## Intelligent Systems



## An introduction to Fuzzy Systems

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To create Fuzzy Sets using different membership functions

To design Fuzzy Rules Based Systems (FRBS)

To apply Fuzzy Operators

To know different approaches to Infer and Defuzzify FRBS

To implement FRBS





### **1. Basic definitions**





#### What's the meaning of ...

## Crisp

■ firm, dry ...

Crisp potato chips

 briskly decisive... without hesitation or unnecessary detail
Her answer was crisp

clearly defined, clear, sharp
How to get crisp images







#### What's the meaning of ...

## **Fuzzy**

Difficult to perceive the picture is very fuzzy

Indistinct or vague that fuzzy line between right and wrong











I have just a vague and \_\_\_\_\_\_ idea of the world of finance.

He wrote short questions at hand.

letters with a decisive position on all

Getting clean and \_\_\_\_\_ difficult goal.

images from old pictures can be a

I don't keep too many memories of this, just a <u>recollection</u> of past events.

You can try denoising tecnhiques to improve that

image.





I have just a vague and **fuzzy** idea of the world of finance.

He wrote short **Crisp** letters with a decisive position on all questions at hand.

Getting clean and **Crisp** images from old pictures can be a difficult goal.

I don't keep too many memories of this, just a **fuzzy** recollection of past events.

You can try denoising tecnhiques to improve that **fuzzy** image.



## 2. Crisp and Fuzzy Sets











UCA Universidad

■ When is an egg considered large?

an element can belong to a unique set

## 





When is an egg considered large?

## **Membership degrees**











Fuzzy logic uses

- Fuzzy sets: Large, Small, Medium, More, Less,
- Fuzzy rules: IF ... THEN ...

to model the world and make decisions about it



![](_page_17_Picture_0.jpeg)

## **3.** The egg boiling robot

![](_page_17_Picture_2.jpeg)

![](_page_17_Picture_3.jpeg)

An Egg-Boiling Fuzzy Logic Robot https://www.youtube.com/watch?v=J\_Q5X0nTmrA

Watch the video and pay attention to:

1. Which is the **crisp process**?

2. Three main steps to design a Fuzzy System

3.	Which are <b>the fuzzy rules</b> :		
	IF the egg size is		
	THEN boil the egg for	5 minutes	
	IF the egg size is	_	
	THEN boil the egg for	5 minutes	

![](_page_18_Picture_5.jpeg)

![](_page_18_Picture_6.jpeg)

An Egg-Boiling Fuzzy Logic Robot https://www.youtube.com/watch?v=J\_Q5X0nTmrA

Watch the video and pay attention to:

1. Which is the **crisp process**?

Boil the egg for 5 minutes

Fuzzification
Three main steps to design a Fuzzy System 2. Inference

3. Which are **the fuzzy rules**:

![](_page_19_Figure_6.jpeg)

![](_page_19_Picture_7.jpeg)

![](_page_19_Picture_8.jpeg)

3. Defuzzification

![](_page_19_Picture_9.jpeg)

![](_page_20_Picture_0.jpeg)

**THEN** boil the egg for **LESS than 5 minutes** 

IF the egg size is LARGE
THEN boil the egg for MORE than 5 minutes

#### **1. Fuzzification**

![](_page_21_Picture_1.jpeg)

![](_page_21_Figure_2.jpeg)

#### **1. Fuzzification**

![](_page_22_Picture_1.jpeg)

![](_page_22_Figure_2.jpeg)

#### **More Examples**

![](_page_23_Picture_1.jpeg)

- With information about how good your service was at a restaurant, a fuzzy logic system can tell you what the tip should be: Good service, bad service, Rancid food, Good food, Bad food, etc.
- With your specification of how hot you want the water, a fuzzy logic system can adjust the hot water valve to the right setting.
- With information about how far away the subject of your photograph is, a fuzzy logic system can focus the lens for you.
- With information about how fast the car is going and how hard the motor is working, a fuzzy logic system can shift gears for you.

![](_page_24_Picture_0.jpeg)

# 4. How to determine membership degrees?

![](_page_24_Figure_2.jpeg)

![](_page_25_Picture_0.jpeg)

Membership degrees

![](_page_25_Picture_2.jpeg)

![](_page_26_Picture_0.jpeg)

### To which degree is the egg large?

![](_page_26_Figure_2.jpeg)

![](_page_27_Picture_0.jpeg)

#### To which degree is the egg large?

![](_page_27_Figure_2.jpeg)

![](_page_28_Picture_0.jpeg)

![](_page_28_Picture_1.jpeg)

Given a fuzzy set **A** it can be represented by :

**A set of pairs of values**  $\mu(x)/x$ 

Membership degree / element of X (Universe of Discourse)

$$A = \left\{ \int \frac{\mu_A(X_i)}{X_i} \right\}$$

E.g. the set of weight values to describe the concept SMALL egg: *A<sub>SMALL</sub>={ 0/40, 0.25/45, 0.5/50, 1/55 }* 

![](_page_28_Figure_7.jpeg)

#### **Membership functions**

![](_page_29_Picture_1.jpeg)

A membership function for a fuzzy set A on the universe of discourse X is defined as:

$$\mu_A: X \rightarrow \{0,1\}$$

where each element of X is mapped to a value between 0 and 1

$$\mu_{Large}(x) \begin{cases} 0, & x \le 40 \\ \frac{x - 40}{55 - 40} & x \in (40, 55) \\ 1 & x > 55 \end{cases}$$

Universe of Discourse X  $X \in [40-70]$  grams

#### **Typical Membership Functions**

![](_page_30_Picture_1.jpeg)

![](_page_30_Figure_2.jpeg)

![](_page_30_Figure_3.jpeg)

![](_page_30_Figure_4.jpeg)

![](_page_30_Figure_5.jpeg)

#### **ACTIVITY: Determining fuzzy membership functions**

![](_page_31_Picture_1.jpeg)

## Each group consists of a membership function, an equation and an example with a linguistic tag

- (Individually) Read the given text
- (All the students) Talk to your classmates in order to form the most suitable group, according to the piece of a real world problem you have
- (In groups of three) Together you must propose another linguistic tag related to the same variable and fill in the fuzzy form, as in the given example

![](_page_32_Picture_0.jpeg)

![](_page_32_Picture_1.jpeg)

- Student 1 has the following text: An egg is considered large when it weights is ....
- Student 2 has a ramp function plot
- Student 3 has the ramp function equation

Together they complete the fuzzy form ...

