



# Introduction to Fuzzy Logic

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# Fuzzy Set Introduction

## Introductory Concepts of Fuzzy Logic

### Crisp Sets

- Well defined sets with boundaries

### Fuzzy Sets

- Loosely defined set without boundaries



# Fuzzy Logic Introduction

## Introductory Concepts of Fuzzy Logic

### Crisp Logic

- Crisp logic is a **two-value logic** representing two possible solution states, often represented by yes/no, 0/1, black/white, or true/false.

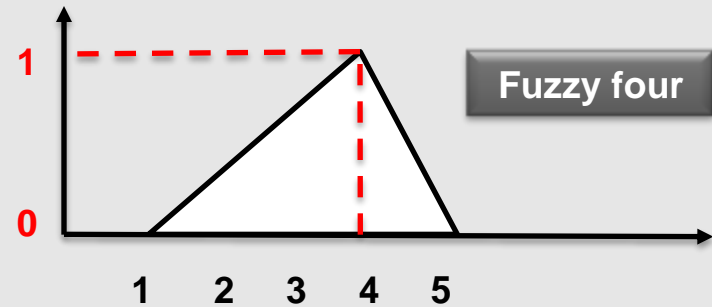
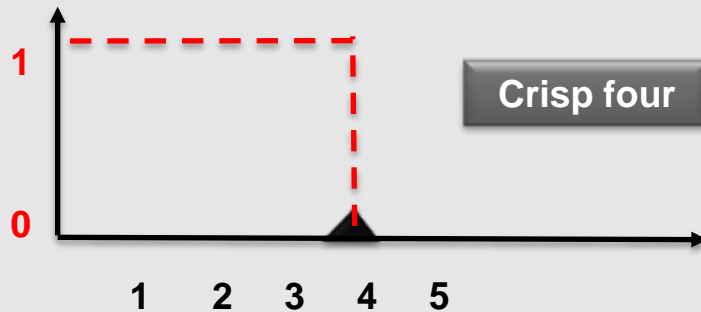
### Fuzzy Logic

- Fuzzy logic is a **multivalued logic** introduced by Zadeh (1965) that allows intermediate values to be defined between the two aforementioned conventional evaluations.



# Fuzzy Membership Functions

## Crisp and Fuzzy Number

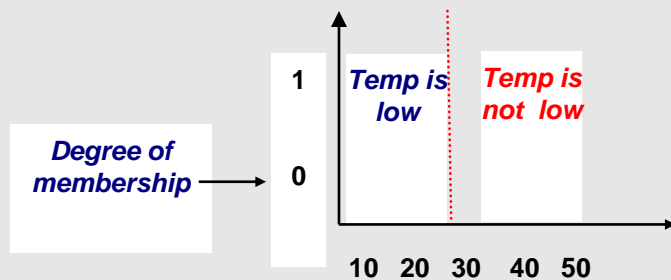


Humans **routinely and subconsciously** place things into classes whose meaning and significance are well understood but whose **boundaries are not well defined**.

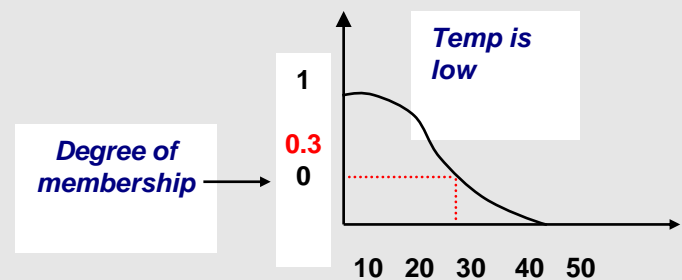
Hot season, large car, young boy and rich people are the examples for the same.

