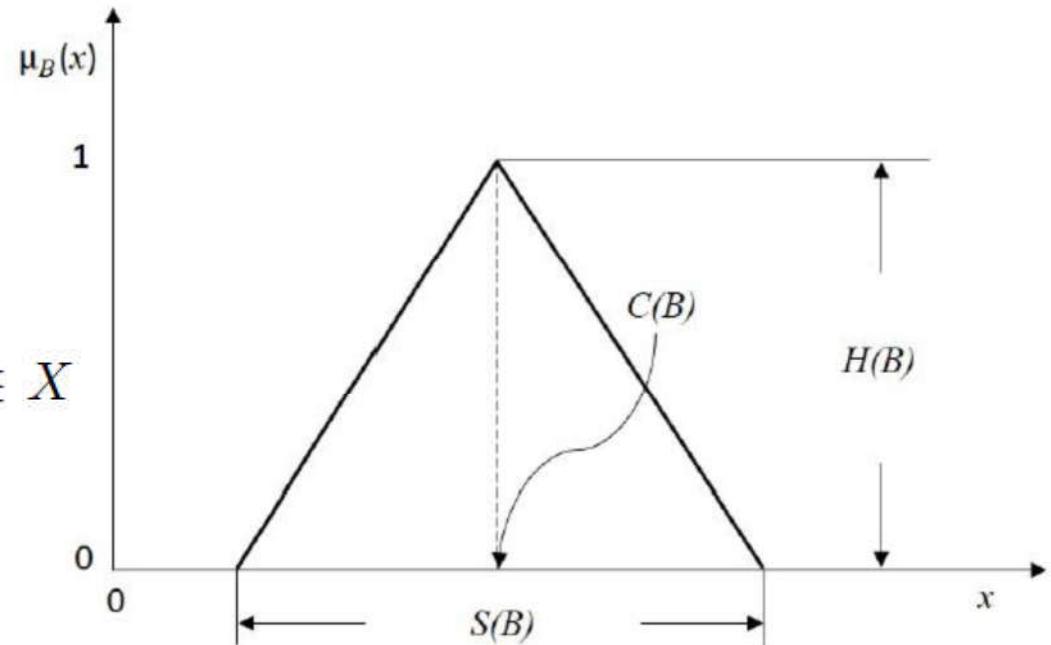
- 1) **Support of a Fuzzy Set:** $S(B)$ is the crisp set of all elements $x \in X$ such that $\mu_B(x) > 0$, and is written as

$$S(B) = \{ x \in X \mid \mu_B(x) > 0 \}$$

- 2) **Core of a Fuzzy Set:** $C(B)$

It is the crisp set of all elements $x \in X$ such that $\mu_B(x) = 1$, and is written as

$$C(B) = \{ x \in X \mid \mu_B(x) = 1 \}$$



7.2 Set Theory: Classic vs Fuzzy

- 3) Height of a Fuzzy Set: $H(B)$ is the largest membership degree corresponding to any element in the set, and is written as

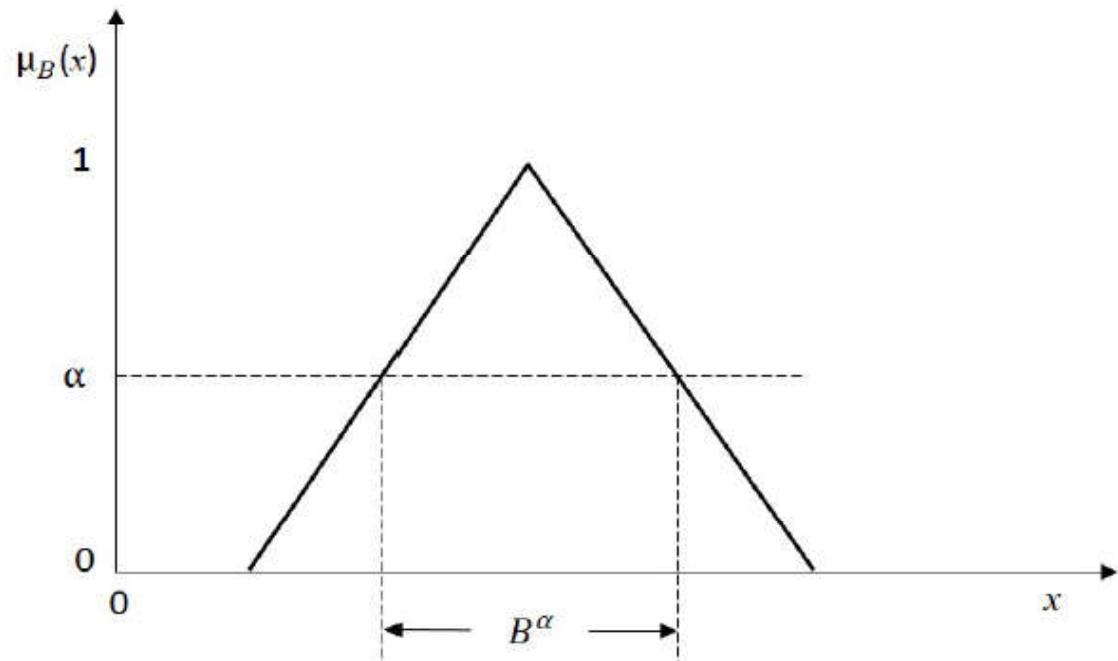
$$H(B) = \sup_{x \in X} \mu_B(x)$$

- 4) Normal & subnormal Fuzzy Set: A fuzzy set is called normal when $H(B)=1$, and subnormal when $H(B)<1$.

- 5) α -cut of a Fuzzy Set: It is denoted by

$$B^\alpha = \{ x \in X \mid \mu_B(x) \geq \alpha \}$$

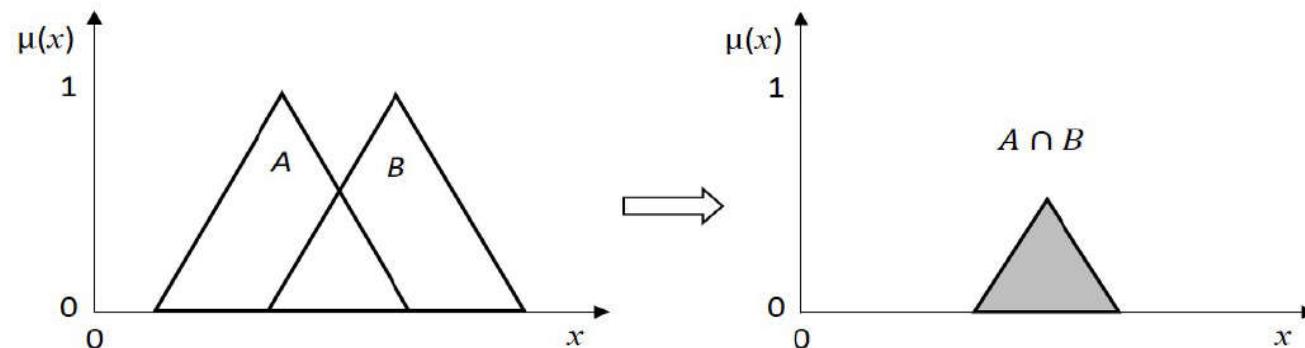
It can be graphically described at right →



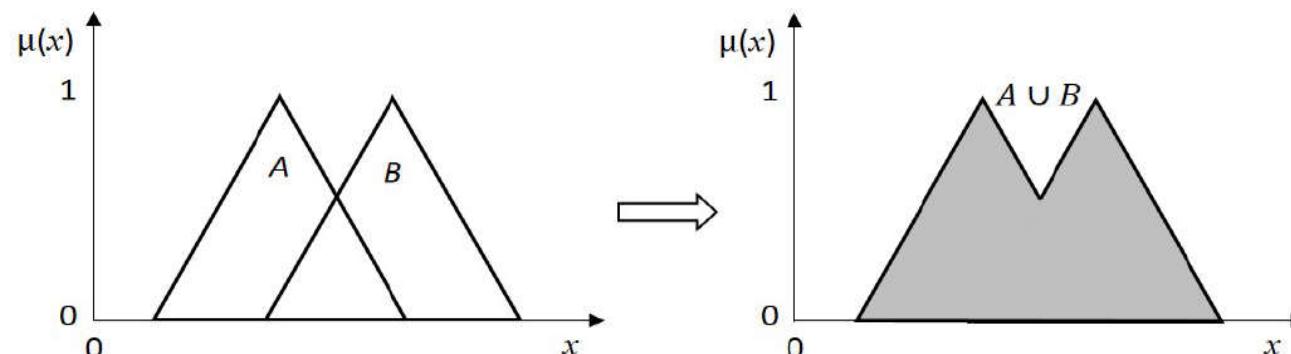
7.2 Set Theory: Classic vs Fuzzy

Basic Operations on Fuzzy Sets

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



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

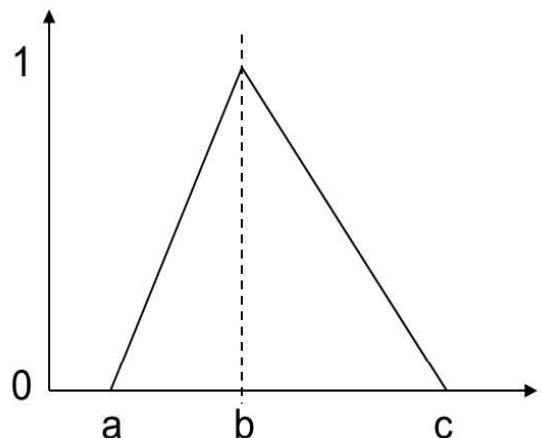


7.3 Fuzzy Membership Functions

- The membership function is an important part of a fuzzy system that needs to be carefully defined.
- It maps values of input variables on a given universe of discourse into real numbers in a range of values [0,1] and can either be symmetrical or asymmetrical.
- The most common types of membership functions used in fuzzy applications are
 - 1) Triangular – It can be expressed mathematically using 3 parameters.
 - 2) Trapezoidal – It can be expressed mathematically using 4 parameters.
 - 3) Gaussian – It can be expressed mathematically using 2 parameters.

