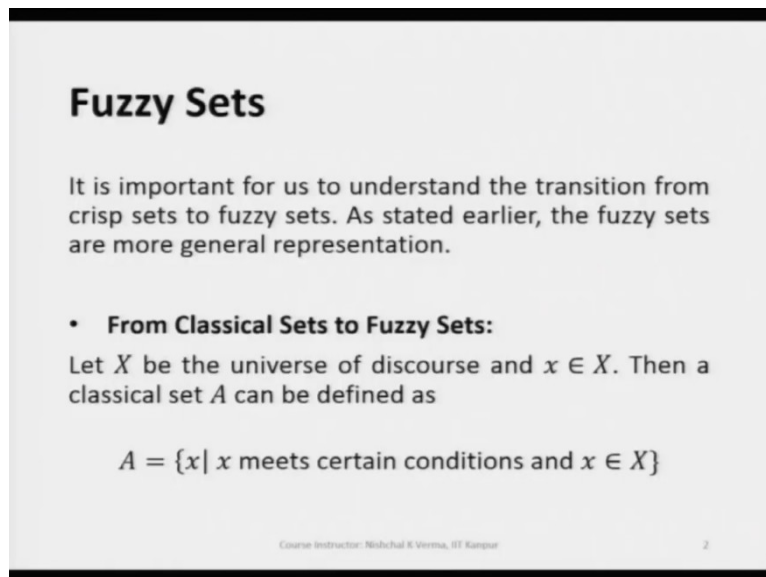


Fuzzy Sets, Logic and Systems & Applications
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Lecture – 03
Fuzzy Sets and Fuzzy Logic Toolbox in MATLAB

Welcome to lecture 3 of the course on Fuzzy Sets, Logic and Systems and Applications. So, in today's lecture we will discuss Fuzzy Sets and logic Fuzzy Logic Toolbox in MATLAB. So, before we discuss fuzzy sets let me introduce classical sets just before going to fuzzy sets, because we need to first understand what is a set, I mean conventional set. And, then we will from the classical sets we will transition to the fuzzy sets and that this is needed for better understanding. So, what is a classical set? Classical set normally is a collection of objects from the universe of discourse.

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Fuzzy Sets

It is important for us to understand the transition from crisp sets to fuzzy sets. As stated earlier, the fuzzy sets are more general representation.

- **From Classical Sets to Fuzzy Sets:**
Let X be the universe of discourse and $x \in X$. Then a classical set A can be defined as

$$A = \{x \mid x \text{ meets certain conditions and } x \in X\}$$

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So, if we take here classical set whose universe of discourse is X . So, let X be the universe of discourse and $x \in X$. So, x , x is an element that belongs to the universe of discourse. Then a classical set A can be defined as A is equal to the collection of all the x 's in the set and the condition here is that the x should meet certain criteria or conditions. And, as I mentioned that this x must be belonging to the universe of discourse.

So, any element which is not belonging to the universe of discourse should not be part of this set. So, here we all know now that conventional set A is the collection of all the elements and

these elements are from, are drawn from the universe of discourse X . So, this kind of collection is termed as a set.

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Fuzzy Sets

$A = \{x \mid x \text{ meets certain conditions and } x \in X\}$

For example, if we write a set of positive integers less than 20 and more than 15 Here the universe of discourse X is set of all positive integers i.e. I^+ and the classical set A is as follows:

$A = \{x \mid 15 < x < 20, x \in X\}$

Hence, the classical set is represented by $A = \{16, 17, 18, 19\}$

If we look at the above classical set A , it is clear that any of the elements in A either completely belongs to A or completely does not belong to A .

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If we take an example here, like if we write a set of positive integers less than 20 and more than 15, so, and the universe of discourse of course, that is X is set of all positive integers that is I^{+} . So, if we are writing a classical set A , so this classical set A will be containing all the elements that satisfies this criteria. So, if we write set A ; set A will be like this. So, A is equal to the set the collection of all the elements that is x which is satisfying this criteria.