# Examples of Fuzzy Membership Functions

## Temperature



(A) Crisp set

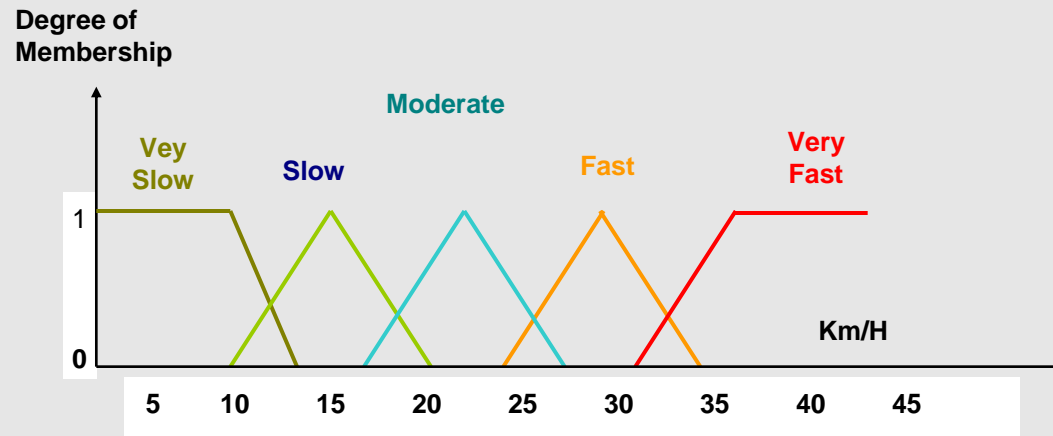


(B) Fuzzy set

Crisp and fuzzy sets for low temperature

# Examples of Fuzzy Membership Functions

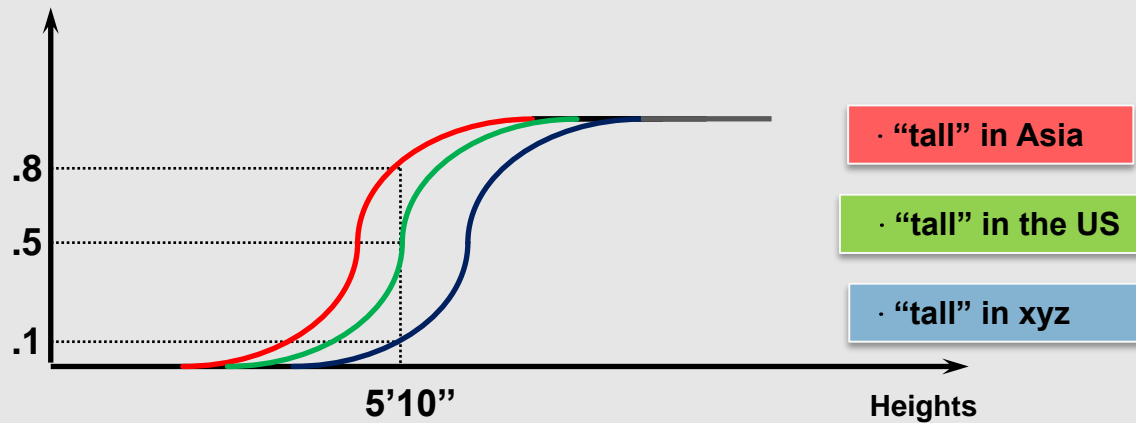
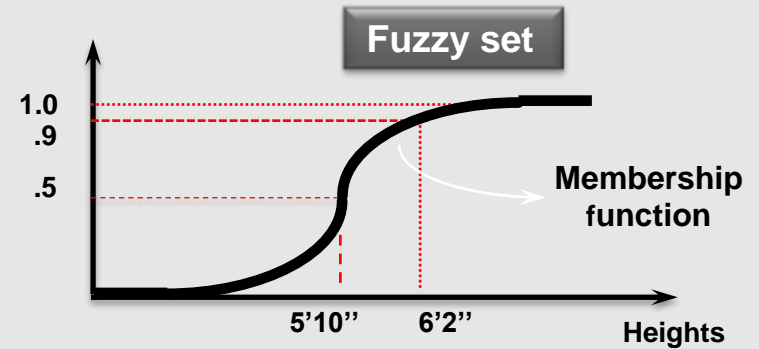
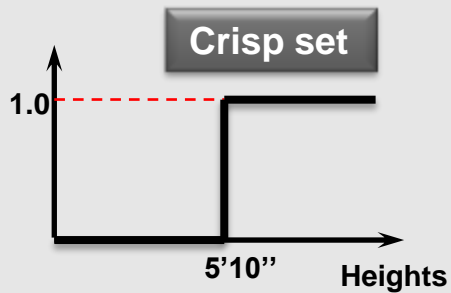
## Speed



**Fuzzy membership functions for typical air conditioner control**

# Examples of Fuzzy Membership Functions

## Height





# Examples of Fuzzy Membership Functions

## Temperature

Hot

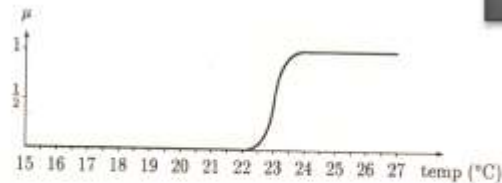


Fig. 2.2. The fuzzy notion hot.

Cold

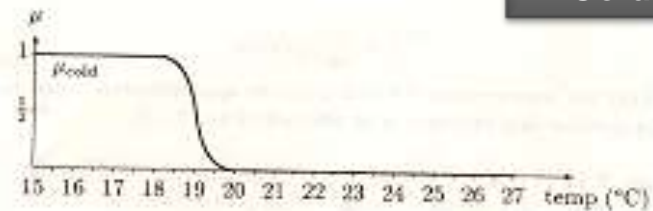
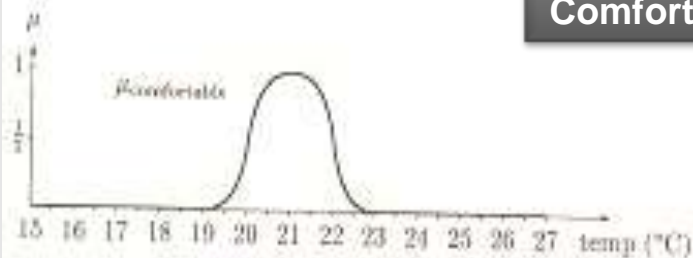
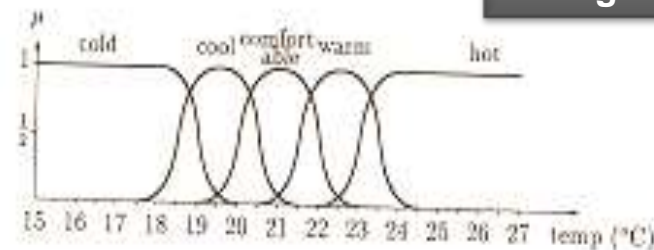


Fig. 2.3. The fuzzy notion cold.

Comfortable



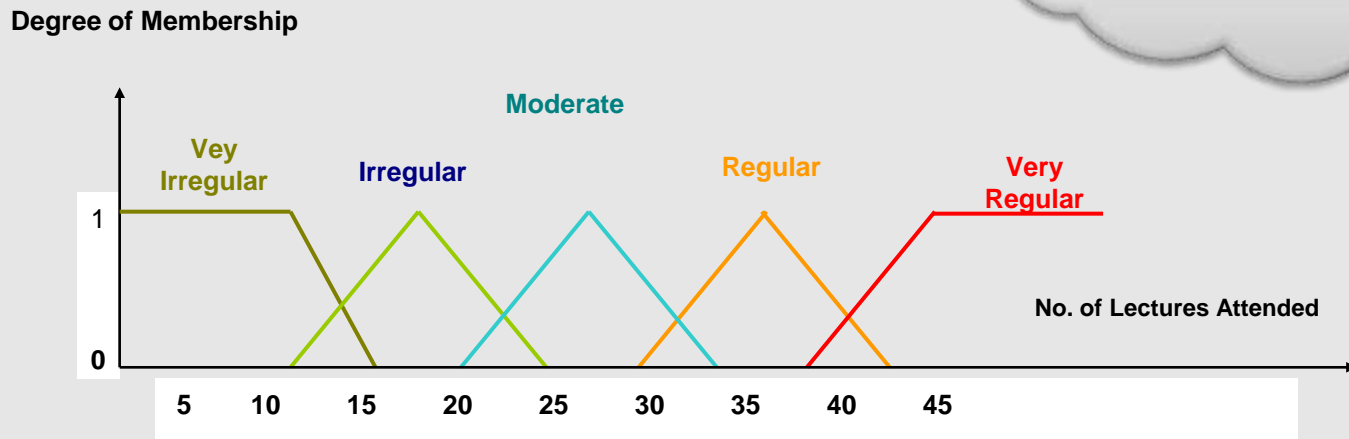
Integrated



# Examples of Fuzzy Membership Functions

## Irregular Student

*Try to design fuzzy membership function for **strict teacher***



**Fuzzy membership functions for irregular student**

# Fuzzification and Defuzzification

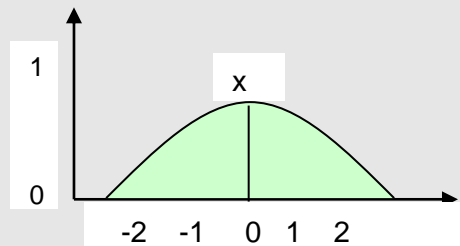
## Fuzzyfication

- The process of transforming **crisp input values into linguistic values** is called “fuzzification.”

