# Fuzzy Logic and Computation with words

**David Pruitt** 

#### Inspiration

- Real world is messy
- Computing with words is inspired by the remarkable human capability to perform a wide variety of physical and mental tasks without any measurements and any computations.

### Computation "Stack"

- Crisp sets
- Fuzzy sets
- Computing with words (CWW)

## **Crisp sets**

- Distinct values
  - o x is 1 or 0
- Set
  - S = {x | x meets some conditions}
- Membership function
  - μ<sub>S</sub> = { 1 if x ∈ S
     { 0 if x ∉ not element of S

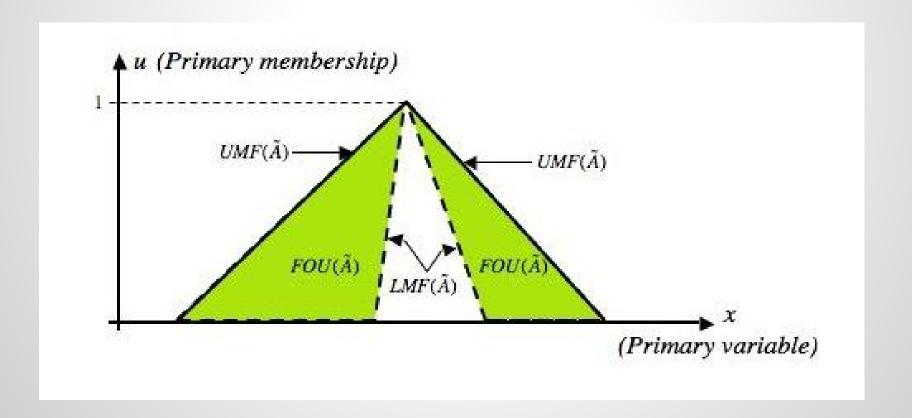
#### Crisp sets don't always work

- Sorites Paradox
  - Take 1,000,000 grains of sand to be a heap
  - Remove a grain
- What's temperature is cold?

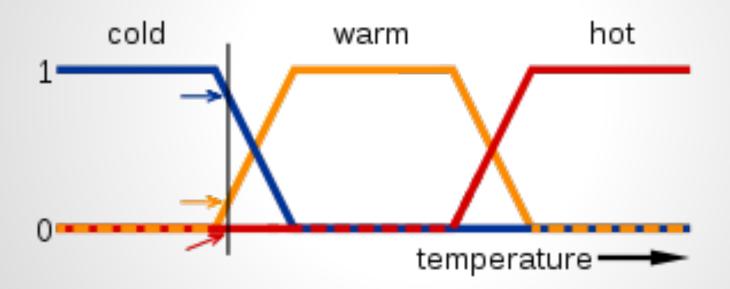
### **Fuzzy Sets**

- Variables with soft values
  - Value of x is imprecise
- Set
  - Contains pairs (U:m)
  - $\circ$  Set S = {(x<sub>0</sub>:0.4), (x<sub>1</sub>:0.2), (x<sub>2</sub>:0.2), ....}
- Membership function
  - $S = \{(x, m(x)) | x \in X\}$

## **Fuzzy Set**



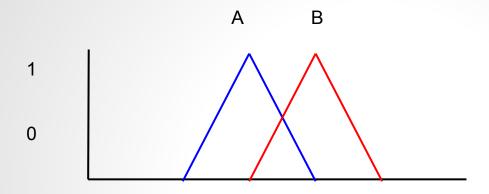
# **Example of fuzzy sets**

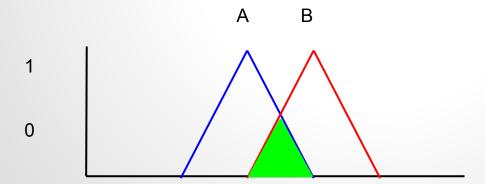


#### **Fuzzy Set Operators**

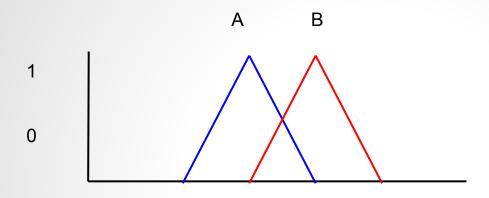
- Same operators as regular sets
  - o And, Or, Not
- Can be defined in different ways