What is this criteria? $A = \{x \mid 15 < x < 20, x \in X\}$ So, now, we can write this set as the A which is the name of the set, the classical set as collection of all the elements in between 15 and 20. So, in between 15 and 20 are coming out to be 16, 17, 18, 19 the part of this set and if we look at the set here all the elements here, then we find that these all the elements are drawn from the positive integers, the set of positive integers I^{+} .

So, this way we can say that A is a classical set. Now, here a very important point that we should note is that's the element that are present in the classical set are completely present. What do I mean by completely means 16 is present with 100 percent, 17 is present with 100 percent, 18 is present with 100 percent, 19 is present with 100 percent. So, 16, 17, 18 are completely present in the system. So, the classical set, in classical set if we have the element that present in the classical set they all are present with 100 percent.

Now, if we look at the above classical set, it is clear that any of the elements A are either completely belongs to A , means they are present with the with 100 percent or completely does not belong to A . Means, the elements that are not present in the set, means they are not present in the set with 100 percent, means their percentage is 0. So, any element which is not present in the set, it indicates here, it means here that the element is present with 0 percent, means element is not present.

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Fuzzy Sets

For the same classical set A , in other words we may say that the membership value of any element that belongs to the classical set A is one (True) only. Similarly the elements that do not belong to the classical set A , have their corresponding membership values zero (False). This is because classical sets are based on binary logic i.e. 1 (True) or 0 (False) only and there is no possible case in between for any of the elements contained in classical set A .

Since, fuzzy logic is based on multi-valued logic (i.e. not only the true or false), so every element in a fuzzy set A will be assigned its membership value based on its belongingness (i.e. completely belongs, completely does not belong, or partially belongs). Hence, in fuzzy sets, membership values are associated with every element.

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So, for the same classical set A let us let me make this thing more clear, in other words we make say that the membership value. So, a new term is coming over here is membership value. So, when I was mentioning 100 percent, it means 100 percent is the membership value; means here is that if we have classical set or conventional set, so, this classical set or conventional set, the element that are present they are present with 100 percent membership value.

So, the membership value here, the membership value of 16 is 100 percent; although it is not written, membership value of 17 is 100 percent, membership value of 18 is 100 percent, membership value of 19 is 100 percent. But, all these membership value are not written in the classical set, because it is understood that they are completely present. So now, if we look at this set again, what we see here the elements that do not belong to the classical set A have their corresponding membership value zero.

Of course, because the conventional set is based on the Boolean logic. So, any element which is present will have 100 percent presence or element or any element which is not present will have 100 percent absence. So, if we have any element present in the classical set, we will say that it is true and if the element is not present with 100 percent means the 0 percent it is termed as false. So, there is no possible case in between any of the element.

So, this point is very important to be noted because in classical set either an element in the set is present or it's not present. But, if we talk of fuzzy logic, since fuzzy logic is based on the multi-valued logic; so, the element can be present in the set in fuzzy set with varied membership value. What does this, what does this mean here is, that any element may be present with the membership value more than 0 and less than 1; the elements with this value may be present, but not completely present. Any element which is present with 100 percent membership value is completely present.

So, as I just mentioned that multivalued logic here, with the multivalued logic in fuzzy system; so, here not only the true or false, the, so every element in a fuzzy logic A will be assigned its membership value. So, let me make it very clear that any element, any element which has the membership value more than 0 will be the part of a fuzzy set. And, also if the element is not completely present means if the element has the membership value 0, the element will not be part of the fuzzy set.

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Transition from Classical to Fuzzy Sets

- Transition from a crisp set to fuzzy set can be well understood by the following example.

Example: Write a set of positive integers less than 20 and more than 15 where every positive no. is either completely present or partially present. (Here the universe of discourse X is set of all positive integers i.e. I^+)

Solution: The Fuzzy set A can be written as:
 $A = \{(16, 0.6), (17, 0.9), (18, 0.2), (19, 1.0) | x \in X\}$

- A Fuzzy set A can be written as a set of ordered pairs of the element and its belongingness or membership in the set A.

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So, let us now move to fuzzy set from the classical set and in classical set we do not write any membership value as I mentioned. Because, it is assumed that any element which is present in the classical set it is, it is assumed, it is understood that the element that are in the conventional set, or classical set, or traditional set which is based on the Boolean logic, the elements are with 100 percent membership value.