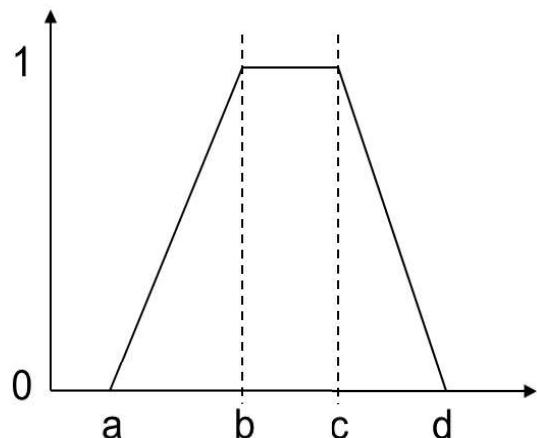


7.3 Fuzzy Membership Functions



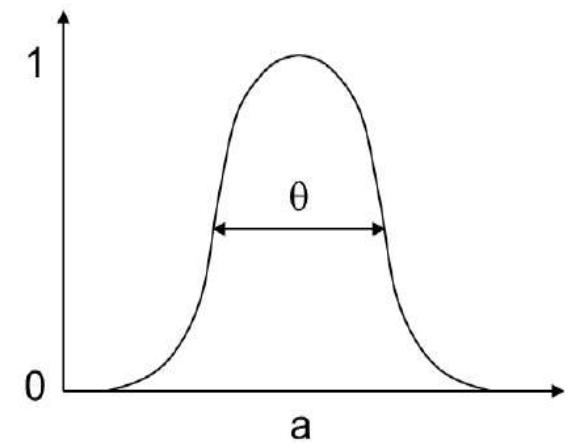
Triangle

$$\begin{aligned} & (x-a)/(b-a) \text{ for } a \leq x \leq b \\ & (c-x)/(c-b) \text{ for } b \leq x \leq c \\ & 0 \quad \text{Otherwise} \end{aligned}$$



Trapezoid

$$\begin{aligned} & (x-a)/(b-a) \text{ for } a \leq x \leq b \\ & 1 \quad \text{for } b \leq x \leq c \\ & (d-x)/(d-c) \text{ for } c \leq x \leq d \\ & 0 \quad \text{Otherwise} \end{aligned}$$



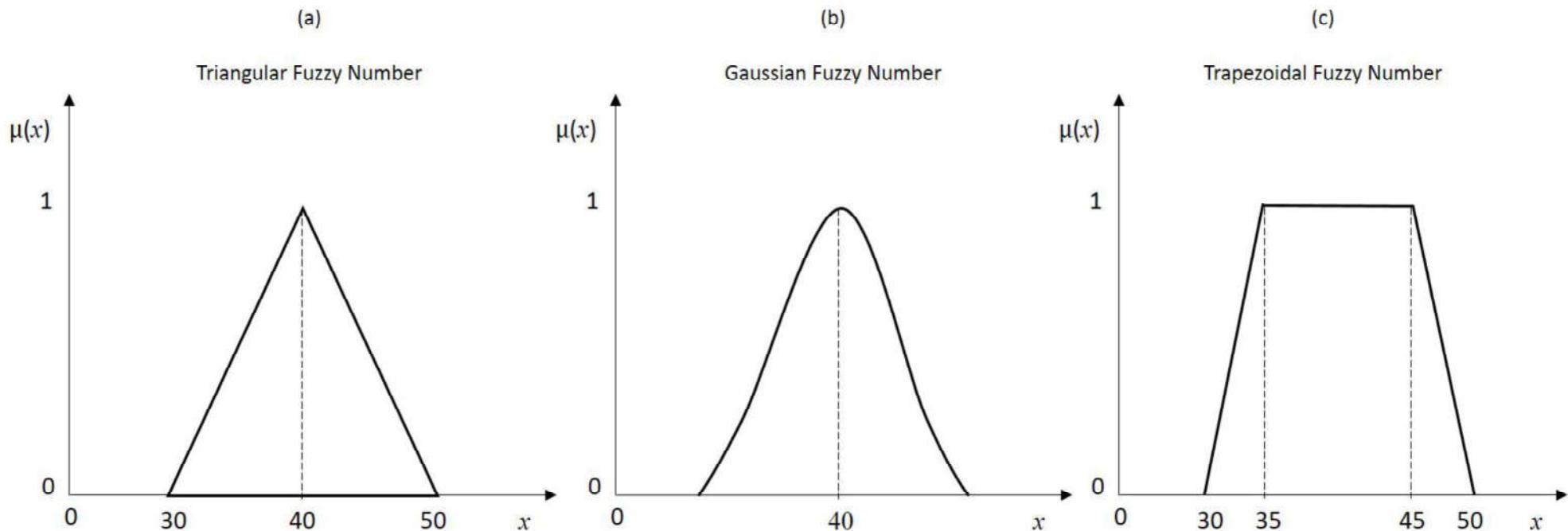
Gaussian

$$e^{-0.5((x-a)/\theta)^2}$$



7.3 Fuzzy Membership Functions

- The figure below shows an example of a Fuzzy number or a fuzzy interval for individuals' middle-aged



7.3 Fuzzy Membership Functions

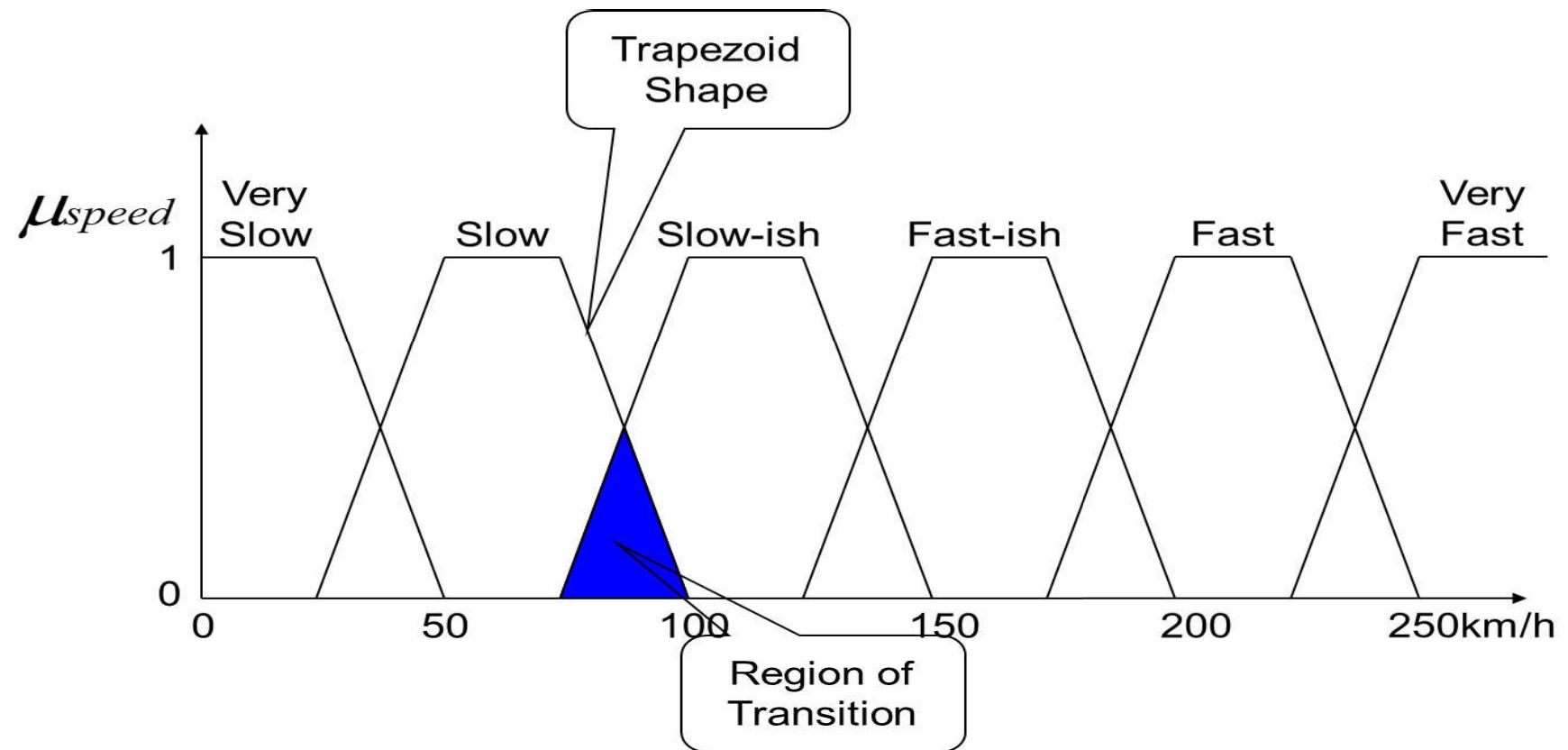
Determine Fuzzy Membership Function Process

- The 1st step in the fuzzy logic control process is to determine input - output membership functions.
- A fuzzy algorithm categorizes the information and assigns values that represent the degree of membership within those categories.
- Input membership functions can take any form, which should ensure:
 - the shapes could accurately represent the distribution of data within the system
 - A region of transition exists between adjacent membership functions



7.3 Fuzzy Membership Functions

Example: Input Fuzzy Membership Function



7.3 Fuzzy Membership Functions

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Fuzzy Logic - Degree of Membership (DOM) - Crisp Input - Crisp Output
Input Sets - Output Sets

Many versions of Fuzzy Logic exist.

This is only one.



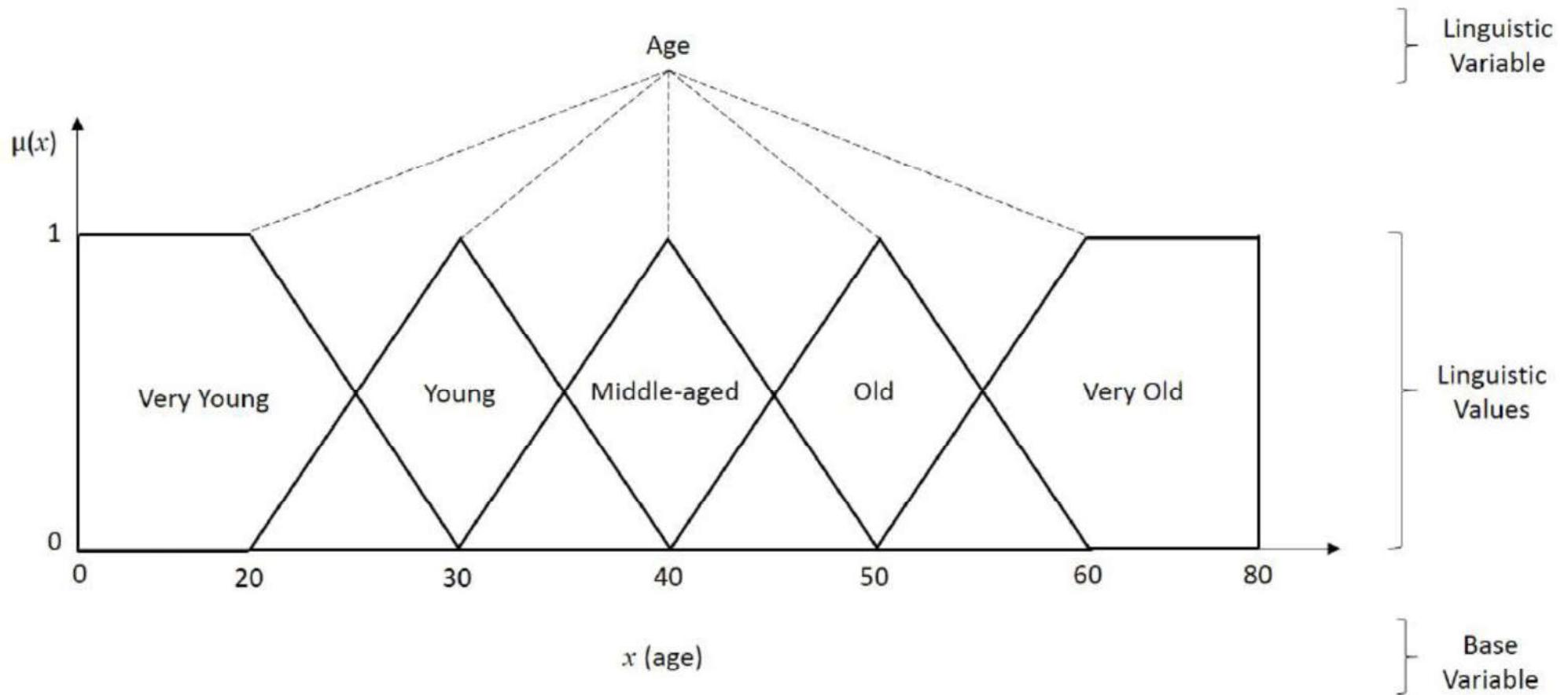
7.4 Linguistic Variables

- The linguistic variables are inexact/uncertain variables to describe the behaviour of complex systems in terms of propositions used by humans.
- These propositions (phrases) are expressed in natural language to be converted into fuzzy sets or fuzzy numbers for fuzzy operations.
- Example 1: a linguistic variable might be **Age**, which is shown in the next page. The linguistic variable, Age, is defined as a base variable on a specified universe of real numbers.
- It is expressed as 5 linguistic values (also called linguistic terms or linguistic labels), ***Very Young, Young, Middle-aged, Old and Very Old.*** These linguistic values are represented by specific fuzzy numbers defined on the base variable universe.



