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# Introduction to Fuzzy Logic and Fuzzy Systems

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# Objectives

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- ❖ What Is Fuzzy Logic?
- ❖ Fuzzy sets
- ❖ Membership function
- ❖ Differences between Fuzzy and Probability?
- ❖ Fuzzy Inference.
- ❖ Why Fuzzy Logic?

# What Is Fuzzy Logic?

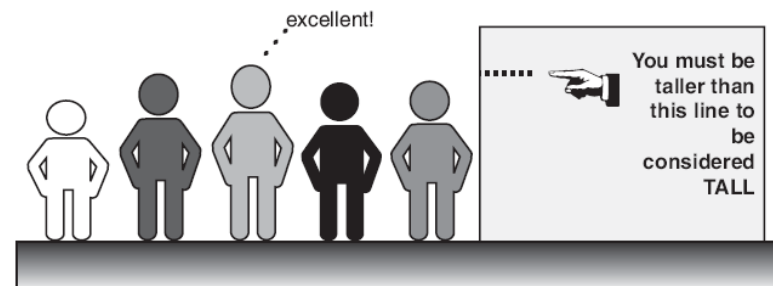
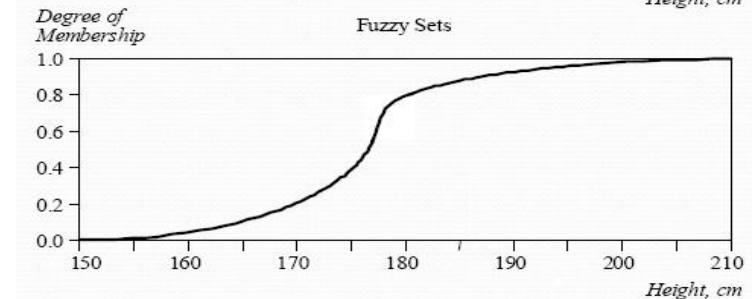
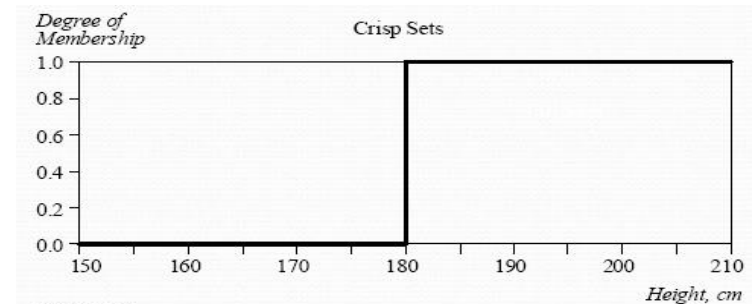
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- Theory of fuzzy sets
  - Membership is a matter of degree.
  - Fuzzy sets VS classical set theory.
- Basic foundations of fuzzy sets
  - Fuzzy sets (Zadeh, 1965) , Fuzzy Logic (Zadeh, 1973)
- Fuzzy
  - Reflect how people think
  - Attempts to model our sense of words decision making, and common sense.
  - Mathematical principles for **knowledge representation** based on **degrees of membership** rather than on **crisp membership** of classical binary logic.

# Fuzzy sets

- Accept that things can be partly **true** and partly **false** to any degree at the same time.
- Crisp and fuzzy sets of ‘tall men’

Name	Height, cm	Degree of Membership	
		<i>Crisp</i>	<i>Fuzzy</i>
Chris	208	1	1.00
Mark	205	1	1.00
John	198	1	0.98
Tom	181	1	0.82
David	179	0	0.78
Mike	172	0	0.24
Bob	167	0	0.15
Steven	158	0	0.06
Bill	155	0	0.01
Peter	152	0	0.00



# Membership function

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- Crisp set representation

- Characteristic function

$$f_A(x) : X \rightarrow 0,1$$

$$f_A(x) = \begin{cases} 1, & \text{if } x \in A \\ 0, & \text{if } x \notin A \end{cases}$$