So, that is why it is not written, but if we talk of fuzzy set here unlike the conventional, traditional fuzzy logic, fuzzy logic, in fuzzy logic the elements that are present in the set they these will have the membership values in between 0, in between 0 plus and 1. So, the elements, these elements will be with the respective membership values. This is needed because, otherwise we may not be knowing with what value, with what degree, with what membership value these elements are present in the sets.

So, here like in the classical set that we have had just before we had 16, so, 16 was 100 percent present, 17 was 100 percent present, 18 was 100 percent present, 19 was 100 percent present. And of course, all these elements were drawn from the universe of discourse. So, here also we will have a universe of discourse and these elements must be from the universe of discourse, some universe of discourse say X. Now, in classical sets these all were present with 100 percent means completely present, but let us assume a case where this 16 is not completely present, I would say partially present. And, if we say partially present means it is, it has some value, it has some membership value less than 1.

So, if it has some membership value less than 1, say 0.6. So, this 0.6 is the membership value of 16. So, this 16 and 0.6 these two are very important for together to be included in the in the set. And, since this is not 100 percent present; so, we need to know with what degree it is present. So, that is why the degree along with that element is needed and that's why if we see in a fuzzy set every element is with some degree. So, every element is paired with some degree and that is how a fuzzy set is formed.

So, if we see here this fuzzy set A, now this is not a crisp set, it is a fuzzy set because the element 16, 17, 18, 19 they all are having some degree associated with these element. So, 16 is with 0.6, 17 is with 0.9, 18 is with 0.2, 19 is with 1. So, if we see here that fuzzy set is the ordered pair of all the elements and this pair is nothing, but the first element of the this pair is the element and the second element of this pair is the membership value. So, 16, 0.6 means that this 16 is present with 0.6 membership value, similarly 17 is present with 0.9

membership value, 18 is present with 0.2 membership value, 19 is present with 1.0 membership value means 100 percent. So, this 19 is completely present, 18 is partially present, 17 is partially present and 16 is also partially present. So, this way fuzzy set is a set which has all the elements with its membership values. So, we can also say the same thing as it is written over here; a fuzzy set A can be written as a set of ordered pairs of the element and its belongingness, and this belongingness is also called as membership. So, this way fuzzy set can be written and this is a transition from the classical set.

In classical set we saw that 16 was 100 percent, 17 was 100 percent, 18 was 100 percent, 19 was 100 percent. So, that is why there was no need to include any membership value along with these elements. So, that is why it was not needed, but here since the since fuzzy set fuzzy logic fuzzy system is based on fuzzy logic which is of course, a multivalued logic and because of that the no matter whether a element an element is present with 100 percent or not, all the element from the universe of discourse must be included in the fuzzy set. So, that is why any element which is present, even if it is not even if it is not present with 100 percent all the element has been included here.

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$A = \{(16, 0.2), (17, 0.1), (18, 0.5), (19, 1.0)\}$
 $A = \frac{0.2}{16} + \frac{0.1}{17} + \frac{0.5}{18} + \frac{1.0}{19}$ $\mu_A(x)$

Fuzzy Set: Representation

- For discrete and finite universe of discourse X , the fuzzy set A is written as below:

$$A = \mu_A(x_1)/x_1 + \mu_A(x_2)/x_2 + \dots = \sum_X \mu_A(x_i)/x_i = \{(x_i, \mu_A(x_i)) \mid x_i \in X\}$$
- where x_1, x_2, \dots are the elements of X .
- For continuous and infinite universe of discourse, the fuzzy set A is written as below:

$$A = \int_X \mu_A(x_i)/x_i$$

Here, the summation and integration signs indicate the collection of all elements x in the universe of discourse X along with their associated membership values $\mu_A(x)$.

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So, this is how we transition from the classical set to a fuzzy set. So, we clearly see there is a need of writing, there is a need of including here the membership value with the elements with element, without that it is difficult for us to write a fuzzy set. So, that is why we include a membership value and the membership value here is represented as μ_A , membership value

of any element is represented by $\mu_A(x)$. So, if we have any element x and the corresponding membership value will be μ_A and this $\mu(x)$ and this A is nothing, but the A signifies the particular the name of the set. So, A is basically a particular set.