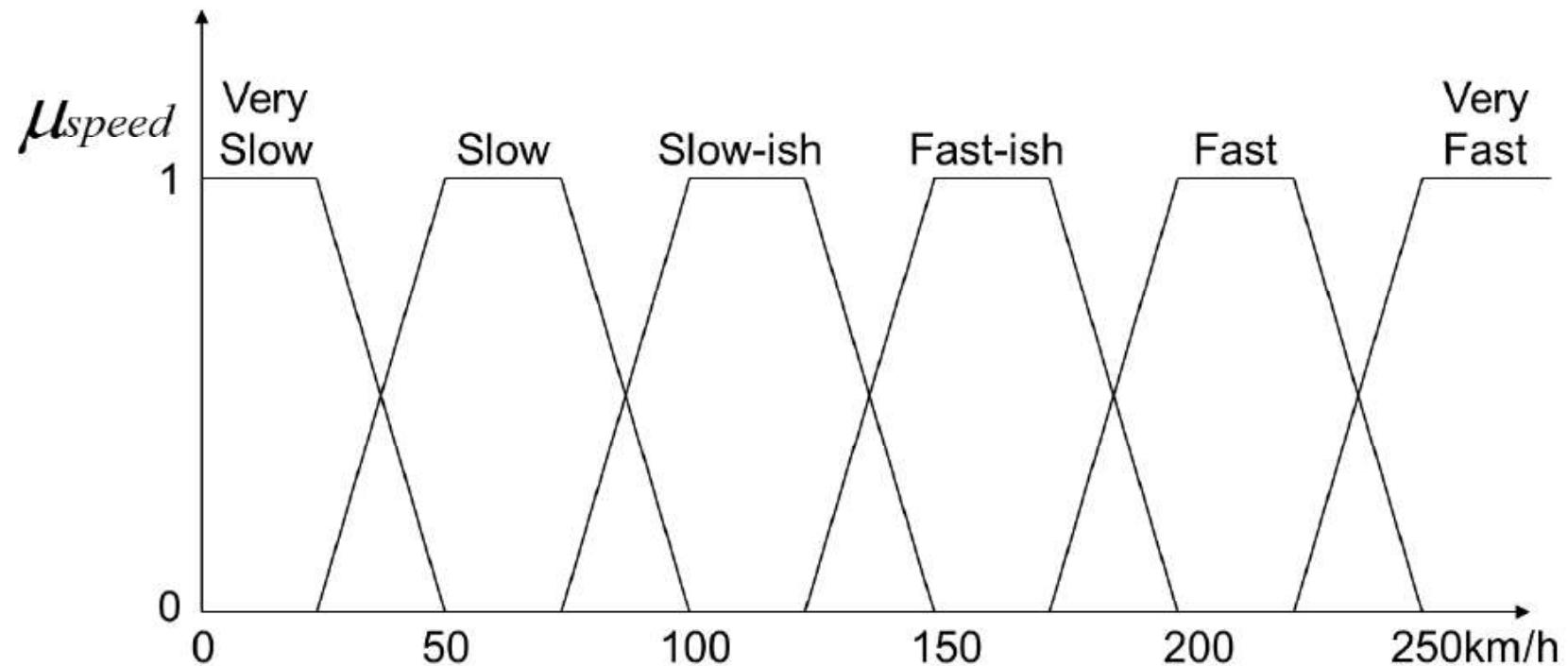
7.4 Linguistic Variables

Linguistic Variables Example 1: Age



7.4 Linguistic Variables

Linguistic Variables Example 2: Speed



7.5 Fuzzification and Defuzzification

1. Fuzzification process

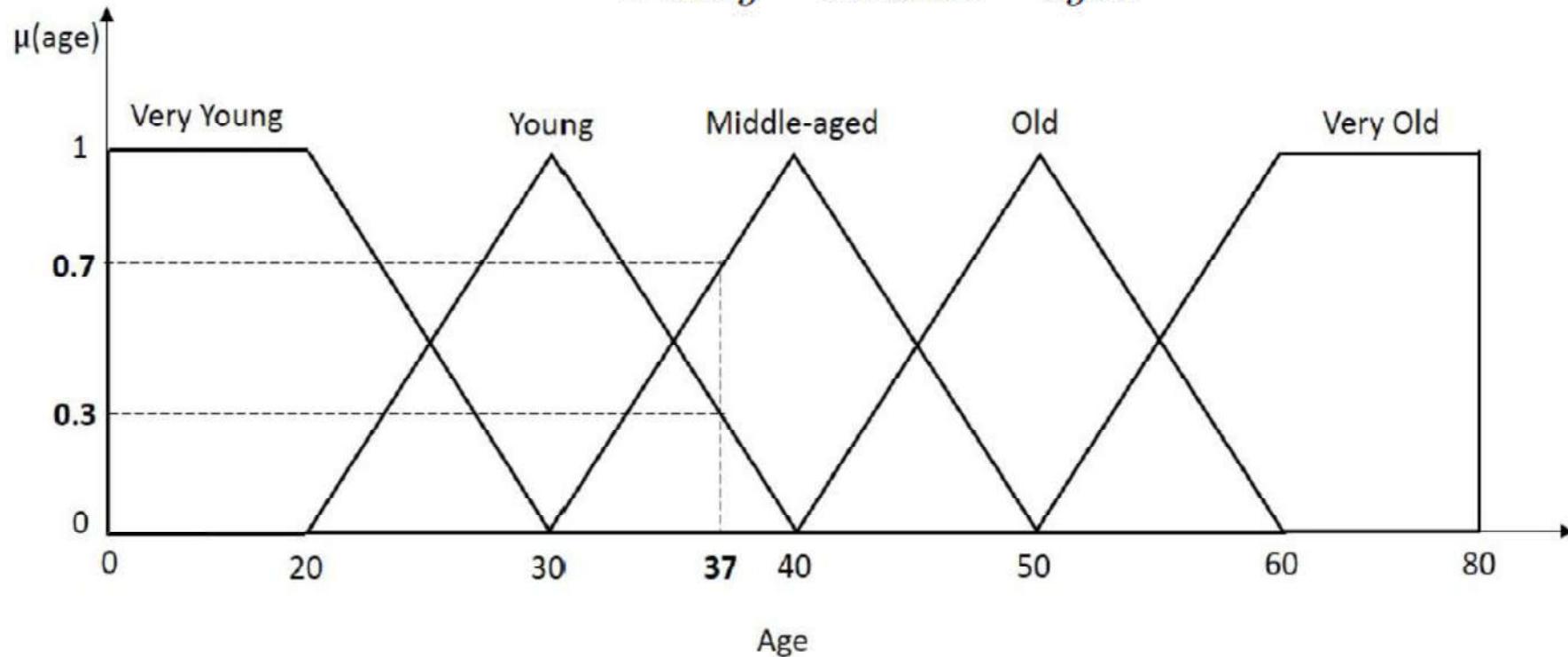
- ❑ This is a process of converting the input variables into a fuzzy format in order to handle the necessary uncertainty.
- ❑ That is to determine a fuzzy set representing all membership degrees of the linguistic values corresponding to the input variable data.
- ❑ When the input to the fuzzification process is a crisp value, the obtained membership degrees 0.3 and 0.7 are associated with the linguistic values “Young” and “Middle-aged”, respectively,
- ❑ When the input to the fuzzification process is a fuzzy value, you might obtain many membership values of the linguistic values. In this case, the greater membership is selected to represent their linguistic value.



7.5 Fuzzification and Defuzzification

- ❑ Fuzzification operation 1: the input value is a crisp number.

$$Age_{(37)} = \left\{ \frac{0.3}{Young}, \frac{0.7}{Middle-aged} \right\}$$

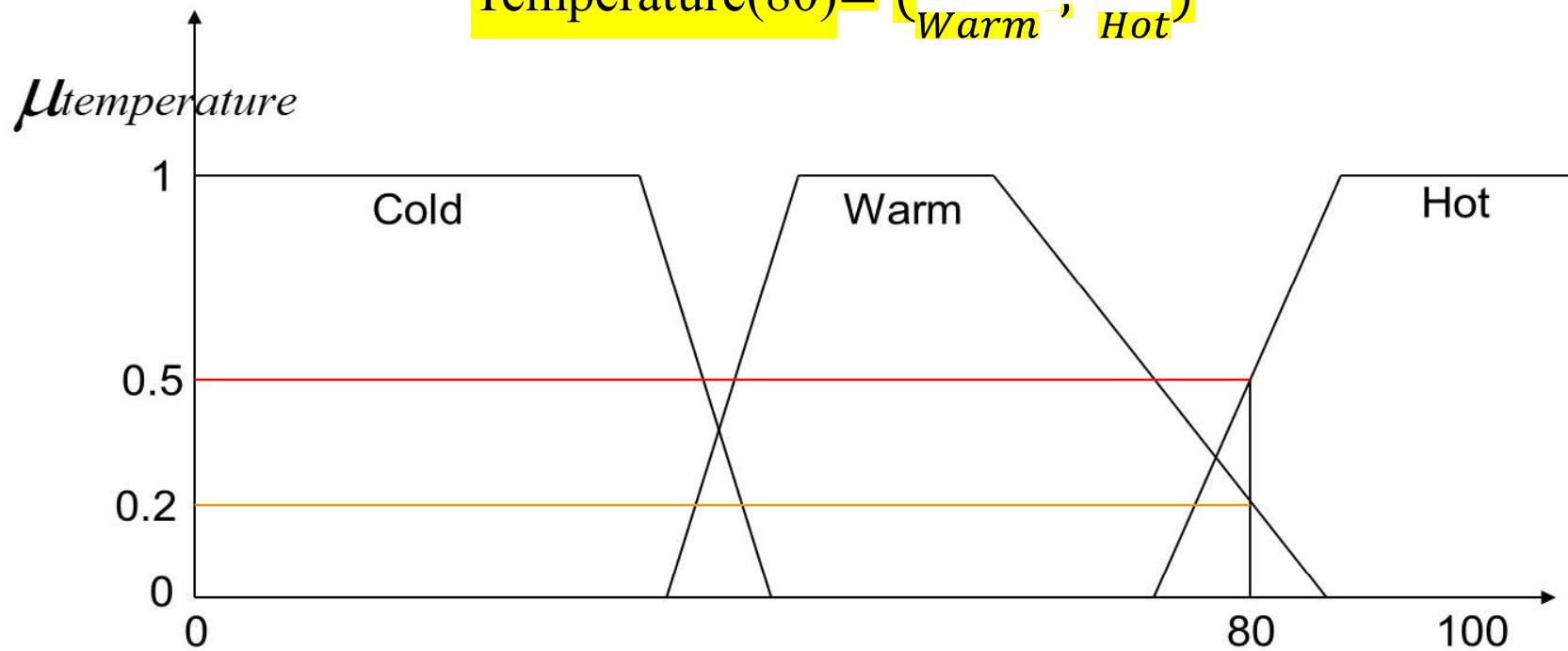


7.5 Fuzzification and Defuzzification

Another example: Fuzzification Operation 1

The input is a crisp temperature, 80. It covers Warm MF at 0.2 and Hot MF at 0.7.

