# The Artificial Intelligence Toolbox Part II – CS26210

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### Using Qwizdom QVR

On any web-enabled device go to:

http://qvr.qwizdom.com

Select I have a Session Key Enter the code Q5VN94

If you aren't already using AU Eduroam wireless have a look at

http://www.inf.aber.ac.uk/advisory/faq/253/

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Week 1
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7/02 Set Theory, Fuzzy Logic (319) 8/02 Fuzzy Logic (B20) - Hand-out Assignment 1

Week 2

14/02 Fuzzy Logic - Further Exercises (319)

15/02 Theory of Probability (B20)

Week 3

21/02 Conditional Probability (319)

22/02 Conditional Probability (B20) - Hand-in Assignment 1 (Blackboard)

Week 4

28/02 In Class Test (319) (Set Theory, Prior and Conditional Probability) 1/03 Bayesian Networks (B20)

## 28/02 Bayesian Networks (319) 1/03 In Class Test (B20)

Week 5

7/03 Bayesian networks (319) - Hand-out Assignment 2 8/03 Discussion, further exercises (B20)

22/03 Hand-in Assignment 2 (Blackboard)

### Thursday 7<sup>th</sup> February, 2013

- Set Theory
- Fuzzy Logic and Fuzzy Sets (graphical and vector) representation
- Crisp Sets
- Membership values and membership functions

## Friday 8<sup>th</sup> February 2013

- Hedges
- Fuzzy Operators
- Fuzzy Inference
  - Fuzzification of input
  - Rules
  - Defuzzification

## Thursday 14<sup>th</sup> February, 2013

Today we do two exercises on Fuzzy Systems

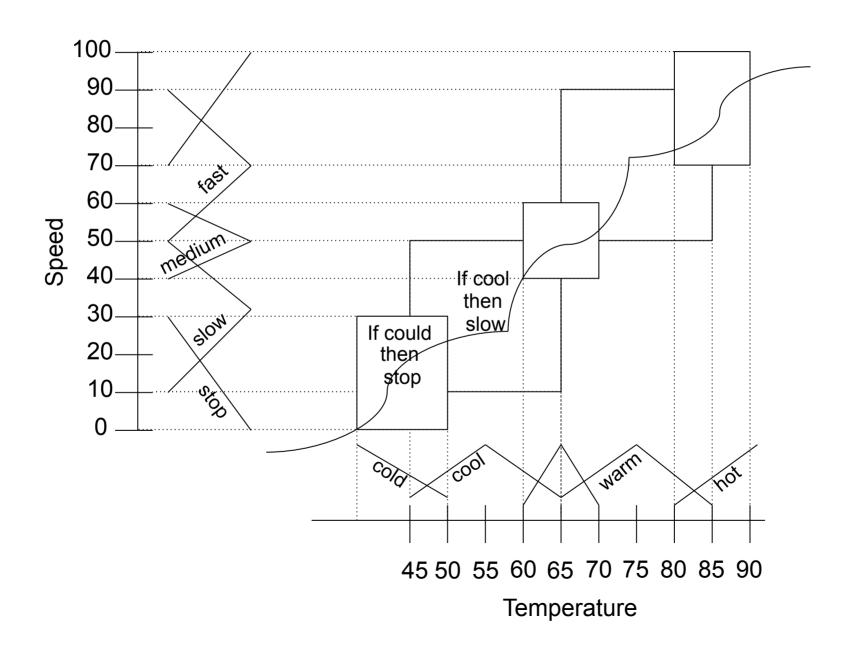
#### -Assignment 1

- PDF only.
- Please, your name only on page 1 of the assignment, or no name at all.
- . Questions?