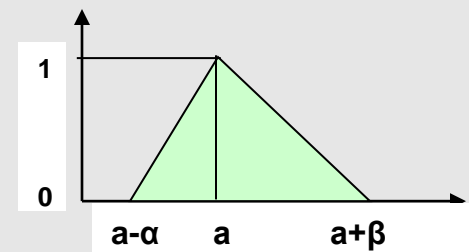
## Defuzzification

- “Defuzzification ”converts the **fuzzy value into a crisp value**. It is the process of producing a quantifiable result from the fuzzy linguistic variable used.

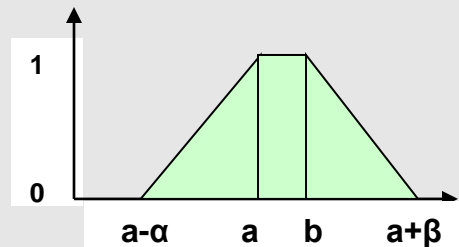
# Types of Fuzzy Membership Functions



Quasi fuzzy membership function

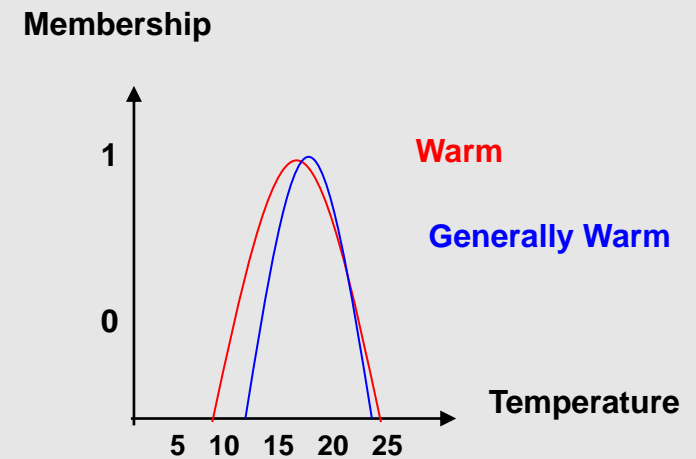
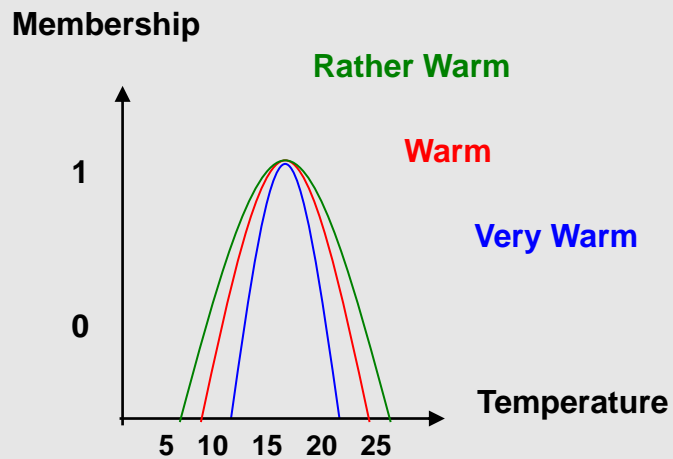


Triangular fuzzy membership function



Trapezoidal fuzzy membership function

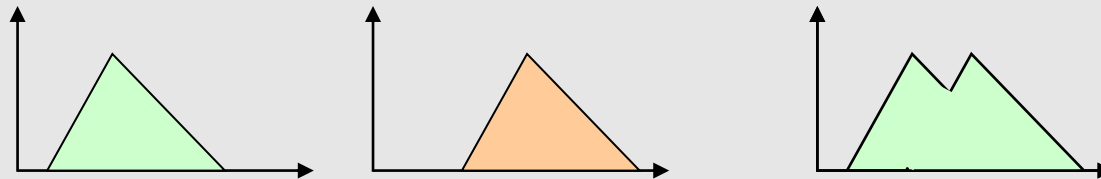
# Fuzzy Hedges



Linguistic hedges

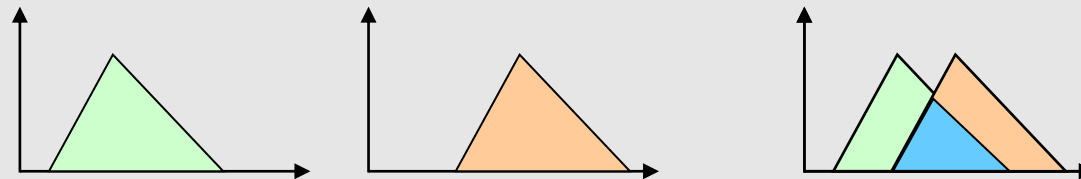
# Operations on Fuzzy Sets

## Fuzzy Union



Union of fuzzy sets

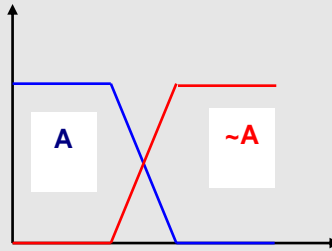
## Fuzzy Intesection



Intersection of fuzzy sets

# Operations on Fuzzy Sets

## Fuzzy Negation



**Negation of fuzzy sets**

# Fuzzy Membership Function : Practical Example

## Book Affordability Example

- Consider set of books B. The graded membership A of a book to determine affordability of a given book is defined as follows:
  - $A=0$ , if price of the book is more than 4999 Rs.
  - $A= 1-\{\text{price}/500\}$  otherwise.
- Consider following information about the book and prices and calculate affordability of each book.

Book	Price (Rs.)	Affordability (A)
Book1	5000	= 0
Book2	400	= $1- 400/500 \rightarrow 0.2$
Book3	300	?
Book4	150	?
Book5	400	?
Book6	100	?



# Fuzzy Membership Function : Practical Example

## Book Quality Example

- Consider another graded membership **Q** referred to **quality of a book** given as :

Book	Quality
Book1	1
Book2	0.5
Book3	0.8
Book4	0.6
Book5	0.2
Book6	0.3

- Consider a fuzzy relationship **R** that determines the books to be purchased depending on good quality and affordable price.
- Calculate the R values** for each book in the tables mentioned above.
- Find out **the most affordable as well as good quality book (simultaneously)** as recommendation.