- Fuzzy set representation

- Membership function

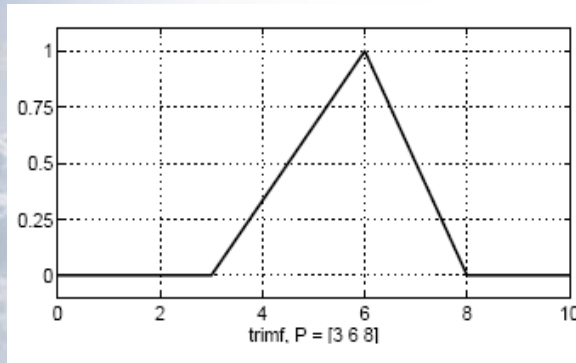
$$\mu_A(x) : X \rightarrow [0,1]$$

$$\mu_A(x) = 1 \text{ if } x \text{ is totally in } A;$$

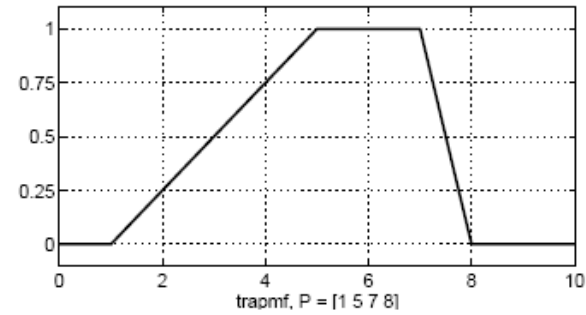
$$\mu_A(x) = 0 \text{ if } x \text{ is not in } A;$$

$$0 < \mu_A(x) < 1 \text{ if } x \text{ is partly in } A.$$

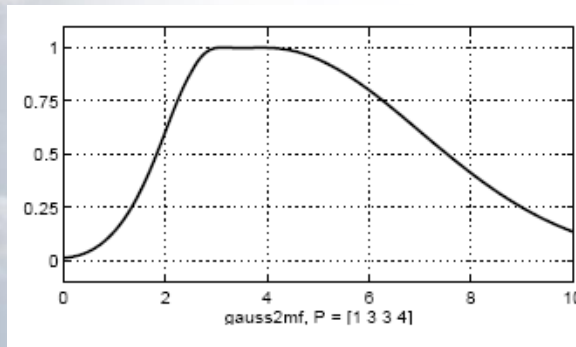
# Well known Membership Functions



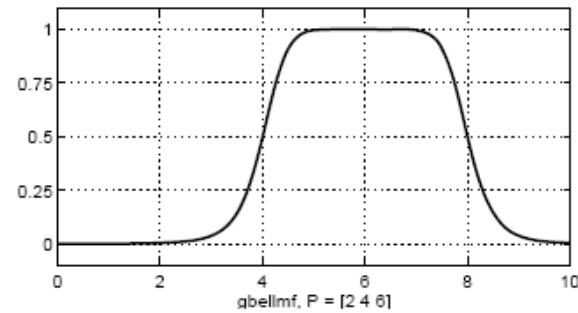
*Triangular*



*Trapezoidal*



*Gaussian*



*Bell*

# Fuzzy Vs Probability

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- Fuzzy  $\neq$  Probability  $\Rightarrow \mu_A(x) \neq p_A(x)$
- Both map  $x$  to a value in  $[0,1]$ .
- $P_A(x)$  measures our **knowledge** or **ignorance** of the truth of the event that  $x$  belongs to the set  $A$ .
  - Probability deals with **uncertainty** and **likelihood**.
- $\mu_A(x)$  measures the degree of **belongingness** of  $x$  to set  $A$  and there is no interest regarding the **uncertainty** behind the outcome of the event  $x$ . Event  $x$  has occurred and we are interested in only making observations regarding the degree to which  $x$  belongs to  $A$ .
  - Fuzzy logic deals with **ambiguity** and **vagueness**.

# Example

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- A bottle of water
- 50% probability of being poisonous means 50% chance.
  - 50% water is clean.
  - 50% water is poisonous.
- 50% fuzzy membership of poisonous means that the water has poison.
  - Water is half poisonous.