# Fuzzy logic is used in the operation or programming of:

- Air conditioners
- Automobile and such vehicle subsystems as automatic transmissions, ABS, etc.
- Tokyo monorail
- Cameras
- Digital image processing, such as edge detection
- Elevators
- Some microcontrollers and microprocessors (e.g. Freescale 68HC12)
- Hydrometeor classification algorithms for polarimetric weather radar
- Language filters on message boards and chat rooms for filtering out offensive text
- The Massive engine used in the Lord of the Rings films, which allowed large-scale armies to enact random yet orderly movements
- Mineral Deposit estimation
- Pattern recognition in Remote Sensing
- Video game artificial intelligence
- Home appliances (e.g. washing machine, dishwashers, rice cookers)

### Non-linearity



# Building a Fuzzy Logic Expert System

- Define the problem
- Define the linguistic variables
- Define the fuzzy sets (or linguistic values)
- Define the fuzzy rules (IF ...AND/OR ... THEN)
- Building the system
- Test and Tune the system

#### To remember

```
Intersection (AND) - f_{A \wedge B}(x_i) = min (f_A(x_i), f_B(x_i))

Union (OR) - f_{A \vee B}(x_i) = max (f_A(x_i), f_B(x_i))

Complementation (NOT) - f_A(x_i) = 1 - f_A(x_i)
```

Defuzzification Crisp value  $\mathbf{Z} = (\sum \mathbf{y_j} \mathbf{b'_j})/(\sum \mathbf{b'_j})$ 

Compute the degree of risk in issuing a credit card to a customer by a bank:

Rule 1: IF Income is low, THEN Risk is high

Rule 2: IF Income is high, THEN Risk is low

Income and Risk = Linguistic Variables

Low and high = Linguistic values

```
f_{low}(income) = \{1/0, 1/5, 1/10, (2/3)/15, (1/3)/20, 0/25, 0/30, 0/35, 0/40\};
```

 $f_{high}(income) = \{0/0, 0/5, 0/10, 0/15, (1/3)/20, (2/3)/25, 1/30, 1/35, 1/40\};$ 

 $f_{low}(risk) = \{1/0, 1/10, 1/20, 1/30, (2/3)/40, (1/3)/50, 0/60, 0/70, 0/80, 0/90, 0/100\};$ 

 $f_{high}(risk) = \{0/0, 0/10, 0/20, 0/30, 0.25/40, 0.5/50, 0.75/60, 1/70, 1/80, 1/90, 1/100\};$ 

First, draw the membership functions for each linguistic variable in both domains. Then, assuming a customer has an income of 22, answer the following questions:

•What is the membership value of an income 22 that belongs to both the fuzzy set low income and high income?

•What is the membership value of an income 22 that does not belong to the fuzzy set low income?

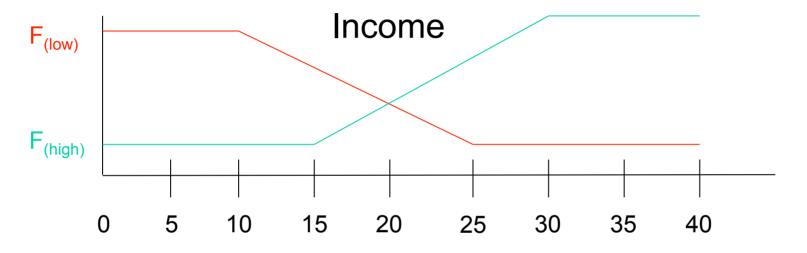
•What risk (%) will the bank take if it issues a credit card to the customer with an income of 22?

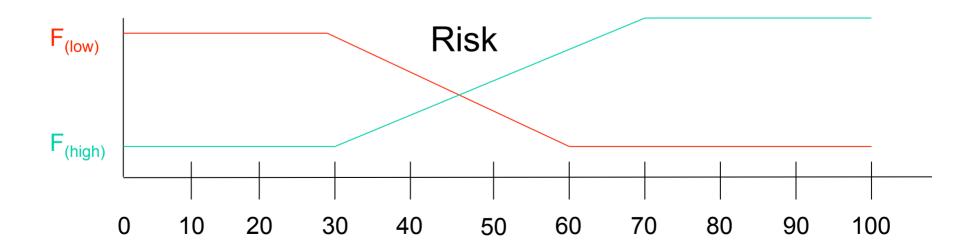
## The membership functions for each linguistic value in both linguistic domains

$$f_{low}(income) \begin{cases} 1 & \text{if } 0 \le x \le 10 \\ -(x-25)/15 & \text{if } 10 < x \le 25 \\ 0 & \text{if } 25 < x \le 40 \end{cases} f_{high}(income) \begin{cases} 0 & \text{if } 0 \le x \le 15 \\ (x-15)/15 & \text{if } 15 < x \le 30 \\ 1 & \text{if } 30 < x \le 40 \end{cases}$$

$$f_{low}(risk) \begin{cases} 1 & \text{if } 0 \le x \le 30 \\ -(x-60)/30 & \text{if } 30 < x \le 60 \\ 0 & \text{if } 60 < x \le 100 \end{cases} \qquad f_{high}(risk) \begin{cases} 0 & \text{if } 0 \le x \le 30 \\ (x-30)/40 & \text{if } 30 < x \le 70 \\ 1 & \text{if } 70 < x \le 100 \end{cases}$$