# Fuzzy Membership Function : Practical Example

## Solution

Book	Price	Affordability	Quality	Recommendation (R)
1	4999	0	1	0
2	400	0.2	0.5	0.2
3	300	0.4	0.8	0.4
<b>4</b>	<b>150</b>	<b>0.7</b>	<b>0.6</b>	<b>0.6</b>
5	400	0.2	0.2	0.2
6	100	0.8	0.3	0.3

The  
affordability **A**,  
which you have  
calculated

The quality  
**Q**, which is  
given

# Crisp and Fuzzy Reltions

## Crisp Relation

- Consider the set of machines,  $M$ , and the set of people,  $P$ , defined as follows:
- $M = \{ \text{set of all machines in a domain} \}$ 
  - e.g.,  $M = \{ m1, m2, m3, \dots, mn \}$  where  $n$  is a finite small number
- $P = \{ \text{set of people} \}$ 
  - e.g.,  $P = \{ p1, p2, p3, \dots, pk \}$  where  $k$  is a finite small number
- If the machines of set  $M$  are used by the people of set  $P$ , the relationship,  $R$ , can be defined as a relationship of  $M^*P$  and identified with the “**used by**” phrase.
- Here,  $R$  is a subset of  $M^*P$  and denoted as  $R$  (**subset of**)  $M^*P$ . The individual relationship can be presented as follows:
  - $(p1, m1), (p2, m2), (p3, m3), \dots$
- Such relationships are crisp in nature and easy to handle mathematically.

# Crisp and Fuzzy Relations

## Fuzzy Relation

- Relationships like “**comfort of a person while working with a machine**” is really a fuzzy relationship and comparatively difficult to handle with crisp logic.
- The fuzzy relationship “generally comfortable” can be defined as follows:

	<i>m1</i>	<i>m2</i>	<i>m3</i>
<i>p1</i>	1.0	0.4	0.7
<i>p2</i>	0.8	1.0	0.6
<i>p3</i>	0.7	0.6	1.0

# Crisp and Fuzzy Relations

## Fuzzy Relation

- Consider  $U = V = \{1,2,3\}$ . The relationship of  $U \times V$ , defined as “approximately equal,” is a binary fuzzy relationship given by  $1/(1,1)$ ,  $1/(2,2)$ ,  $1/(3,3)$ ,  $0.8/(1,2)$ ,  $0.8/(2,3)$ ,  $0.8/(2,1)$ ,  $0.4/(1,3)$ , and  $0.4/(3,1)$ .
- The following table presents the situation in matrix form.

X/Y	1	2	3
1	1.0	0.8	0.4
2	0.8	1.0	0.8
3	0.4	0.8	1.0

- The membership functions can be defined as:

$$\mu_R(x) = \begin{array}{ll} 1.0 & \text{for } x = y \\ 0.8 & \text{for } |x-y| = 1 \\ 0.4 & \text{for } |x-y| = 2 \end{array}$$

# Crisp and Fuzzy Relations

## Fuzzy Relation

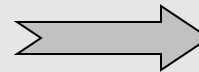
- The intersection and union operators are also applicable to fuzzy relationships. They are defined as follows:

$$\mu_{R \cap S}(x,y) = \min( \mu_R(x,y), \mu_S(x,y) )$$

$$\mu_{R \cup S}(x,y) = \max(( \mu_R(x,y), \mu_S(x,y) )$$

## Examples: What is $R \cap S$ ?:

Consider  $U = V = \{1,2,3\}$ . Relationship  $R$  of  $U \times V$  was defined earlier as “**approximately equal**” and given as shown in the adjacent table.

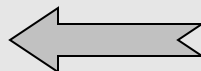


**R**

X/Y	1	2	3
1	1.0	0.8	0.4
2	0.8	1.0	0.8
3	0.4	0.8	1.0

**S**

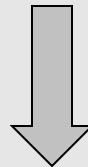
X/Y	1	2	3
1	0	0.6	0.8
2	0	0	0.6
3	0	0	0



Consider another relationship,  $S$ , of  $U \times V$  in which  $x$  is “**considerably larger**” than  $y$  for  $\forall x \in U$  and  $\forall y \in V$ . The relationship  $S$  can be given as shown in the adjacent table.

# Intersection Operation

X/Y	1	2	3
1	Min(1,0)	Min(0.8,0.6)	Min(0.4,0.8)
2	Min(0.8,0)	Min(1,0)	Min(0.8,0.6)
3	Min(0.4,0)	Min(0.8,0)	Min(1,0)



X/Y	1	2	3
1	0	0.6	0.4
2	0	0	0.6
3	0	0	0



# Union Operation

X/Y	1	2	3
1	Max (1,0)	Max (0.8,0.6)	Max (0.4,0.8)
2	Max (0.8,0)	Max (1,0)	Max (0.8,0.6)
3	Max (0.4,0)	Max (0.8,0)	Max (1,0)



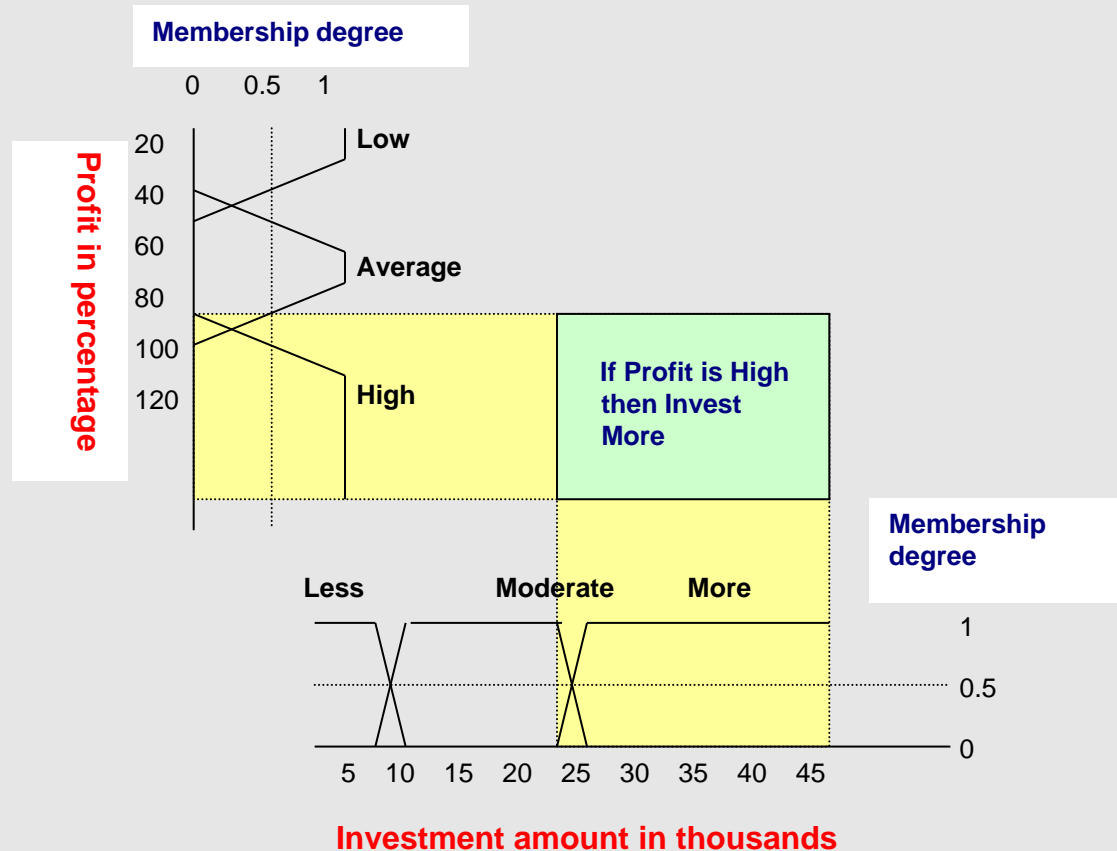
X/Y	1	2	3
1	1.0	0.8	0.8
2	0.8	1.0	0.8
3	0.4	0.8	1.0