So, a fuzzy set in the fuzzy set representation we can write a fuzzy set either in discrete form or in continuous form. So, in discrete form if we write a fuzzy set, this is the way we write like, you see here that same fuzzy set; that we already discussed could be written as if we have let's say are already had fuzzy set A which was like this 16 with 0.2. I have I am taking some other member membership values like let's say 0.2 and then 17 with 0.1 and 18, 0.5 say 19, 1 like this. So, if we have this as a fuzzy set, this is a crude representation of the fuzzy set.

So, the same fuzzy set can be represented as you see first the membership value and then corresponding membership corresponding element and then with plus sign we add, but, please understand that there is there will not be any addition of this ah this values. So, 0.2, 17 and then 0.1, 18 plus 1, 19. So, the same fuzzy set which you see here can be written as $A = \{0.2/16 + 0.1/17 + 0.5/18 + 1.0/19\}$. So, we see that first we write the membership value and then with oblique sign with line, a slanted line we write here the corresponding element.

So, if we have any discrete; so, let me first make it clear that a fuzzy set can be the discrete or a fuzzy set can be continuous. So, if we are writing a discrete fuzzy set, we write the discrete fuzzy set this way as I just mentioned. And, then we see here the, you know the representation wise here the same thing can be written like this, like form in which we write a fuzzy set. So, if we have a fuzzy set A fuzzy set A should be written as like

$$A = \frac{\mu_A(x_1)}{x_1} + \frac{\mu_A(x_2)}{x_2} + \dots$$

, if we have a x_1, x_2, x_3 all these the corresponding generic variable value values drawn from the universe of discourse.

So, this plus sign is very important here because this plus sign this should be noted, it should be noted that this plus sign this plus sign is not here for addition. So, please understand that although we have plus signs here, all the elements are separated by plus sign, but this plus sign is not here for addition. So, please do not add these values with this plus sign, if you add these values together this will be, this will not be a fuzzy set. So, this will become this will be wrong thing. So, please do not add this, these plus signs you leave as it is.

So, this is and please understand this is another way of writing the same thing, you can use

summation also. Like if we do not want to write it like this, $\sum_X \frac{\mu_A(x_i)}{x_i} = \{(x_i, \mu_i(x_i)) \vee x_i \in X\}$.

So, this way the discrete fuzzy set is written, then if we want to write, if we want to represent a continuous fuzzy set. So, a continuous fuzzy set of course, this will be from the infinite universe of discourse.

And, this fuzzy set will be written as you see a fuzzy set A is written as A is equal to we use here instead of this summation sign we use the integration sign.

So, please understand here that this if we have continuous fuzzy set, we use the integration

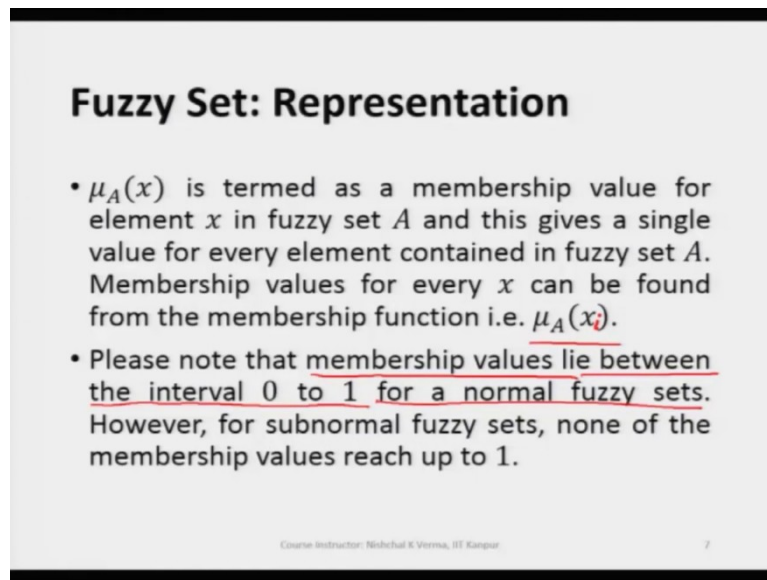
sign. $A = \int_X \mu_A(x_i) / x_i$

And, then with this slanted line we separate and then we write the corresponding generic variable value.