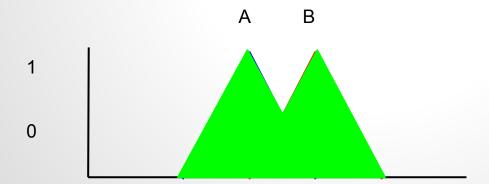
# And



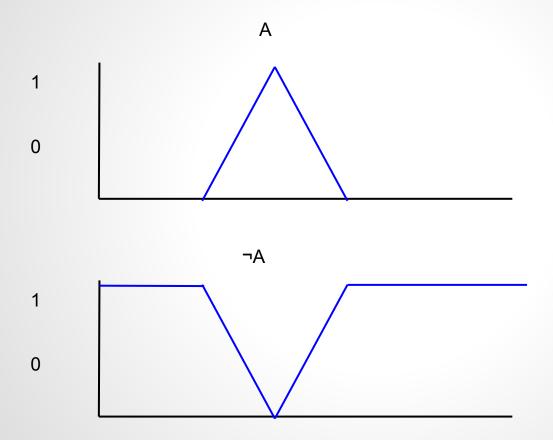


# Or





# Not

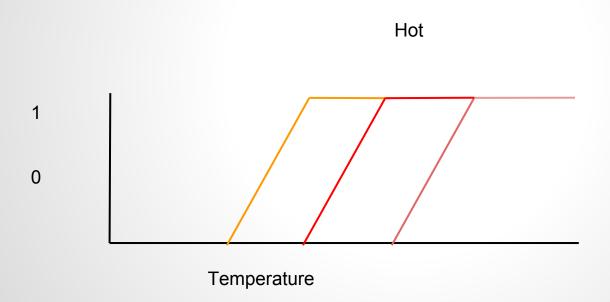


# **Fuzzy Logic**

- Uses linguistic variables
- Series of if then rules
- More than one rule can apply
- Can hedge variables

# Hedge

Modifier: very, a little



## **Apply rules**

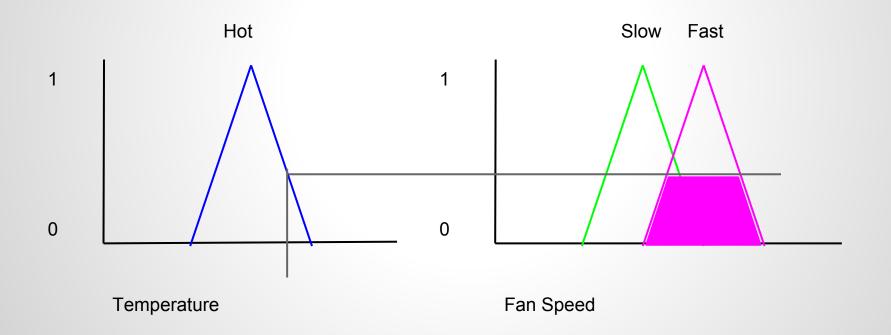
All rules evaluated

Results applied simultaneously

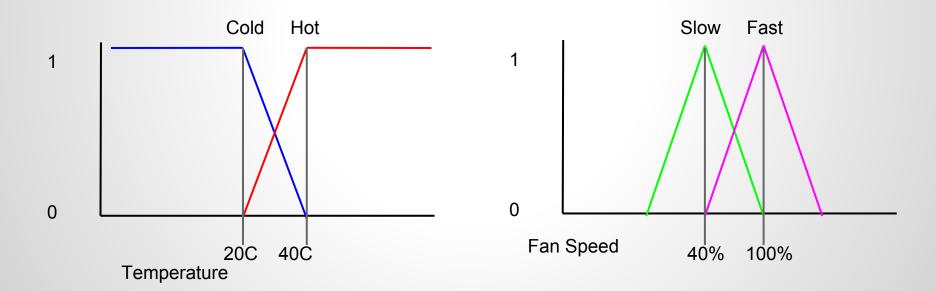
#### **Fuzzification**

- Crisp inputs need to be fuzzified
- Fuzzy outputs need to be defuzzified

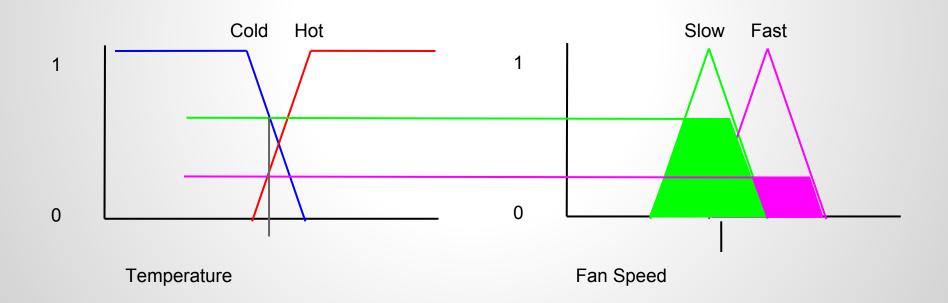
If (temperature is "hot") Then (fan is fast)