# Fuzzy Connectives

- Fuzzy connectives are used to join simple fuzzy propositions to make compound propositions.
- Negations ( $\sim$ ), disjunctions ( $\cup$ ), conjunctions ( $\cap$ ), and implications ( $\rightarrow$ ) are used as fuzzy connectives.

# Fuzzy Rule Based Systems

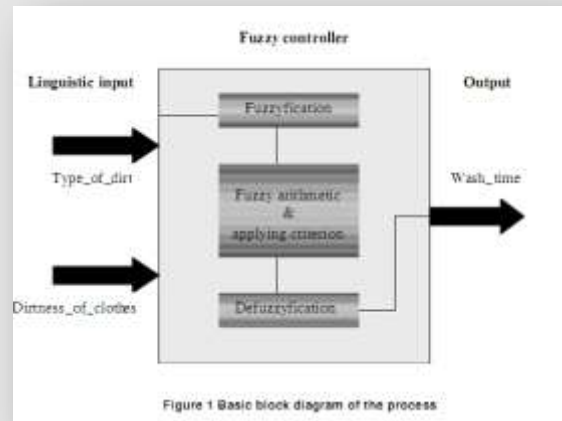
## Fuzzy Portfolio Management



Fuzzy rules and relationships

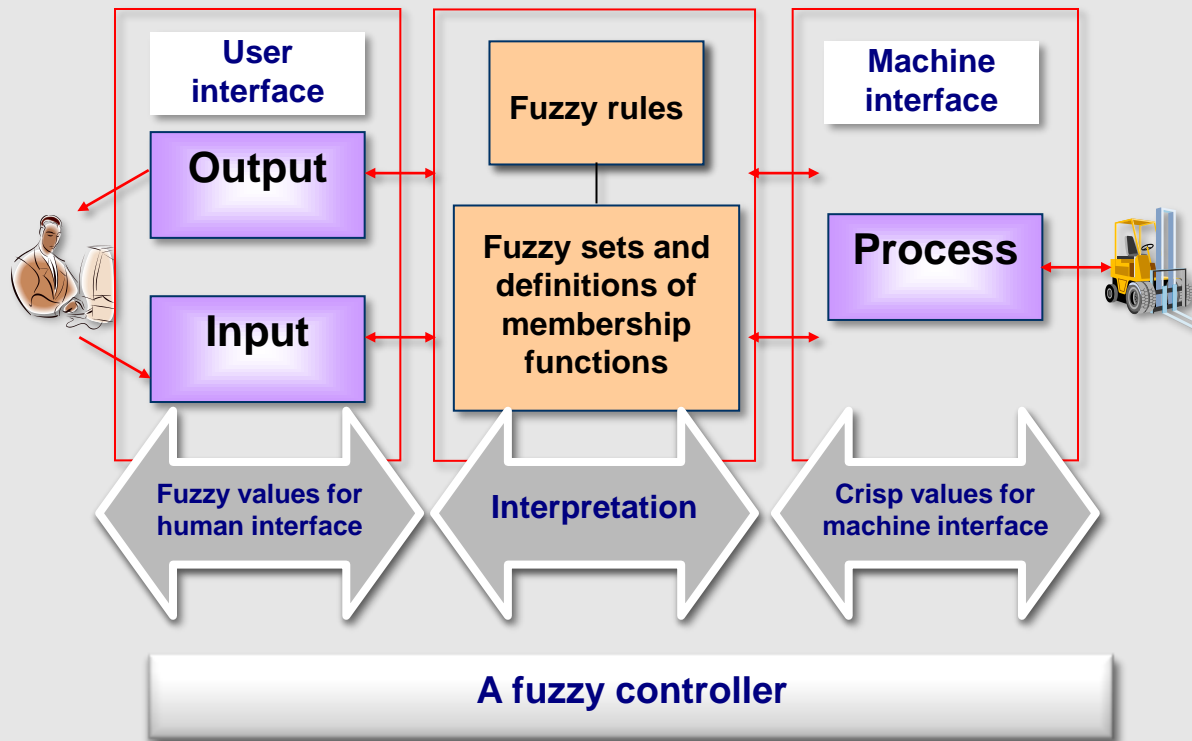
# Fuzzy Rule Based System

## Fuzzy Washing Machine



If dirtiness\_of\_clothes is Large and type\_of\_dirt is Greasy then wash\_time is VeryLong;  
If dirtiness\_of\_clothes is Medium and type\_of\_dirt is Greasy then wash\_time is Long;  
If dirtiness\_of\_clothes is Small and type\_of\_dirt is Greasy then wash\_time is Long;  
If dirtiness\_of\_clothes is Large and type\_of\_dirt is Medium then wash\_time is Long;  
If dirtiness\_of\_clothes is Medium and type\_of\_dirt is Medium then wash\_time is Medium;  
If dirtiness\_of\_clothes is Small and type\_of\_dirt is Medium then wash\_time is Medium;  
If dirtiness\_of\_clothes is Large and type\_of\_dirt is NotGreasy then wash\_time is Medium;  
If dirtiness\_of\_clothes is Medium and type\_of\_dirt is NotGreasy then wash\_time is Short;  
If dirtiness\_of\_clothes is Small and type\_of\_dirt is NotGreasy then wash\_time is VeryShort.