$$\text{Temperature}(80) = \left(\frac{0.2}{\text{Warm}}, \frac{0.5}{\text{Hot}} \right)$$

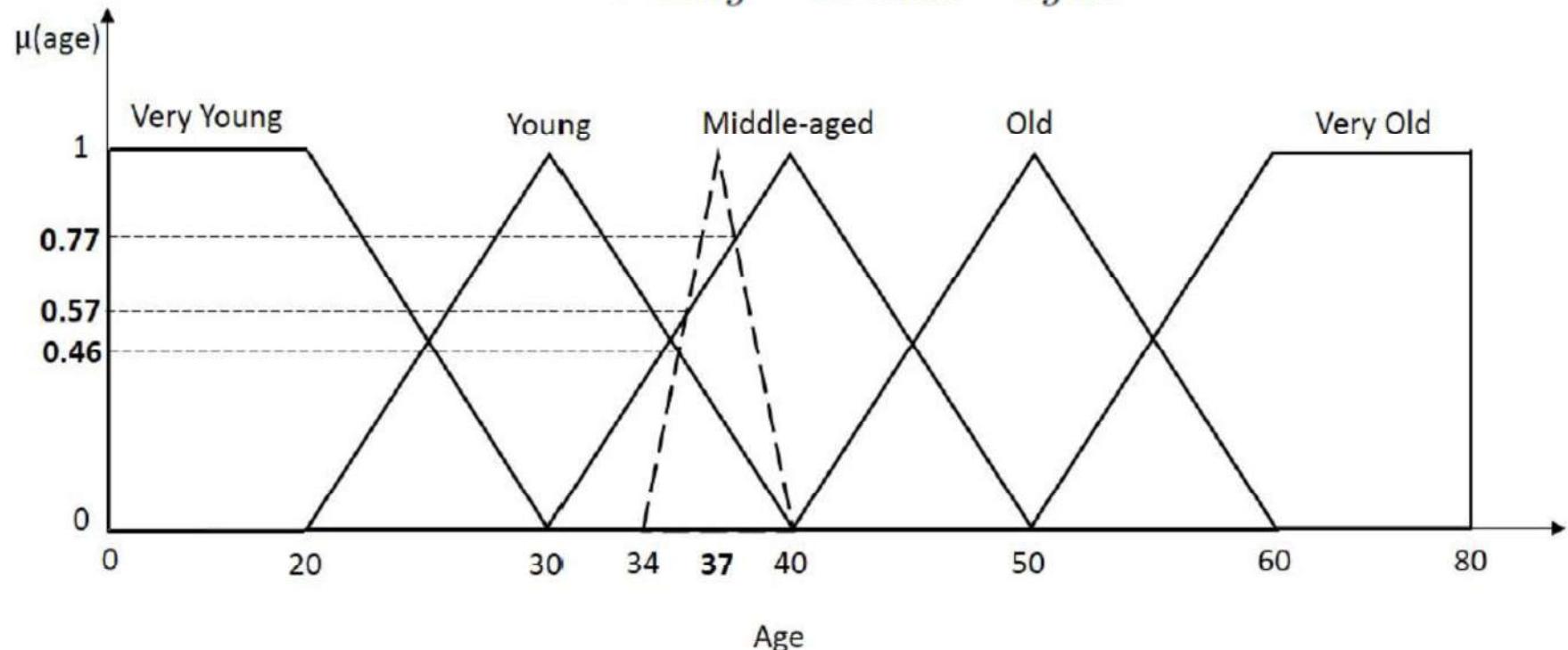


7.5 Fuzzification and Defuzzification

- Fuzzification operation 2: the input value is a fuzzy number.

$$Age_{(34,37,40)} = \left\{ \frac{0.46}{Young}, \frac{0.77}{Middle-aged} \right\}$$

Note: $0.77 > 0.57$



7.5 Fuzzification and Defuzzification

2. Defuzzification process

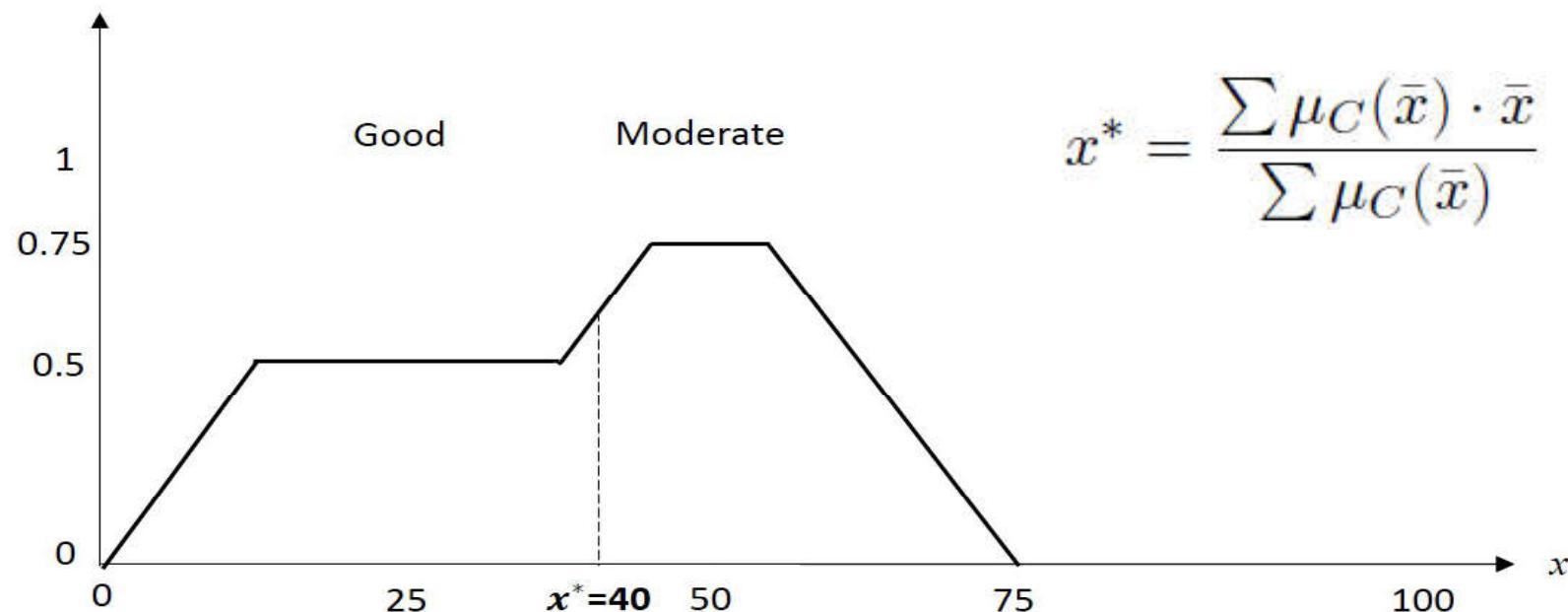
- ❑ It is a process of converting fuzzy output value into a single crisp value needed in many real-world applications.
- ❑ The commonly used methods are:
 - Weighted Average method
 - Centroid method
 - Mean-Max method
- ❑ Note that defuzzification is **an art** rather than a **science!** (as there is no systematic procedure existed.)



7.5 Fuzzification and Defuzzification

Weighted Average Method

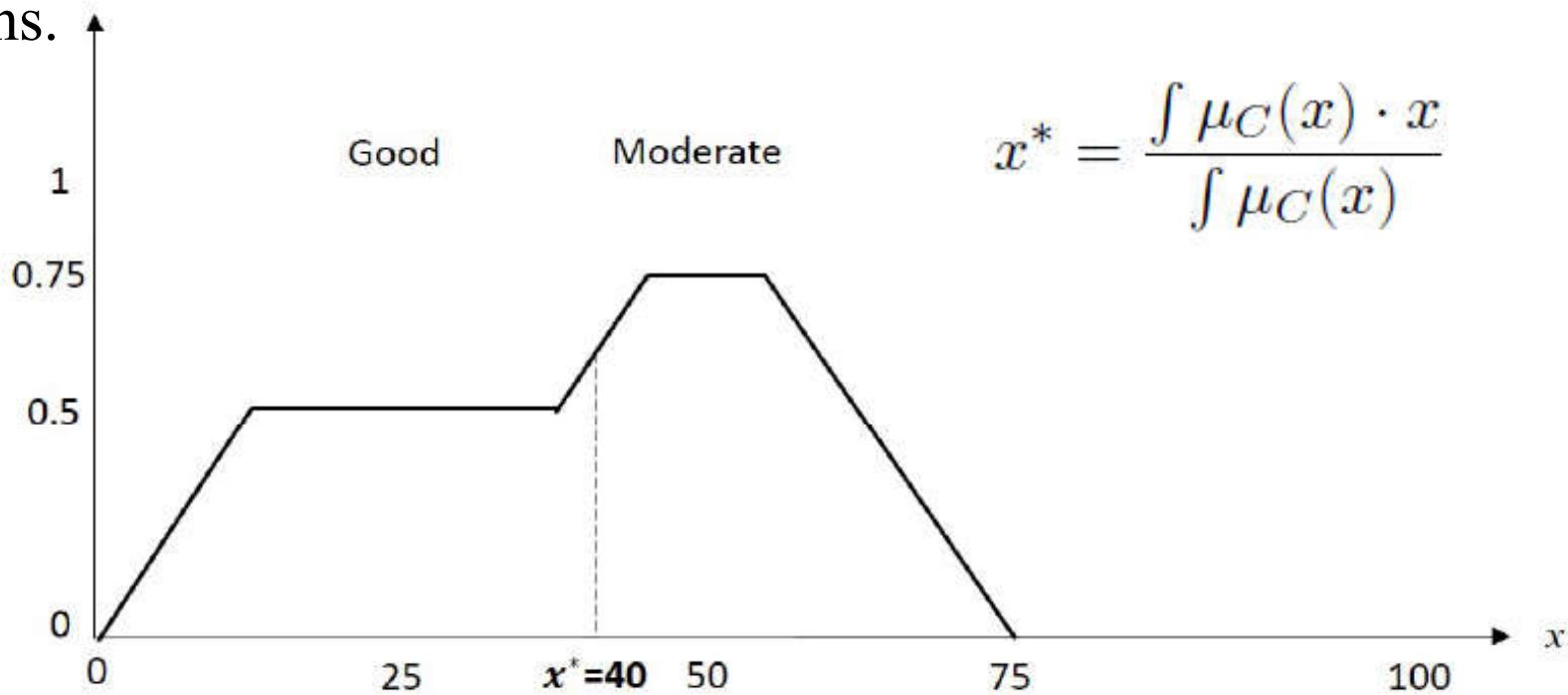
- It is commonly used because of its simple computational procedure.
- Its results lie approximately in the middle of the fuzzy support.
- It is suitable to the output fuzzy set with one type membership functions.