If (temperature is "hot") Then (fan is fast)
If (temperature is "cold") Then (fan is slow)



#### Temperature = 26C



# **Triangle Membership Function**

- Easy to use
- Only one dimension

triangle(x, a, b, c) = 
$$\begin{cases} 0, x \le a \\ \frac{x-a}{b-a}, a \le x \le b \\ \frac{c-x}{c-b}, b \le x \le c \\ 0, c \le x \end{cases}$$

#### Membership grades

#### Cold:

- $\circ$  For 20 < t < 40 m(t) = (40-t)/(40-20)
- $\circ$  t = 24 m(t) = .7

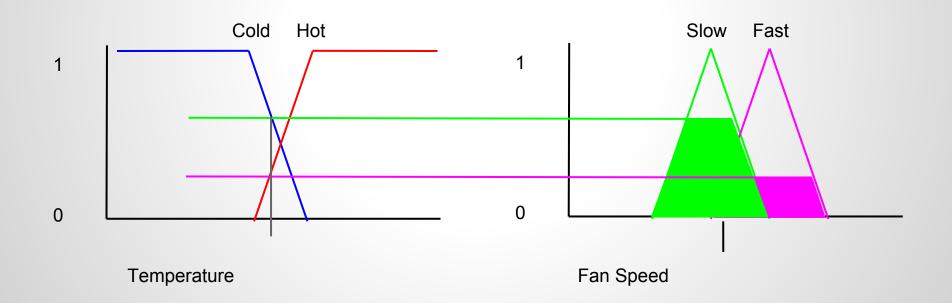
#### Hot:

- $\circ$  For 20 < t < 40 m(t) = (t 20)/(40-20)
- $\circ$  t = 24 m(t) = .3

### Inputs

 As a result of fuzzification our inputs are now cold at .7 and hot at .3

#### Temperature = 26C



#### **Output defuzzification**

- Outputs are taken from inputs
  - Slow is .7
  - Fast is .3
- If we only want one or the other (best fit)
  - Fan speed = max(slow,fast) = slow = 20%
- We can take the fan speed over the interval from 40%-50%
- Fuzzy weighted average
  - $\circ \quad \text{Fan speed} = \left( m_{\text{slow}}^* . 4 + m_{\text{fast}}^* 1 \right) / \left( m_{\text{slow}}^* + m_{\text{fast}}^* \right)$
  - Fan speed = .7 \* .4 + .3 \* 1 = .58 = 58%

#### **Output Defuzzification**

- Centroid or Center of Gravity are commonly used
- Takes the center of the combined area
- Can be estimated by taking an average of points

#### Hedge

- Same calculation but with rule that has hedge
- If (temperature is "very cold") Then (fan is slow)
- For this case very = t 5 (the hedge calculation can vary)

#### Membership grades

- Cold = .7 Hot = 3
- S
- To apply hedge we add 5to t (of course we can also subtract 5 from the intervals)

- For 20 < t + 5 < 40 m(t) = (40-t + 5)/(40-20)
- For t = 26 m(t) = .95

#### **Output with hedge**

Using fuzzy weighted average

• 
$$(m_{off}^*0+m_{slow}^*.4+m_{fast}^*1)/(m_{off}^*+m_{slow}^*+m_{fast}^*)$$

$$\bullet$$
 (.95 \* 0 + .7 \* .4 + .3 \* .1)/(.95 + .7 + .3)

• Fan speed = .30 = 30%

#### Computing with words

Granules

- Propositions
- Example: Mary is young

#### **Process**

- Take Initial Data Set
- Use Fuzzy logic to make inferences
- Terminal Data Set is result

#### **Explanatory Database**

- Maps propositions to Fuzzy variables
- Mary is young
- ED = Population[Name; Age] + Young[Age;μ]
- x = Age POPULATION [Name = Mary]

#### **Constraint Propagation**

- Allows new constraints to be inferred
  - o X is A
  - o X is B
  - o X is A U B

Extends existing information

### **Advantages**

- Simplifies control systems
- Works with imprecise data
- Mesh with reality better

#### **Further work**

- Building rules
- Limited IDS/TDS, ED
- Adding variables increases rules exponentially