# Fuzzy rule Based System: General Structure



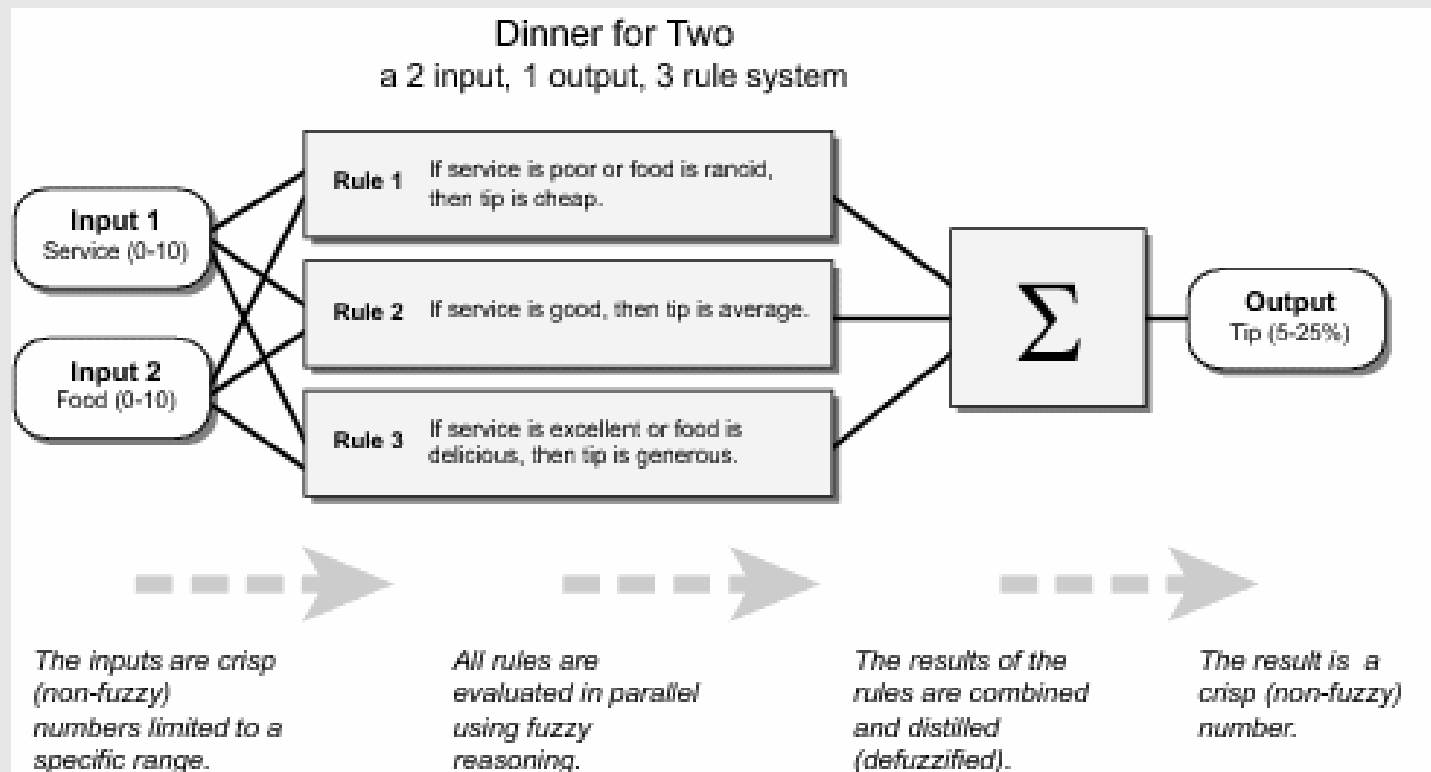
# Fuzzy Rule Based System: An Exmple

## Tip to the Waiter

- Tip given to a waiter after a meal can be dependent of factors such as:
  - Good quality and taste of food and
  - Efficient service.
- It should be noted that
  - **if food is delicious and service is excellent than tip is generous.**
- The example involves determination of fuzzy mebership functions for
  - **Taste of food**
  - **Type of service**
  - **Amount of tip given to waiter**