7.5 Fuzzification and Defuzzification

Centre of Gravity

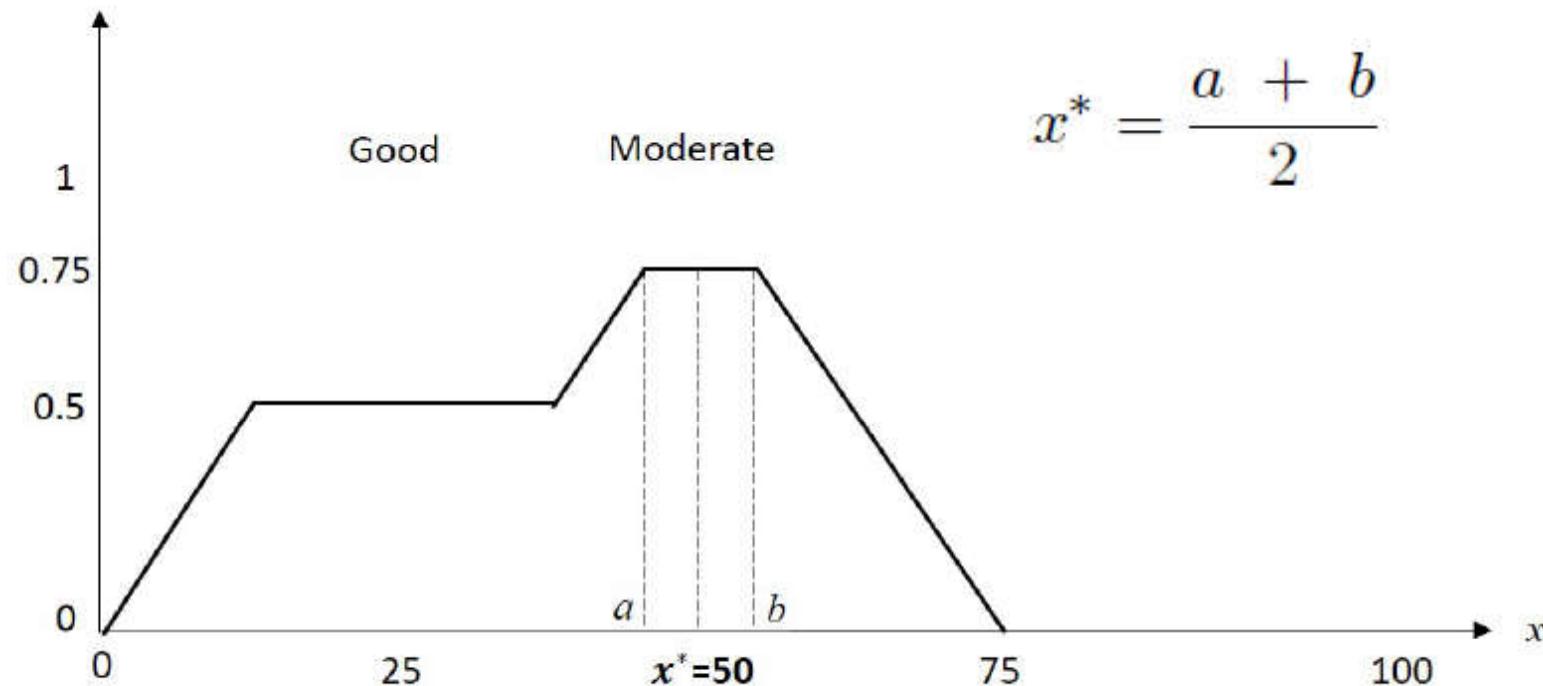
- ❑ Its computation is more complex than the weighted average method.
- ❑ It is suitable to the output fuzzy set with different types of membership functions.



7.5 Fuzzification and Defuzzification

Mean-Max method

- It obtains the mean value of the min-max values related to the maximum membership grade.
- It is also called the max membership or height method.



7.5 Fuzzification and Defuzzification

- For triangular membership functions the ‘cut off’ area is given by

$$w \left(h - \frac{h^2}{2} \right)$$

where w is the triangle base width; h is the height at which the function is cut off.

- For trapezoid membership functions the ‘cut off’ area is given by

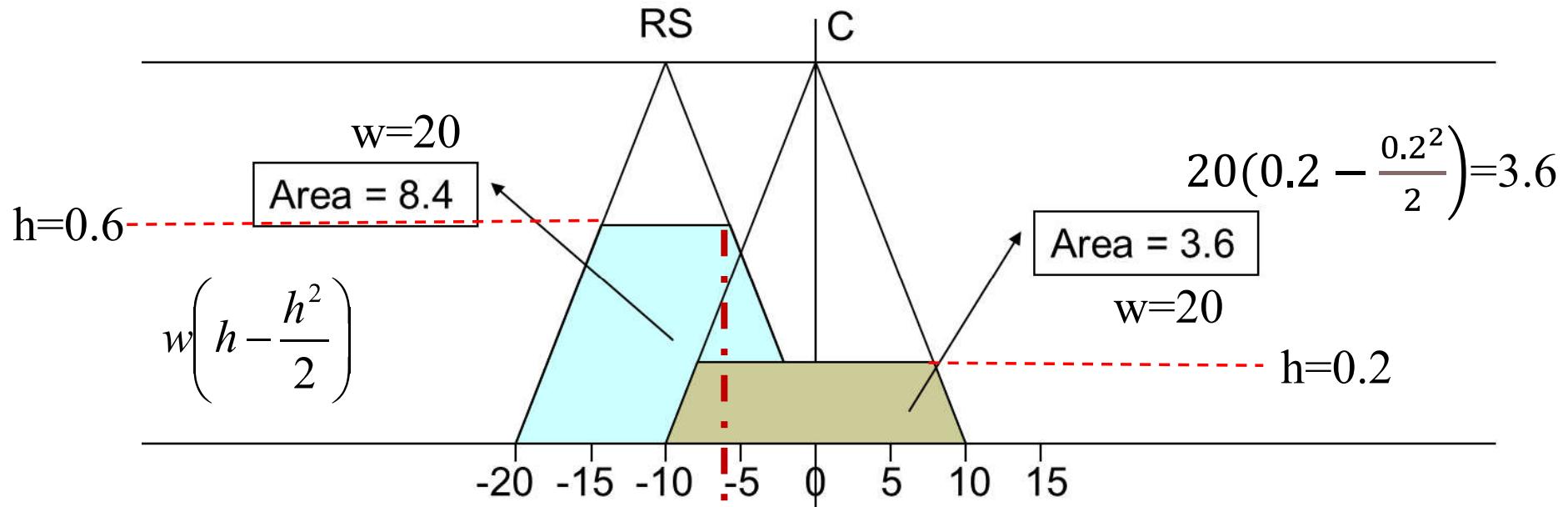
$$h((2w_1 + hw_2 - hw_1)/2)$$

where w_1 is the trapezoid base width; w_2 is the trapezoid top width; h is the height at which the function is cut off.



7.5 Fuzzification and Defuzzification

□ Suppose: the membership of C is 0.2 and the membership of RS is 0.6.



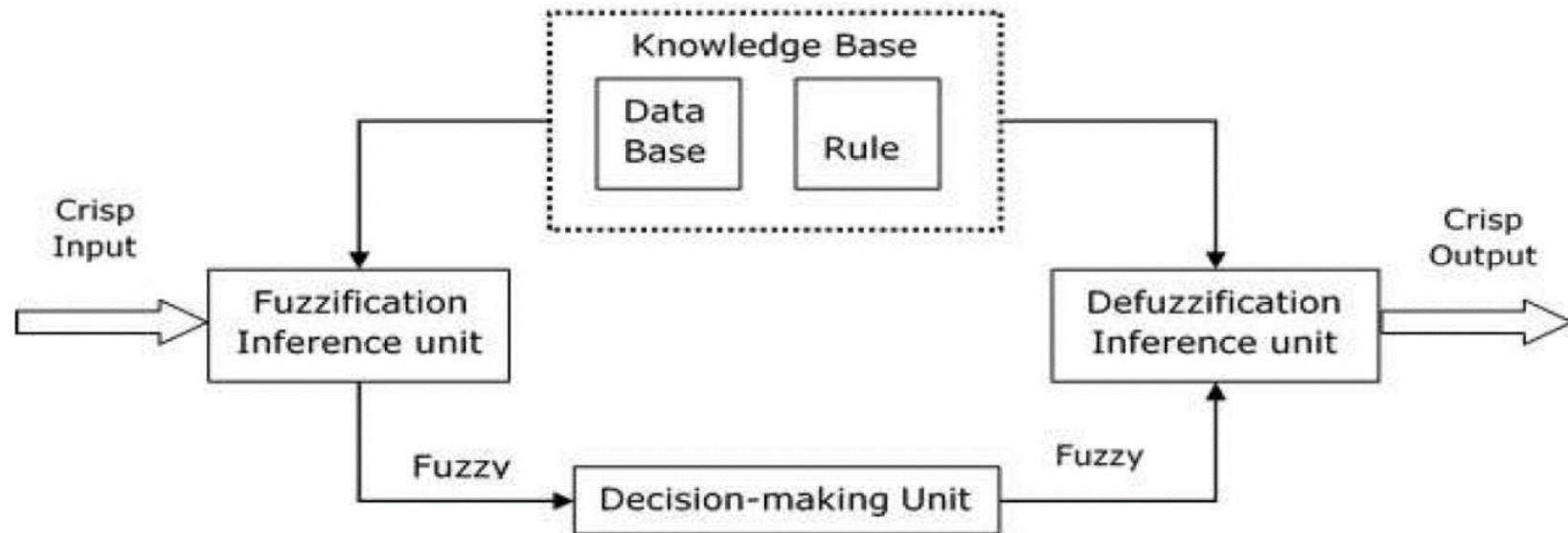
If the input to C is 0 and the input to RS is -10 then we can use “Centre of Gravity” to obtain the crisp output value.

$$u = \frac{\sum_i b_i \int \mu_i}{\sum_i \int \mu_i} = \frac{(-10) * 8.4 + 0 * 3.6}{8.4 + 3.6} = -7$$



7.6 Fuzzy Inference System

A Fuzzy inference system has four function blocks:



- 1) ***Fuzzification Interface Unit*** converts the crisp quantities into fuzzy quantities.
- 2) ***Knowledge Base*** contains data base and fuzzy IF-THEN rules.
- 3) ***Decision-making Unit*** performs operation on rules.
- 4) ***Defuzzification Interface Unit*** converts the fuzzy quantities into crisp quantities.



7.6 Fuzzy Inference System

1. Mamdani Fuzzy Inference System

- It was proposed in 1975 by Prof. Mamdani (Queen Mary, London)
- It was used to control a combined system of a steam engine and a boiler.