The membership functions for each linguistic value in both linguistic domains





What is the membership value of an income 22k that belongs to both the fuzzy set low income and high income?

```
f_{low}(income) = \{1/0, 1/5, 1/10, (2/3)/15, (1/3)/20, 0/25, 0/30, 0/35, 0/40\};

f_{high}(income) = \{0/0, 0/5, 0/10, 0/15, (1/3)/20, (2/3)/25, 1/30, 1/35, 1/40\};
```

#### Intersection

 $F_{low-income}$  (22k)  $\cap F_{high-income}$  (22k)

$$F_{low\text{-income}}\left(22k\right) = 0.2$$
 
$$F_{high\text{-income}}\left(22k\right) = 0.46$$
 
$$F_{low\text{-income}}\left(22k\right) \text{ AND } F_{high\text{-income}}\left(22k\right) = 0.2$$

What is the membership value of an income 22k that does not belong to the fuzzy set low income?

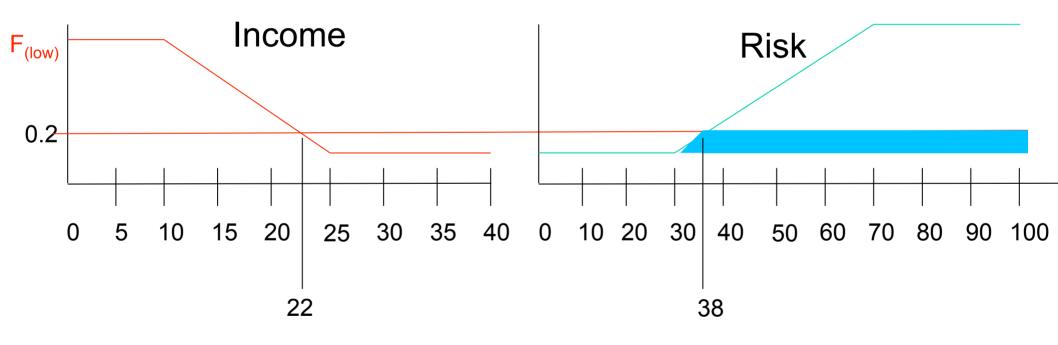
 $f_{low}(income) = \{1/0, 1/5, 1/10, (2/3)/15, (1/3)/20, 0/25, 0/30, 0/35, 0/40\};$ 

Complement (Not)

 $F_{\text{not-low-income}}$  (22k) = 1.0 -  $F_{\text{low-income}}$  (22k) = 1.0 - 0.2 = 0.8

What risk (%) will the bank take if it issues a credit card to the customer with an income of 22k?

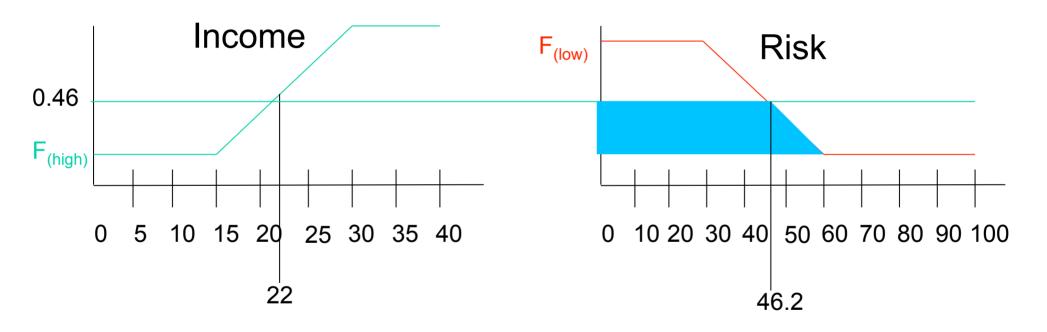
IF income is low, THEN risk is high



IF income is low, THEN risk is high  $B^1 = \{0/30, 0.2/38, 1/100\}$ 

What risk (%) will the bank take if it issues a credit card to the customer with an income of 22k?