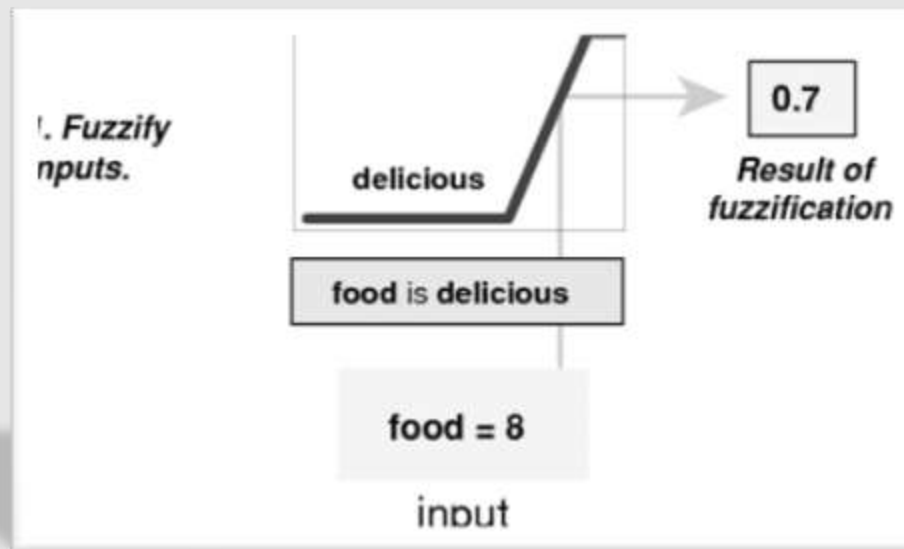
# Fuzzy Rule Based System: An Exmple

## Tip to the Waiter



# Fuzzy Rule Based System: An Exmple

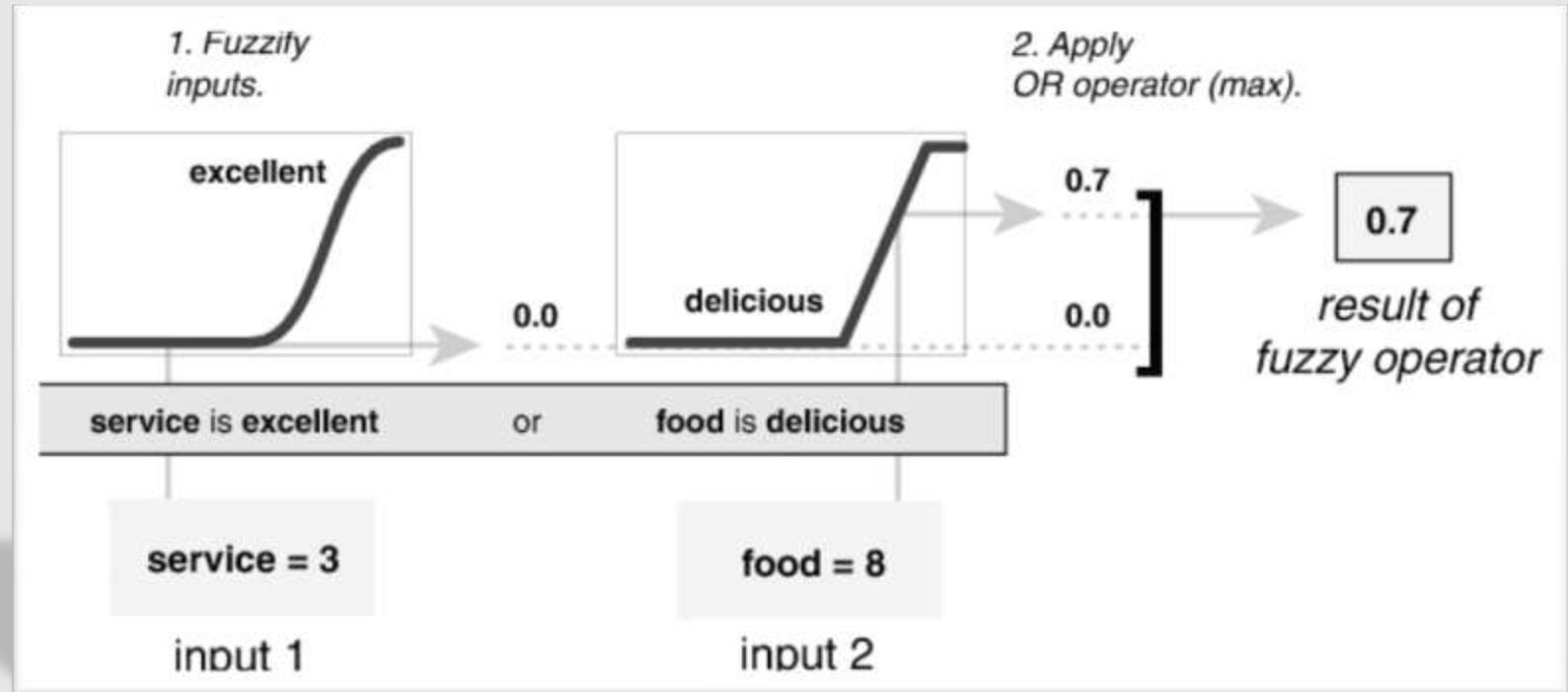
Food is delicious ....





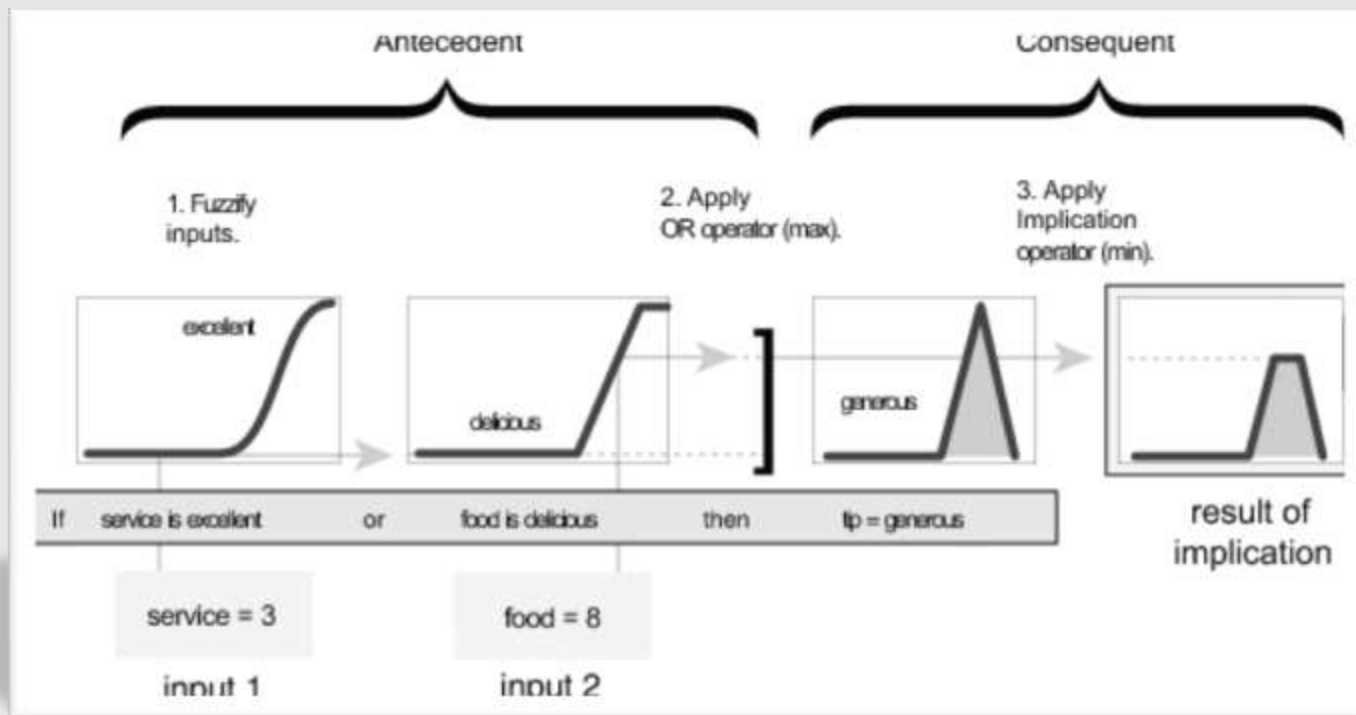
# Fuzzy Rule Based System: An Example

Food is delicious ....