# Fuzzy Logic Operations

- Fuzzy union operation or fuzzy *OR*

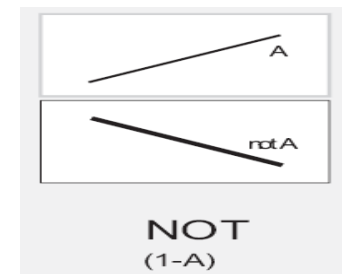
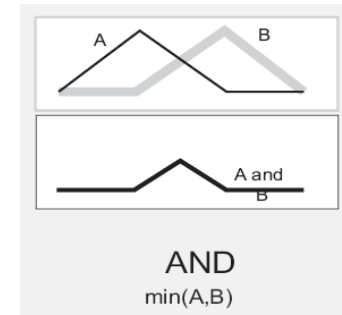
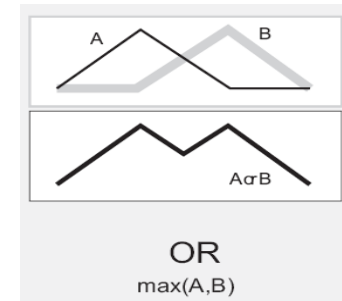
- $\mu_{A+B} = \max[\mu_A(x), \mu_B(x)]$

- Fuzzy intersection operation or fuzzy *And*

- $\mu_{A.B} = \min[\mu_A(x), \mu_B(x)]$

- Complement operation

- $\mu_A = 1 - \mu_A(x)$



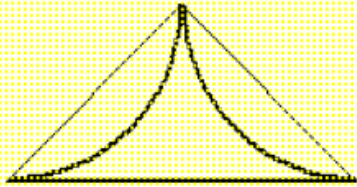
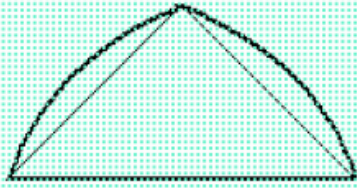
# Linguistic variables and hedges

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- Wind is *a little* strong.
- Weather is *quite* cold.
- Height is *almost* tall.
- Weight is *very* high.
- Wind, Weather, Height and Weight are linguistic variables.
- A little, Quite, Almost, Very are hedges.
- Strong, Cold, Tall and high are linguistic value.

# Example

- Membership of body fitness

<i>Hedge</i>	<i>Mathematical Expression</i>	<i>Graphical Representation</i>
Very very	$[\mu_A(x)]^4$	
More or less	$\sqrt{\mu_A(x)}$	

# Fuzzy Inference

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- Fuzzy inference is the process of formulating the mapping from a given **input** to an **output** using fuzzy logic.
- If then rules
  - *if temperature is cold then hot water valve is open and cold water valve is shut*
- Rule Base
  - If the distance to intersection (dti) is *far* and the speed *slow* apply *gentle breaks*
  - If dti is *near* and the speed *slow* apply *medium breaks*
  - If dti is *far* and speed *fast* apply *medium breaks*
  - If dti is *near* and speed *fast* apply *high breaks*

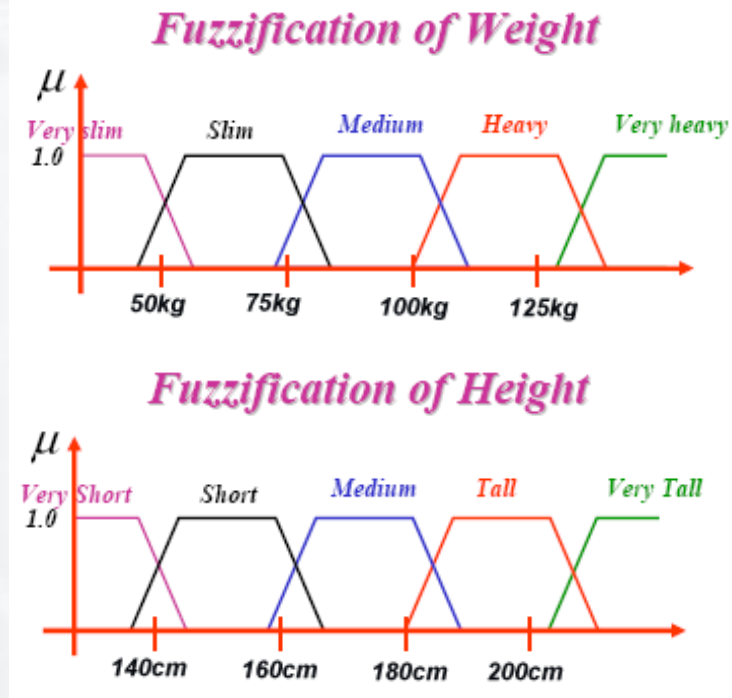
# Fuzzy Inference

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- Assume we want to evaluate the health of a person based on his height and weight.
- The input variables are the crisp numbers of the person's **height** and **weight**.
- Output is **percentage of healthiness**.

