## **Lectures 11**

## 3/7/2018

Crisp set A of X

**Fuzzy logic** 

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

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

where

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

$$\mu_A(x) = 1$$
 if  $x$  is totally in  $A$ ;  
 $\mu_A(x) = 0$  if  $x$  is not in  $A$ ;  
 $0 < \mu_A(x) < 1$  if  $x$  is partly in  $A$ .

## Hedges

- 160 5'2.4" ... 170 -
- Tall =  $\{\{0,160\},\{0.5,170\},\{1,182\}\}$
- Short =  $\{\{1,160\},\{0.25,170\},\{0,182\}\}$
- Two situations: either we require a new fuzzy variable, or apply a hedge
- Very Tall =  $(tall)^2 = \{\{0^2, 160\}, \{.5^2, 170\}, \{1^2, 182\}\}$

## Fuzzy sets, operations on fuzzy sets, monotonic inference

- Fuzzy logic operations
  - o Fuzzy logic operations are different from classical logic
  - Recall Boolean logic operations:
    - Compliment
      - Classical logic: invert the variable or expression
      - Fuzzy: similar operation, except we subtract it by one
      - $\mu_{\neg A}(x) = 1 \mu_A(x)$
    - Intersection (AND)
      - Use min
        - $\circ \quad \mu_{A \cap B}(x) = \min[\mu_A(x), \mu_B(x)]$
        - $\circ \quad \mu_{Tall \cap Short}(x) = \{\{0,160\}, \{0.25,170\}, \{0,182\}\}\$
      - Use product
        - $\circ \quad \mu_{A \cap B}(x) = \mu_A(x) \times \mu_B(x)$
    - Union (OR)
      - Use max
        - $\circ \quad \mu_{A \cup B}(x) = \max[\mu_A(x), \mu_B(x)]$
        - $\circ \quad \mu_{Tall \cap Short}(x) = \big\{ \{1,160\}, \{0.5,170\}, \{1,182\} \big\}$
      - Union with Probabilistic OR
        - $\rho = \mu_{A \cup B}(x) = \mu_{A}(x) + \mu_{B}(x) \mu_{A}(x) \times \mu_{B}(x)$

$$\circ \quad \mu_{Tall \cap Short}(x) = \begin{cases} \{0 + 1 - 0 * 1,160\}, \\ \{0.5 + 0.25 - 0.5 * 0.25,170\}, \\ \{1 + 0 - 1 * 0,182\} \end{cases} = \begin{cases} \{1,160\}, \\ \{0.625,170\}, \\ \{1,182\} \end{cases}$$

- Fuzzy rules
  - We want to catch a real big yellow tail!
  - o Variables: Temperature, Size of the bait
  - o Input: Temperature = {Cold, Ideal, Hot}
    - Ideal =  $\{\{0,64F\}, \{0.5,72F\}, \{1,77F\}, \{0.5,80F\}, \{0,182F\}\}$
  - o Input: Bait Weight = {Small,Big}
    - $\blacksquare \quad \mathsf{Big} = \big\{ \{0,2lbs\}, \{0.5,4lbs\}, \{1,5lbs\} \big\}$
  - Output: Tuna Length = {Small,Big}
    - Big =  $\{\{0,24in\},\{0.5,29in\},\{1,34in\}\}$

IF Temperature is Ideal AND Bait Weight is Big THEN Tune Length is Big

IN TESTING:

Being realistic here:

72F and we only got a 4lb

uTemperature(72F) = 0.5 uBaitWeight(4lb) = 0.5

uTemperature(72F) AND uBaitWeight(4lb)

- = min( uTemperature(72F), uBaitWeight(4lb) )
- = min(0.5, 0.5) = 0.5

uBig-1( uTemperature(72F) AND uBaitWeight(4lb) ) = uBig-1( 0.5 ) = 29in