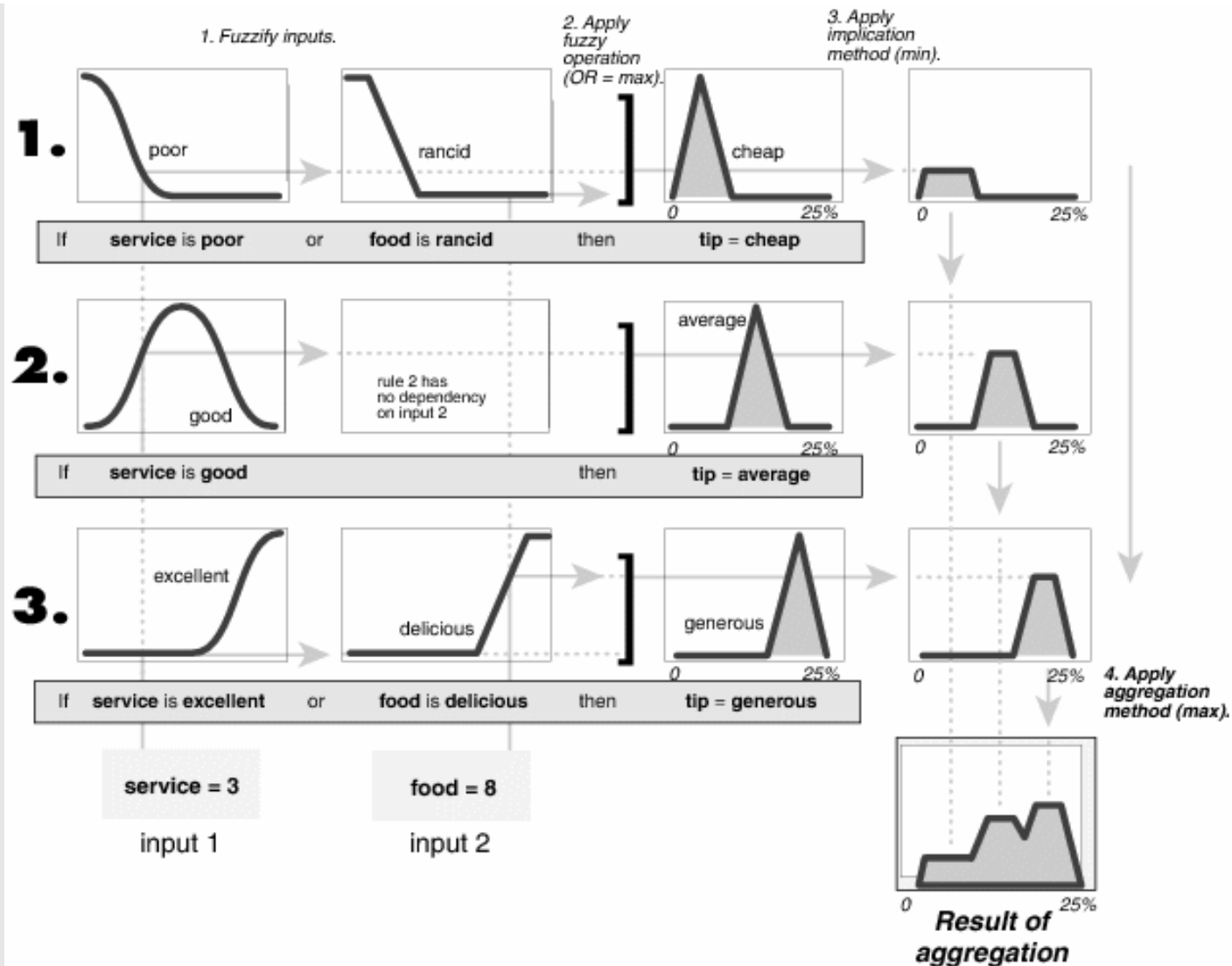


# Fuzzy Rule Based System: An Example

Food is delicious ....



# Fuzzy Rule Based System :An Example

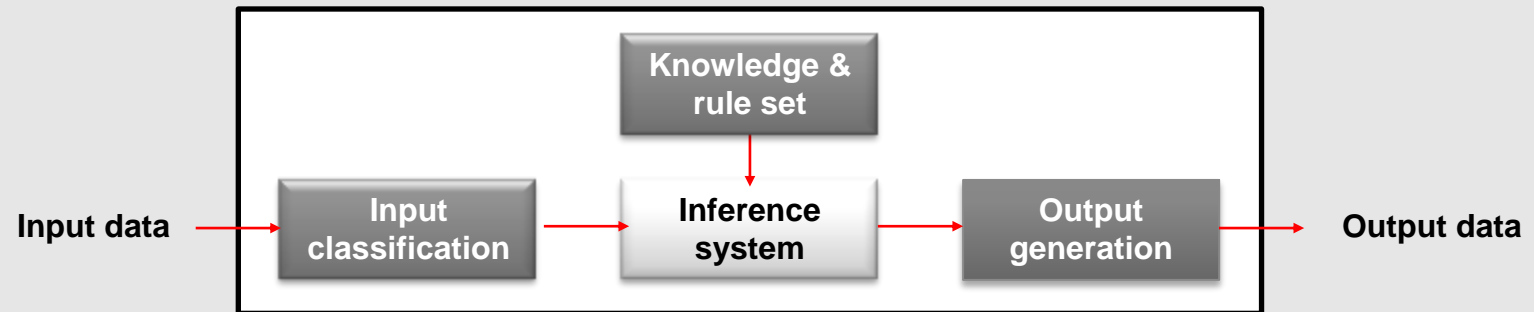


# Fuzzy Logic: Advantages

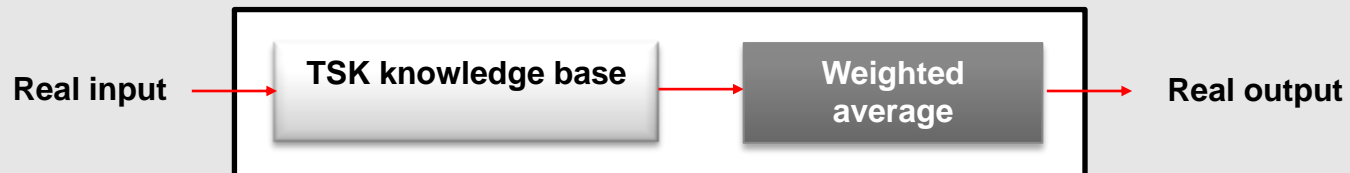
## Advantages of Fuzzy Logic

- Linguistic values used make it more **human oriented**.
- Allows the **solution to previously unsolved problems**.
- **Rapid prototyping** is possible as knowledge is not required before starting work.
- **Cheaper** to make than conventional system as **easier to design**
- Increased robustness.
- **Simpler knowledge** acquisition and representation.
- A **few rules** are used to describe **great complexity**.

# Models of Rule-Based Systems



(a) Mamdani model of FRBS



(b) TSK model of FRBS

**General model of FRBS**

This slide show is available at  
Pritisajja.info

Thanks!

## References:

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- Rajendra Akerkar and Priti Srinivas Sajja: **“Knowledge-based systems”**, Jones & Bartlett Publishers, Sudbury, MA, USA (2009)