# Step 1:Fuzzification

- Fuzzification is a process by which the numbers are changes into linguistic words.



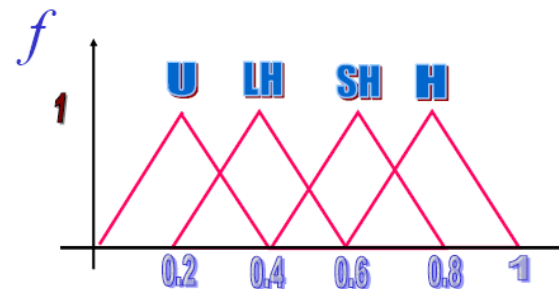
# Step 2: Rules

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- Rules reflect experts decisions.
- Rules are tabulated as fuzzy words
- Rules can be grouped in subsets
- Rules can be redundant
- Rules can be adjusted to match desired

# Rules(Cont.)

- Rules are tabulated as fuzzy words
  - – Healthy (H)
  - – Somewhat healthy (SH)
  - – Less Healthy (LH)
  - – Unhealthy (U)
  - Rule function  $f$
- $f = \{U, LH, SH, H\}$



$$f = \{U, LH, SH, H\}$$



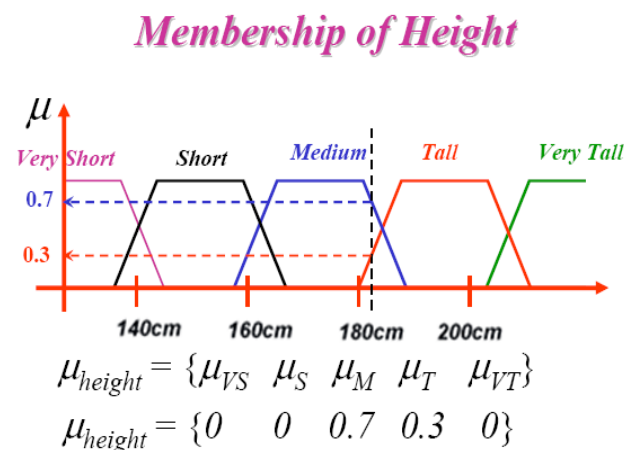
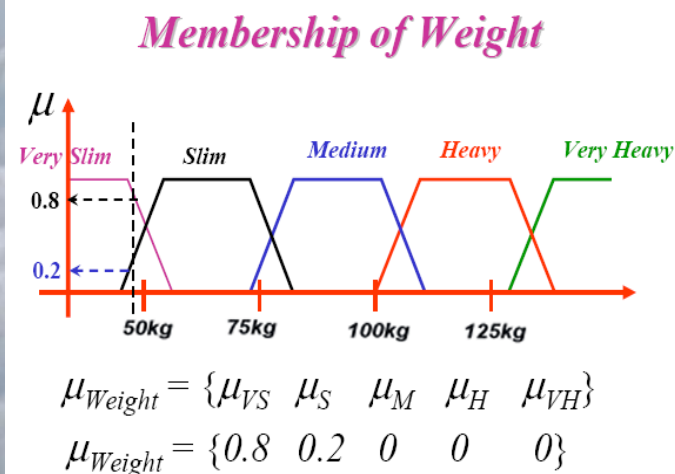
# Fuzzy Rule Table

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		Weight				
		Very Slim	Slim	Medium	Heavy	Very Heavy
Height	Very Short	H	SH	LH	U	U
	Short	SH	H	SH	LH	U
	Medium	LH	H	H	LH	U
	Tall	U	SH	H	SH	U
	Very Tall	U	LH	H	SH	LH

# Step 3: Calculation

- For a given person, compute the membership of his/her weight and height
- Assume that a person height is 185cm
- Assume that the person's weight is 49