Please understand this $\mu_A(x_i)$ will be continuous function, because if we are writing fuzzy set in a continuous format of course (x_i) will be a continuous function. So, this is this will be a continuous, this corresponding the values here the generic variable values will be (x_i) . So, this way we write continuous fuzzy set in a continuous, in a continuous format. And, as it is written here that summation and integration signs indicate the collection of all the element in the universe of discourse.

So, along with their associated membership values. So, please do not use this summation and integration, so, summation for addition and do not integrate the function that is coming so, but you just leave it leave as it is.

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Fuzzy Set: Representation

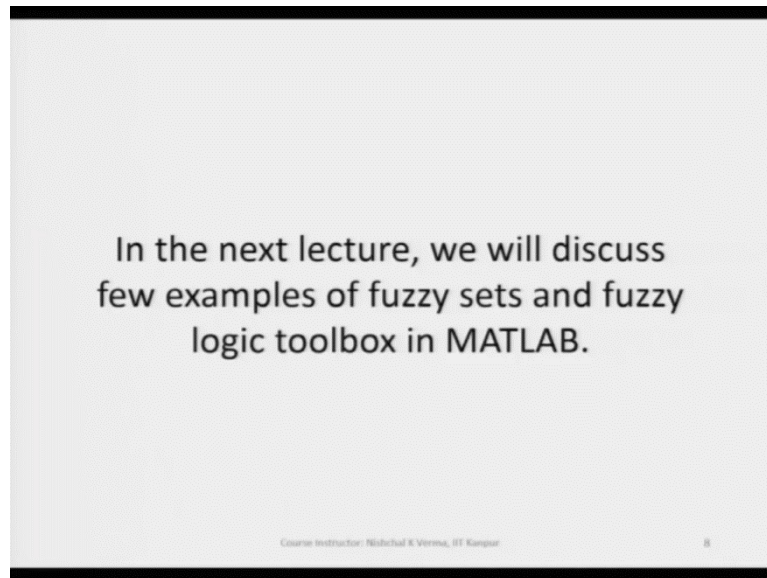
- $\mu_A(x)$ is termed as a membership value for element x in fuzzy set A and this gives a single value for every element contained in fuzzy set A . Membership values for every x can be found from the membership function i.e. $\mu_A(x_i)$.
- Please note that membership values lie between the interval 0 to 1 for a normal fuzzy sets. However, for subnormal fuzzy sets, none of the membership values reach up to 1.

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So, $\mu_A(x)$ as I mentioned $\mu_A(x)$ is nothing, but a membership value. So, $\mu_A(x)$ is termed as the membership value for element x in fuzzy set A and this gives a single value for every element contained in fuzzy set. So, membership value, values for every x can be found from membership function. So, if we have a membership function let us $\mu_A(x_i)$, it should be (x_i) here, it should (x_i) . And, then if it is a corresponding if this is the membership value, membership function and if we want to have a corresponding membership value. If we have a generic variable let us say (x_i) , i^{th} value i of the in the universe of discourse, i^{th} element some element (x_i) . So, corresponding that (x_i) we will have $\mu_A(x_i)$ and then this is a this will be a single value. So, and one more thing that to be noted here is that this membership values will be in between 0 and 1. So, the membership value which is written here, that membership values lie between the interval 0 and 1 for a normal fuzzy sets. So, when we say a normal fuzzy set, it means they it means there may be a fuzzy sets which are not normal.

So, we ah normally call those sets as subnormal fuzzy sets. So, so fuzzy set which has at least one membership value equal to 1 is a normal fuzzy set. But, any fuzzy set which does not have any of the values as equal to any of the membership values equal to 1, it is called subnormal fuzzy sets. So, in other words you can say the subnormal fuzzy sets are those sets whose which does not have any membership value up to 1. So, with this I would like to stop here.

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And, in the next lecture we will be discussing few examples on fuzzy sets and fuzzy logic toolbox in MATLAB will also be discussed.