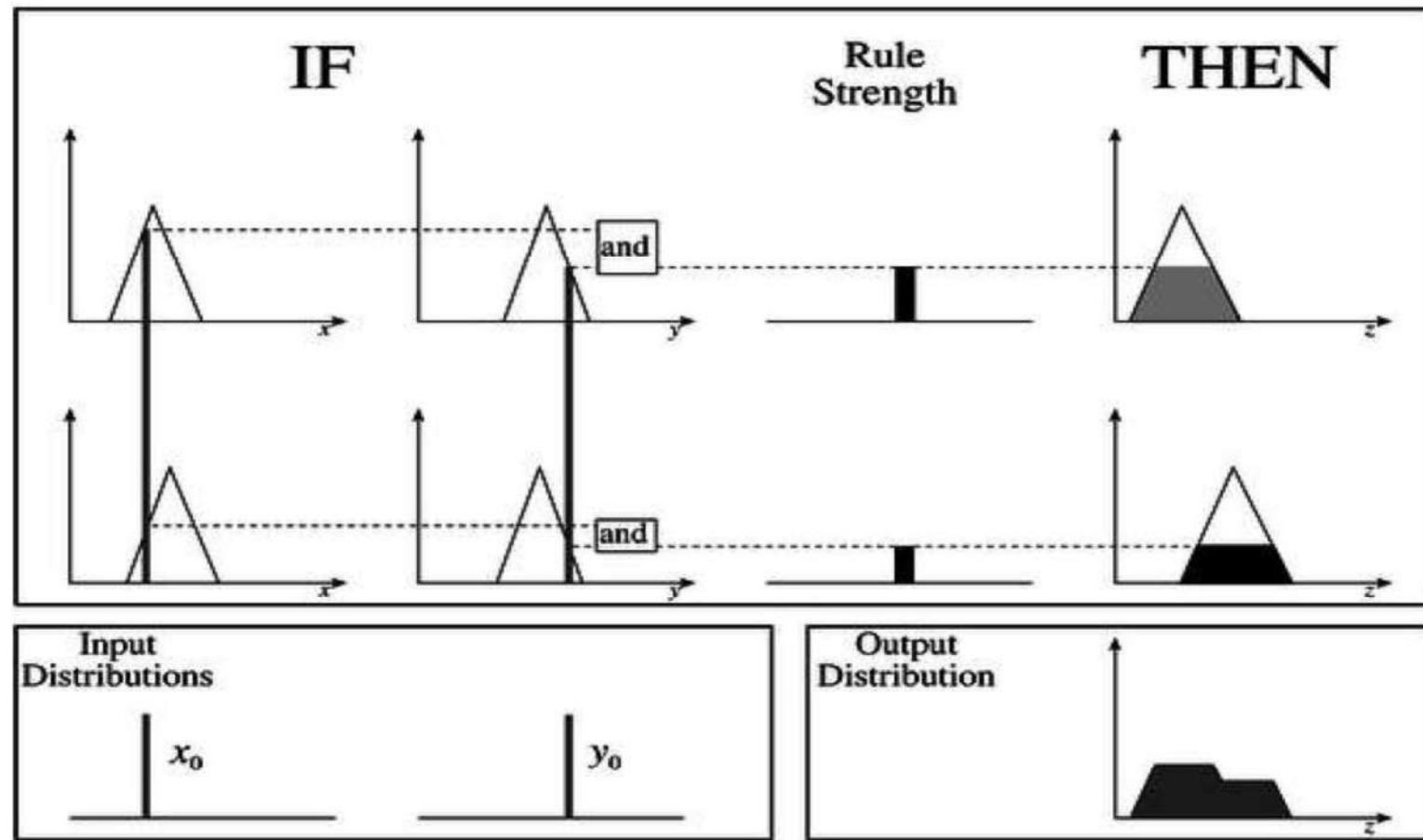
Steps for Computing the Output of a Mamdani FIS

- **Step 1** – The fuzzification of the input variables.
- **Step 2** – Rule evaluation.
- **Step 3** – The aggregation of the rule outputs.
- **Step 4** – Finally, defuzzification.



7.6 Fuzzy Inference System

The block diagram of M-Fuzzy Interface System is shown below.



7.6 Fuzzy Inference System

2. TS Fuzzy Inference System

It was proposed by Takagi Sugeno & Kang in 1985 with the following format:

$$\text{IF } x \text{ is } A \text{ and } y \text{ is } B \text{ THEN } Z = f(x, y)$$

where A and B are fuzzy sets in antecedents and

$z = f(x, y)$ is a crisp function in the consequent.

TS Fuzzy Inference Process

- ***Step 1: Fuzzifying the inputs*** – Here, the inputs of the system are made fuzzy.
- ***Step 2: Applying the fuzzy operator*** – In this step, the fuzzy operators must be applied to get the output.



7.6 Fuzzy Inference System

Comparison between Mamdani FIS and TS FIS

□ *Output Membership Function*

- M-FIS has linear output membership function.
- TS-FIS has either linear or constant output membership functions.

□ *Aggregation and Defuzzification Procedure*

- They have different aggregation and defuzzification procedures due to their consequences of fuzzy rules.

□ *Mathematical Rules*

- TS-FIS has more mathematical rules than M-FIS.

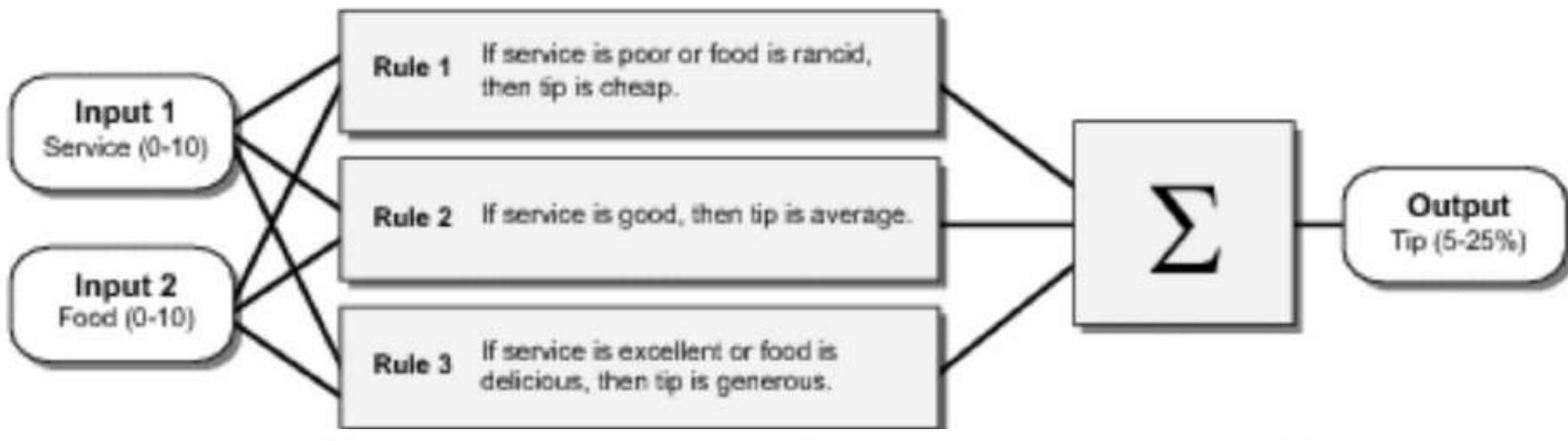
□ *Adjustable Parameters*

- TS-FIS controller has more adjustable parameters than M-FIS controller.



7.6 Fuzzy Inference System

Dinner for Two
a 2 input, 1 output, 3 rule system



The inputs are crisp (non-fuzzy) numbers limited to a specific range.

All rules are evaluated in parallel using fuzzy reasoning.

The results of the rules are combined and distilled (defuzzified).

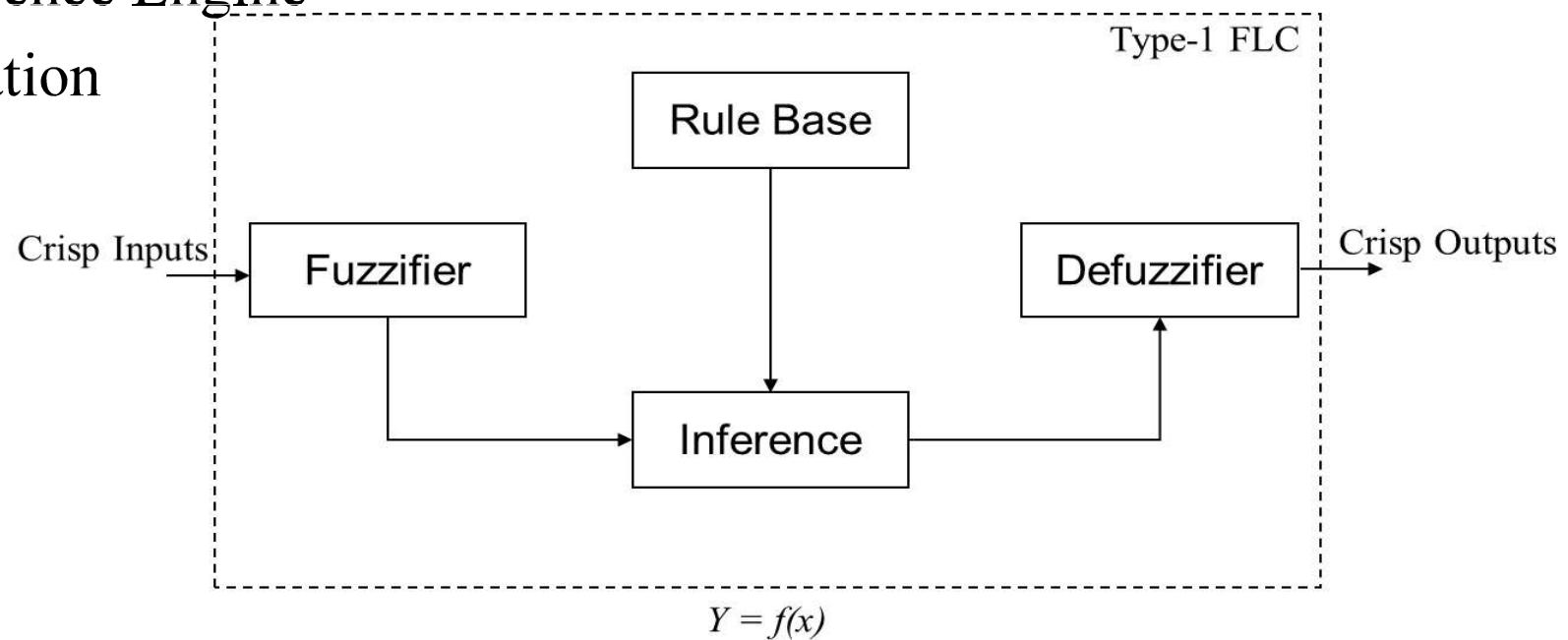
The result is a crisp (non-fuzzy) number.