# Calculation(cont.)

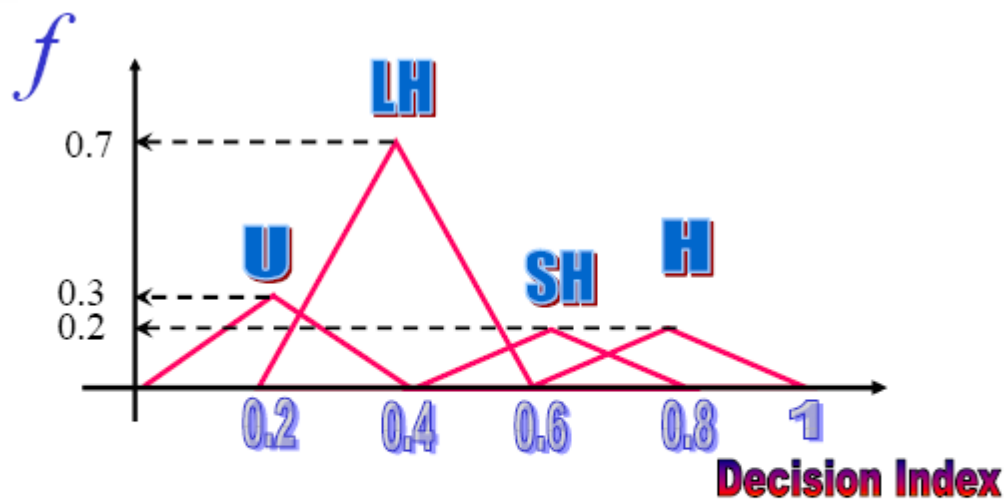
- Rule Activation
- Min Operation

		Weight				
		0.8	0.2	Medium	Heavy	Very Heavy
Height	Very Short	H	SH	LH	U	U
	Short	SH	H	SH	LH	U
	0.7	LH	H	H	LH	U
	0.3	U	SH	H	SH	U
	Very Tall	U	LH	H	SH	LH

		Weight				
		0.8	0.2	Medium (0)	Heavy (0)	V.Heavy (0)
Height	V. Short (0)	0	0	0	0	0
	Short (0)	0	0	0	0	0
	0.7	0.7	0.2	0	0	0
	0.3	0.3	0.2	0	0	0
	V. Tall (0)	0	0	0	0	0

# Calculation(cont.)

- Scaled Fuzzified Decision

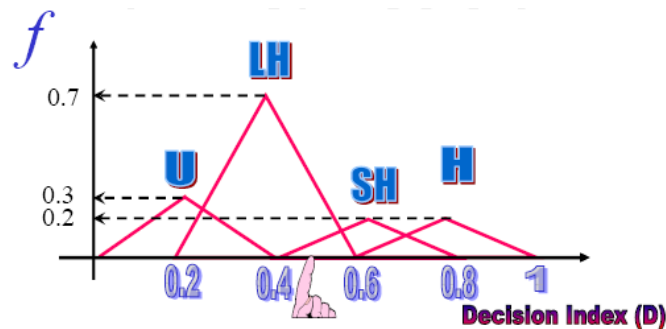


$$f = \{U, LH, SH, H\}$$

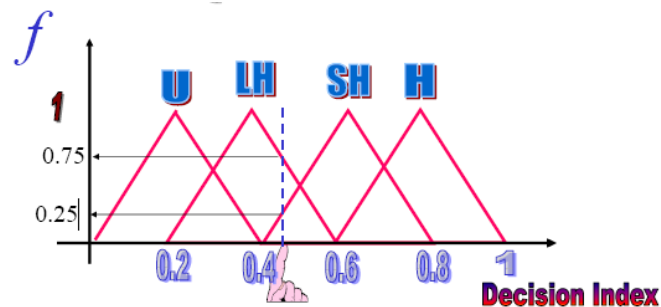
$$f = \{0.3, 0.7, 0.2, 0.2\}$$

# Step 4: Final Decision

- Defuzzification



Crisp Decision Index (D) is the centroid  
 $D = 0.4429$



Fuzzy Decision Index (D)  
75% in Less Healthy group  
25% in Somewhat Healthy group

# Why Fuzzy Logic?

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- Fuzzy logic is conceptually easy to understand.
- Fuzzy logic is flexible.
- Fuzzy logic is tolerant of imprecise data.
- Fuzzy logic can model nonlinear functions of arbitrary complexity.
- Fuzzy logic can be built on top of the experience of experts.
- Fuzzy logic is based on natural language.
- Fuzzy logic can be blended with conventional control techniques.

An aerial photograph of a vast expanse of white, fluffy clouds under a clear blue sky. A thin white contrail is visible in the upper left. A solid red horizontal line spans the width of the image, positioned above the main text.

THANK YOU

Questions?