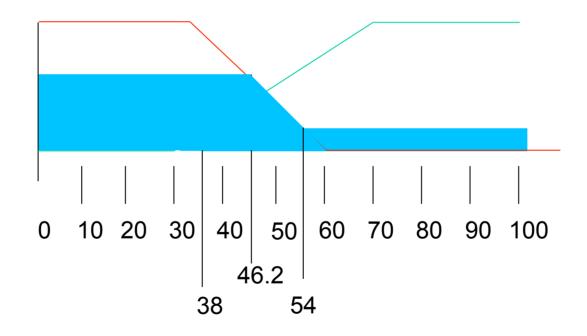
IF income is high, THEN risk is low



F income is high, THEN risk is low  $B^2 = \{1/0, 0.46/46.2, 0/60\}$ 

What risk (%) will the bank take if it issues a credit card to the customer with an income of 22k?

IF income is low, THEN risk is high IF income is high, THEN risk is low



 $B = \{1/0, 0.46/46.2, 0.2/54, 1/100\}$ 

$$B = \{1/0, 0.46/46.2, 0.2/54, 1/100\}$$

Defuzzify (B<sup>3</sup>) = risk;  

$$\mathbf{Z} = (\sum \mathbf{y_j} \mathbf{b_j^1})/(\sum \mathbf{b_j^1}) =$$

$$\frac{1*0 + 0.46*46.2 + 0.2*54 + 1*100}{1+0.46+0.2+1} = 53$$

## Multiple-premises rules Input crisp value

IF X is A AND Y is B THEN Z is C  $x_k$ = single value in A,  $y_i$ = single value in B  $a_i$ =  $f_A(x_k)$   $b_j$ =  $f_A(y_j)$   $A^1$  = { $a_i$ /  $x_k$ },  $B^1$  = { $b_i$ /  $y_i$ }, C = { $c_1$ / $y_1$ ,  $c_1$ / $y_1$ ,  $c_2$ / $y_2$ .....}

| <b>C</b> '                          | Premise Joining | Inference   |
|-------------------------------------|-----------------|-------------|
| $\min(a_{i,}b_{j}) \wedge f_{c}(z)$ | AND             | Max-Min     |
| $\max(a_{i,}b_{j}) \land f_{c}(z)$  | OR              | Max-Min     |
| $\min(a_{i,}b_{j}) \cdot f_{c}(z)$  | AND             | Max-Product |
| $\max(a_{i,}b_{j}) \cdot f_{c}(z)$  | OR              | Max-Product |

## IF walk pace (wp) is fast or not slow, THEN set power supply (ps) to low

#### where:

 $f_{fast}(wp) = \{0/1, 0/2, 0.3/3, 0.6/4 1.0/5\}$   $f_{slow}(wp) = \{1.0/1, 1.0/2, 0.5/3, 0/4 0/5\}$  $f_{low}(ps) = \{1.0/1, 1.0/2, 0/3, 0/4 0/5\}$ 

Suppose that the walking pace is now measured to be:

$$f_{observed} = 3.5$$

Use this measurement and the fuzzy relation produced above to compute a crisp value for the power supply, (ps).

IF walk pace (wp) is fast or not slow, THEN set power supply (ps) to low

$$F_{fast}$$
 (wp) = {0/1, 0/2, 0.3/3, 0.6/4 1/5}  
 $F_{slow}$  (wp) = {1/1, 1/2, 0.5/3, 0/4 0/5}  
 $F_{low}$  (ps) = {1/1, 1/2, 0/3, 0/4 0/5}

$$F_{\text{not-slow}}$$
 (wp) = {0/1, 0/2, 0.5/3, 1/4 1/5}

$$F_{\text{fast or not-slow}}$$
 (wp) = {0/1, 0/2, 0.7/3, 1/4 1/5}