- FUZZY VARIABLE: Egg Size
- Linguistic Tag name: Large
- Universe of Discourse: **40-70 grams**
- Membership Function: Ramp (plot and write the equation of this function for this specific tag)

#### **MEMBERSHIP FUNCTIONS (MF)**

![](_page_33_Picture_1.jpeg)

- One of the key issues in all fuzzy sets is how to determine fuzzy membership functions.
- The membership function fully defines the fuzzy set.
- A membership function provides a measure of the degree of similarity of an element to a fuzzy set.
- Membership functions can take any form, but there are some common examples that appear in real applications.
- Membership functions can
  - either be chosen by the user arbitrarily, based on the user's experience (MF chosen by two users could be different depending upon their experiences, perspectives, etc.)
  - Or be designed using machine learning methods (e.g., artificial neural networks, genetic algorithms, etc.)

![](_page_34_Picture_0.jpeg)

![](_page_34_Figure_1.jpeg)

![](_page_34_Figure_2.jpeg)

Illumination in a classroom, is confortable between a range of values between 450-550 lux (lumens/m<sup>2</sup>) Temperature of a water system. Taking a shower with warm water between 29 ° C to 37 ° C, it is nice and does not cause skin damage.

#### **Solutions**

![](_page_35_Picture_1.jpeg)

![](_page_35_Figure_2.jpeg)

$$\mu_A(x) = \begin{cases} 0 & x \leq a \\ \frac{x-a}{m-a} & x \in (a,m] \\ \frac{b-x}{b-m} & x \in (m,b) \\ 0 & x \geq b \end{cases}$$

The commonly accepted average core body temperature (taken internally) is 37.0 °C.

![](_page_35_Figure_5.jpeg)

 $\mu_A(x) = \begin{cases} 0 & x \le a \\ \frac{x-a}{b-a} & x \in (a,b) \\ 1 & x \ge b \end{cases}$  The physical state of water, water vapor (or steam) is the gas phase of water, which is reached at 100°C, when it can change its state from liquid to gas state.

![](_page_36_Picture_0.jpeg)

### 5. Summarizing ...

![](_page_37_Picture_0.jpeg)

### F\_\_\_\_\_ Fuzzification

#### the process of determining grades of membership for linguistic terms of fuzzy sets

![](_page_38_Picture_0.jpeg)

#### (FIS): \_ u \_ \_ \_ I \_ \_ \_ \_ S\_\_\_\_ (FIS): Fuzzy Inference System

## a system that uses fuzzy set theory to map inputs to outputs

![](_page_39_Picture_0.jpeg)

### \_\_\_Z\_ \_\_L\_\_ Fuzzy Rules

#### a collection of linguistic statements that describe how the FIS should make a decision

![](_page_40_Picture_0.jpeg)

## \_\_\_b\_\_\_p \_\_\_t\_\_

#### Membership Function

## provides a measure of the degree of similarity of an element to a fuzzy set

![](_page_41_Picture_0.jpeg)

![](_page_41_Picture_1.jpeg)

Work in groups:

Design a Fuzzy Inference System to tip in a restaurant

With information about how good your <u>service</u> and the <u>food</u> is at a restaurant, a fuzzy logic system can tell you <u>what</u> <u>the tip</u> should be: cheap, average, generous

![](_page_41_Figure_5.jpeg)

![](_page_42_Picture_1.jpeg)

#### how to calculate the perfect tip!

## Inference and Defuzzification

	BILL		SERVICE SPLIT	
	50.00		Terrible	
7	8	9	Poor	
	-		ОК	
4	5	•	Good	
1	2	3	Great	
0		DEL	Excellent	
Round UP Round DN				
TIP = <b>7.50</b>				
101AL = 57.50				

#### References

![](_page_43_Picture_1.jpeg)

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- Michalewicz, Z. y Fogel D. How to solve it. Modern Heuristics (Springer, 2004)
- Zadeh, L.A. A Fuzzy-Set-Theoretic Interpretation of Linguistic Hedges. J. Of Cybernetics, 2(2), pp. 4-34, 1972.
- Zadeh, L.A. The Concept of Linguistic Variable and its Application to Approximate Reasoning. Information Sciences, 8, pp. 199-249, 1975 (part I), 8, pp. 301-427, 1975 (part II), 9, pp. 43-80, 1976 (part III)

#### Links

![](_page_44_Picture_1.jpeg)

#### Videos

Fuzzy logic an introduction:

https://www.youtube.com/watch?v=P8wY6mi1vV8

The egg boiling robot

https://www.youtube.com/watch?v=J\_Q5X0nTmrA

#### **Other materials:**

<u>http://www.cs.princeton.edu/courses/archive/fall07/cos436/</u> <u>HIDDEN/Knapp/fuzzy004.htm</u>

<u>http://www.dma.fi.upm.es/java/fuzzy/fuzzyinf/motivb\_en.htm</u>

<u>http://www.wolfram.com/products/applications/fuzzylogic/ganda.html#fuzzyset</u>