7.7 Fuzzy Controller and Applications

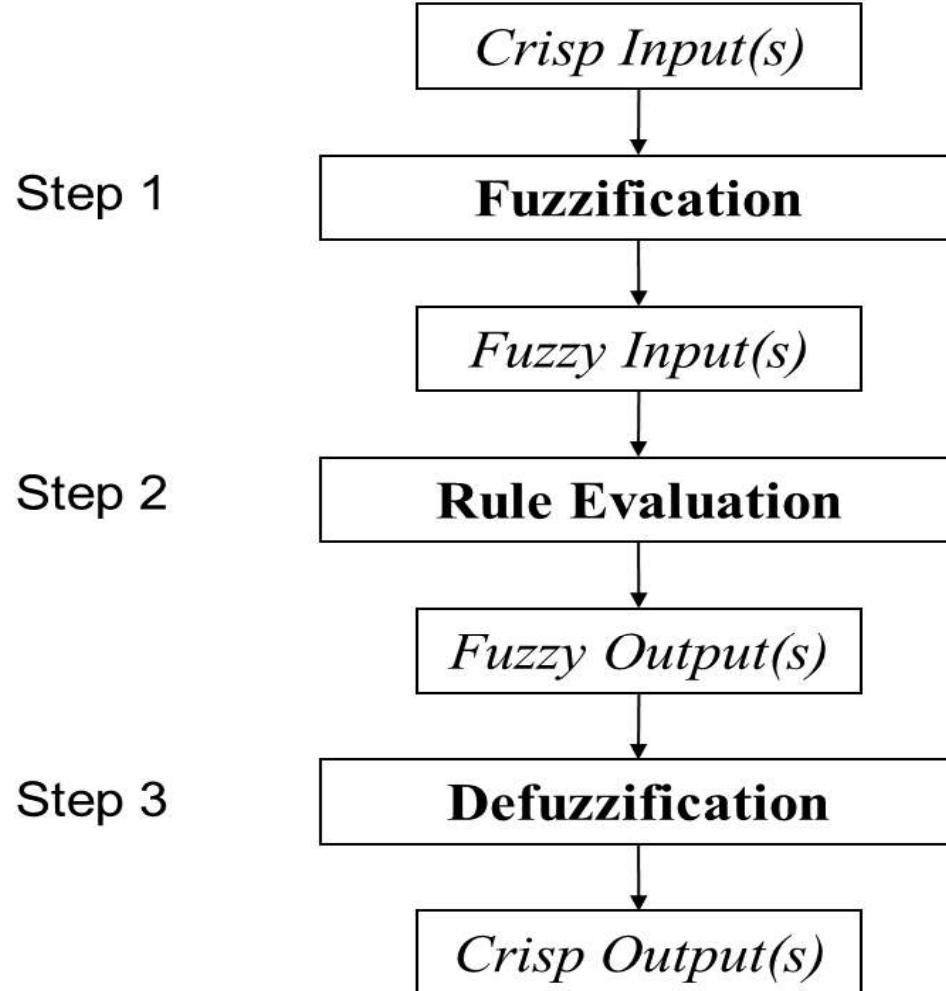
A fuzzy logic control system usually consists of four major parts:

- Fuzzification Interface
- Fuzzy Rule Base
- Fuzzy Inference Engine
- Defuzzification



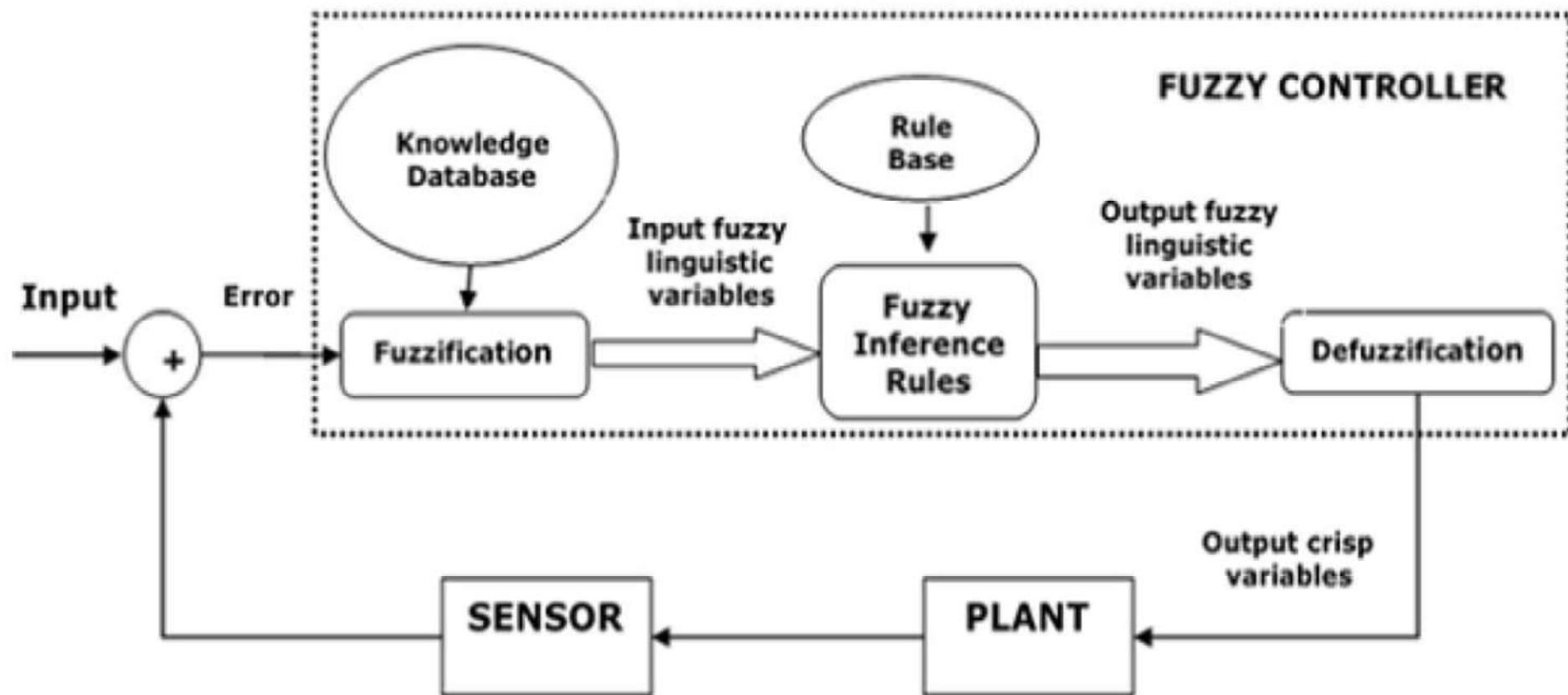
7.7 Fuzzy Controller and Applications

The steps for building a fuzzy logic controller



7.7 Fuzzy Controller and Applications

The structure of a fuzzy control system



7.7 Fuzzy Controller and Applications

The major components of the FLC as shown in the previous figure:

- **Fuzzifier** – The role of fuzzifier is to convert the crisp input values into fuzzy values.
- **Fuzzy Knowledge Base** – It stores the knowledge about all the input-output fuzzy relationships. It also has the membership function which defines the input variables to the the fuzzy rule base and the output variables to the plant under control.
- **Fuzzy Rule Base** – It stores the knowledge about the operation of the process of domain.
- **Inference Engine** – It acts as a kernel of any FLC. Basically it simulates human decisions decisions by performing approximate reasoning.
- **Defuzzifier** – It is to convert the fuzzy values into crisp values getting from fuzzy inference engine.



7.7 Fuzzy Controller and Applications

Fuzzy logic has been widely used in

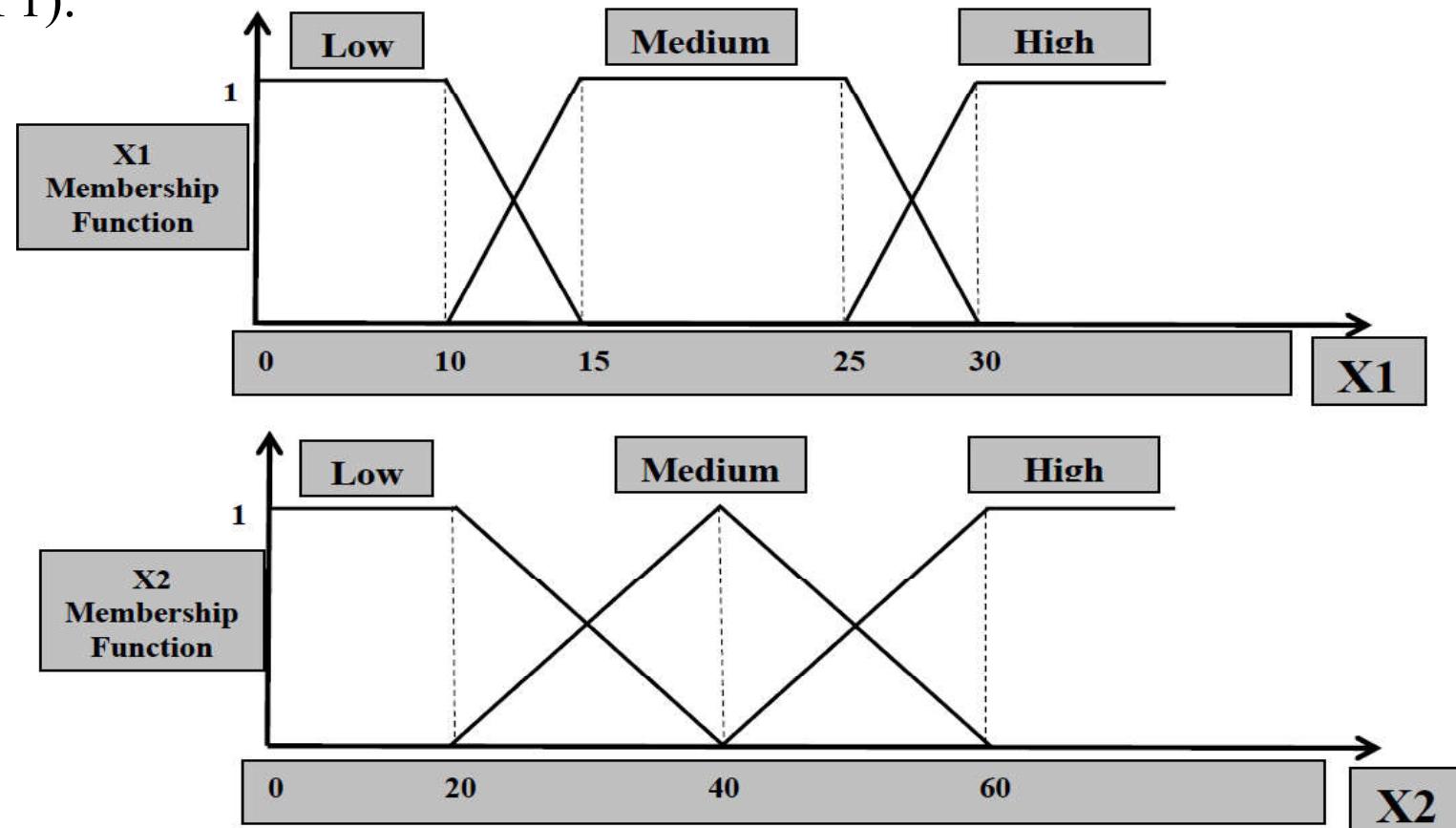
- **Aero Space:** Altitude control of spacecraft, Satellite altitude control, etc.
- **Automobile:** Fuzzy systems for idle speed control, Intelligent highway systems, Traffic control, etc.
- **Defence:** Underwater target recognition, Automatic target recognition of thermal infrared images, Naval decision support aids, Control of a hypervelocity interceptor
- **Industry:** Water purification plant control, Quantitative pattern analysis, etc.
- **Medical:** Medical diagnostic support system, Radiology diagnoses, etc.
- **Electronics:** Air conditioning systems, Washing machine timing, Microwave ovens, Vacuum cleaners, etc.



7.7 Fuzzy Controller and Applications

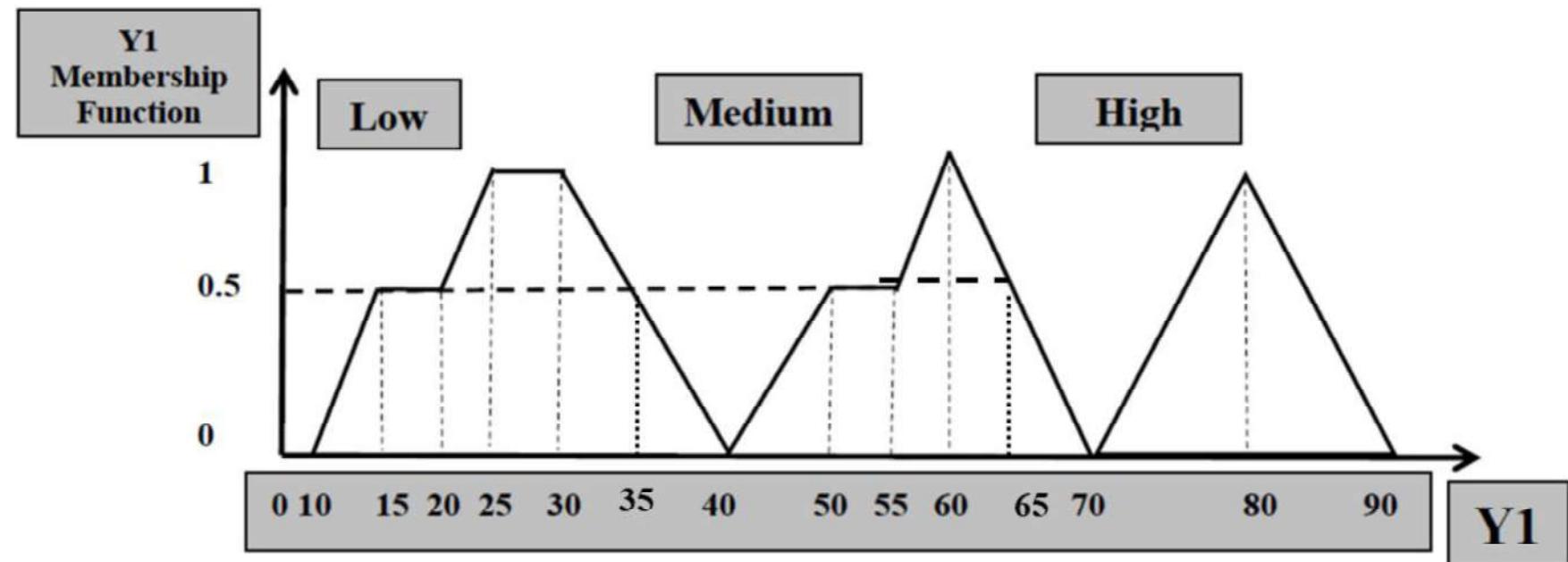
Example: A Fuzzy Logic Controller (FLC) has two antecedents (X_1 and X_2) and one consequent (Y_1).

As shown in the right figure, each antecedent (X_1 or X_2) is represented by 3 fuzzy sets {Low, Medium, High} with trapezoid shape or triangular shape respectively.



7.7 Fuzzy Controller and Applications

The consequent is represented by 3 fuzzy sets {Low, Medium, High} as shown in the figure below.



7.7 Fuzzy Controller and Applications

The rule base for this FLC is as follows:

- Rule 1: IF X1 is Low and X2 is Low Then Y1 is Low
- Rule 2: IF X1 is Low and X2 is Medium Then Y1 is High
- Rule 3: IF X1 is Low and X2 is High Then Y1 is Medium
- Rule 4: IF X1 is Medium and X2 is Low Then Y1 is Medium
- Rule 5: IF X1 is Medium and X2 is Medium Then Y1 is Low
- Rule 6: IF X1 is Medium and X2 is High Then Y1 is Medium
- Rule 7: IF X1 is High and X2 is Low Then Y1 is Low
- Rule 8: IF X1 is High and X2 is Medium Then Y1 is High
- Rule 9: IF X1 is High and X2 is High Then Y1 is High

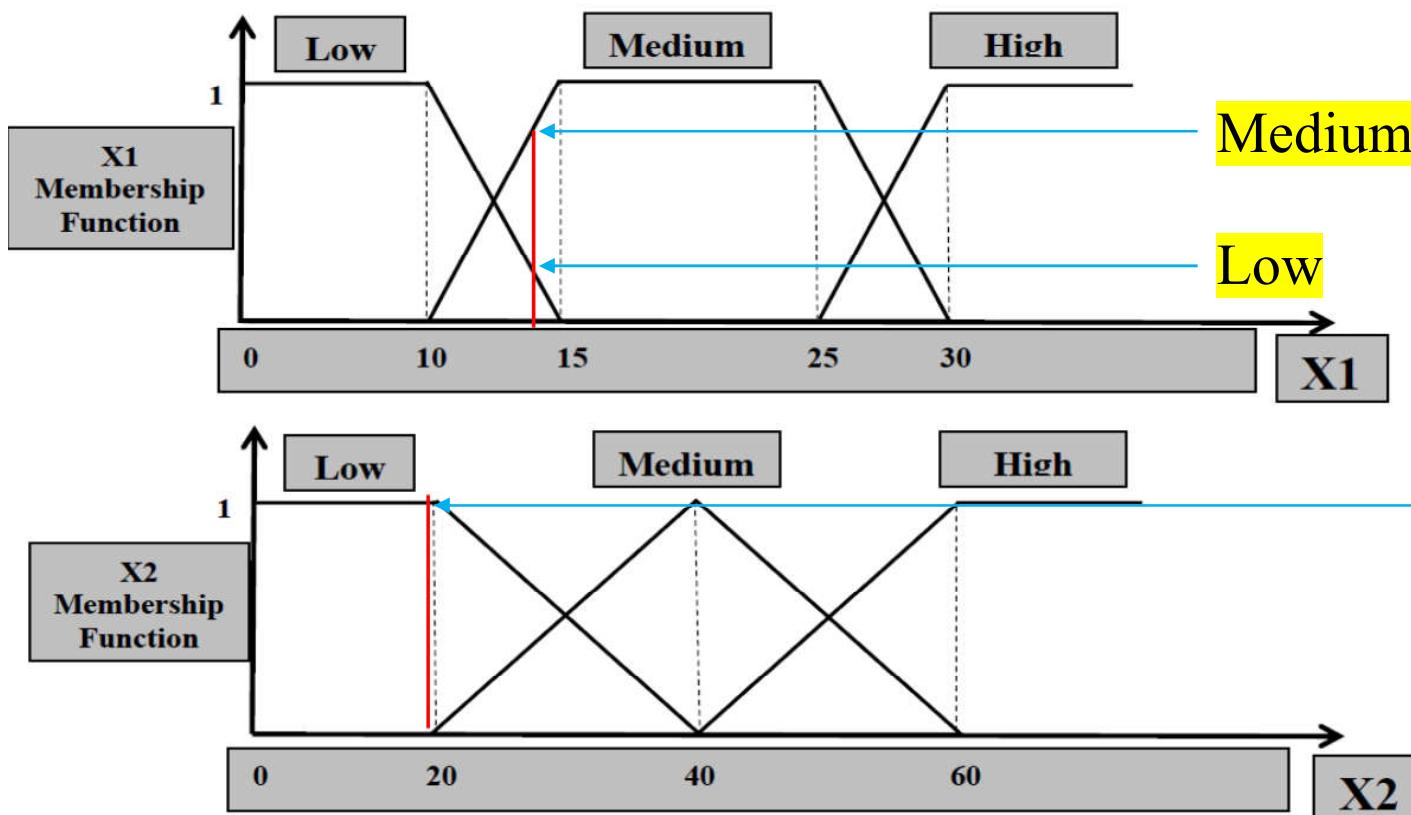
Table presentation of Rule Base

No.	X1	X2	Y1
1	Low	Low	Low
2	Low	Medium	High
3	Low	High	Medium
4	Medium	Low	Medium
5	Medium	Medium	Low
6	Medium	High	Medium
7	High	Low	Low
8	High	Medium	High
9	High	High	High



7.7 Fuzzy Controller and Applications

Assume that the current crisp inputs to the FLC are $X_1=13$ and $X_2=20$, as RED lines shown in the figure below.



- 1) Find the rules to be fired:

For $X_1=13$, its fuzzy membership values is **Low** and **Medium**.

For $X_2=20$, its fuzzy membership value is **Low**. Therefore, **Rule 1** and **Rule 4** will be fired.



7.7 Fuzzy Controller and Applications

- 2) For each fired rule, calculate the firing strength using the Product operation to represent the AND logical connective.

For X1 and Low fuzzy set, $b=10$, $c=15$, the equation for a triangular membership function is:

$$1 \quad x \leq b$$

$$(c-x)/(c-b) \quad b \leq x \leq c$$

Therefore, the membership value is $(15-13)/(15-10)=0.4$

For X1 and the Medium fuzzy set, the equation for trapezoid membership function is shown at right. As $a=10$, $b=15$, $c=25$, $d=30$,

The membership value is $(13-10)/(15-10)=0.6$

$$\begin{aligned} & (x-a)/(b-a) \quad a \leq x \leq b \\ & 1 \quad b \leq x \leq c \\ & (d-x)/(d-c) \quad c \leq x \leq d \\ & 0 \text{ otherwise} \end{aligned}$$



7.7 Fuzzy Controller and Applications

For X2 and Low fuzzy set:

The equation for a triangular membership function is

$$1 \quad x \leq b$$

As $X2 = 20$, the membership value to the Low fuzzy sets is **1.0**.

To calculate the firing strength:

Rule 1: Using the product operation to represent the AND logical connective,
its firing strength is $0.4 * 1.0 = 0.4$.

Rule 4: Using the product operation to represent the AND logical connective,
its firing strength is $0.6 * 1.0 = 0.6$.



8 Summary

- ❑ The scientific programming is mainly dealing with offline data and not interacted with the real-world in real time.
- ❑ The robot programming needs real-time performance, robustness, modularity, concurrency, and intelligence.
- ❑ Robot tasks can be decomposed into smaller tasks such as modelling, planning, localisation, perception, action, communication & learning.
- ❑ Languages for robotic systems: assembly language & high-level languages.
 - *Assembly languages* are processor dependent and widely used in small systems.
 - *High-level languages* are easy to develop, but demand high computing power.
- ❑ C/C++ is a most popular language being used in robotic systems.
- ❑ PID algorithms are widely deployed to control robot motions and manipulations.



8 Summary

- ❑ The Fuzzy logic methodology appears very useful
 - when the processes are too complex for analysis by conventional quantitative techniques or
 - when available sources of information are interpreted qualitatively, inexactly or uncertainly.
- ❑ Fuzzy logic is useful for controlling non-linear systems or systems that cannot be described mathematically.
- ❑ Fuzzy logic has been applied in numerous application areas:
 - Rice cookers, subway control, air-conditioning, braking,
 - Automatic camera focusing, colour adjustment of TVs,
 - Lifts, shower temperature control, vehicle speed and steering control

