

Measure and Integration

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Module No. # 03

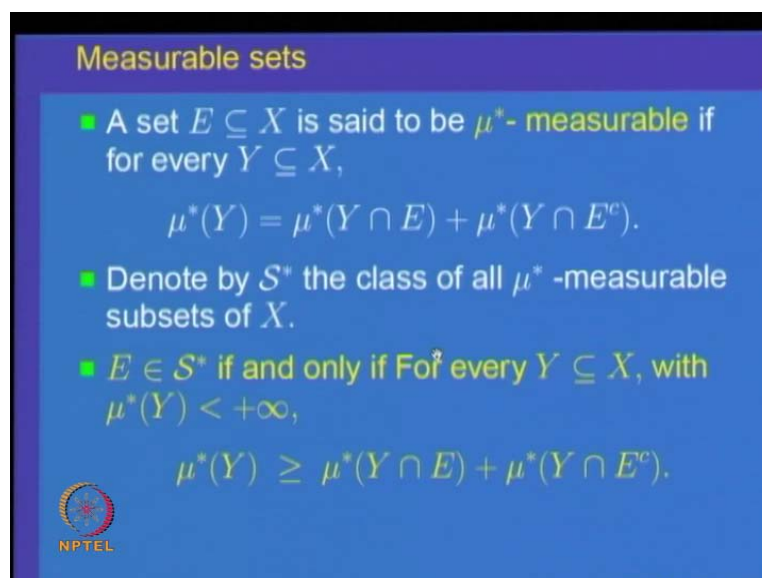
Lecture No. #11

Measurable Sets

Welcome to lecture 11 on Measure and Integration. In the previous lecture, we had defined, what is called an outer measurable subset. We had started looking at the properties of the outer measurable sets.


We will continue the study of properties of the outer measurable sets today and if time permits at the end, we will specialize the case, when the space is in the real line. So, let us recall what we have been doing. So, we were looking at properties of measurable sets. Let us just recall, what is an outer measurable set.

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Measurable sets

- A set $E \subseteq X$ is said to be μ^* -measurable if for every $Y \subseteq X$,
$$\mu^*(Y) = \mu^*(Y \cap E) + \mu^*(Y \cap E^c).$$
- Denote by S^* the class of all μ^* -measurable subsets of X .
- $E \in S^*$ if and only if for every $Y \subseteq X$, with $\mu^*(Y) < +\infty$,
$$\mu^*(Y) \geq \mu^*(Y \cap E) + \mu^*(Y \cap E^c).$$

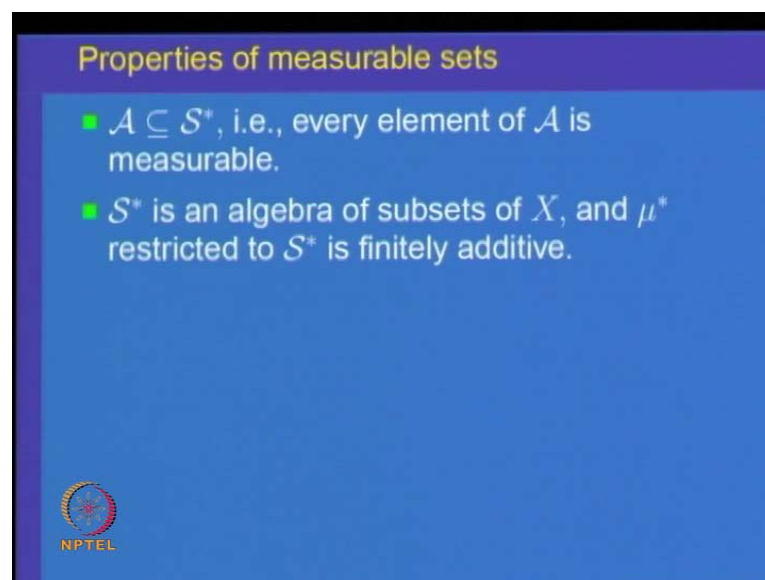
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A subset E of X is said to be an outer measurable or μ^* measurable. If μ^* of any set Y is written, it is written as μ^* of Y intersection E plus μ^* of Y intersection E complement. So this condition must be satisfied for every subset Y of X

and then we said, let us denote by S^* and the class of all μ^* measurable sets. We gave an equivalent way of verifying, when a set is outer measurable. So, the condition is that a set E is measurable, if and only if every subset Y in X with μ^* of Y is finite. We have the condition that μ^* of Y is bigger than or equal to μ^* of $Y \cap E$ plus μ^* of $Y \cap E^c$.

So, instead of just saying that for every subset Y , this equality must be true. We have to only verify for those subsets Y of X for which μ^* of Y is finite. Instead of equality, we have to verify only bigger than or equal to one-way inequality because the other way round is always true for μ^* being countably sub additive.

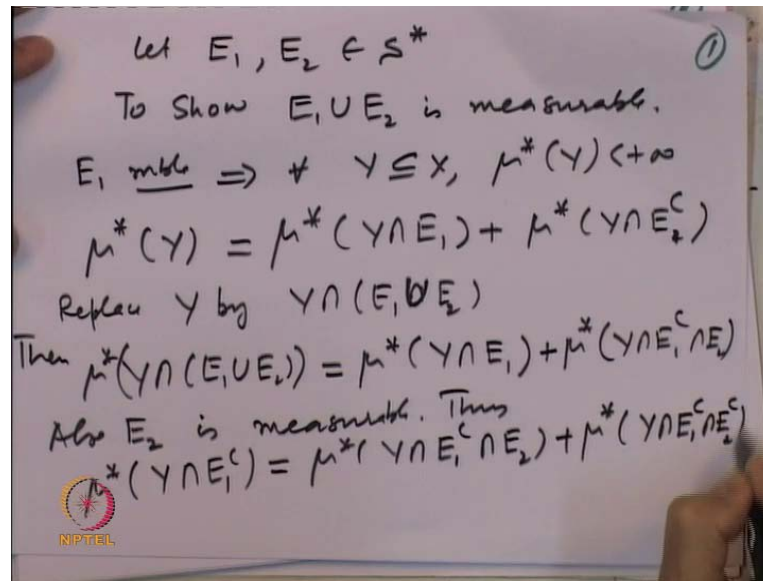
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So, we will use this condition when we require. The first observation that we proved last time was that \mathcal{A} is the given algebra on which the measure is defined. So, the first claim we proved is that every element in the algebra is also a measurable set. So, \mathcal{A} is a subset of \mathcal{S}^* .

The second property, we were looking at was - if \mathcal{S}^* is an algebra of subsets of X and μ^* restricted to \mathcal{S}^* is finitely additive. We had already observed that a set E is measurable, if and only if, its complement is measurable. So, \mathcal{S}^* is closed under complements and we only have to verify that it is closed under unions and **that proof working out in the last time and we had done it**; let us just revise it again because we are going to need those inequalities.

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So, let E_1 and E_2 be measurable sets to show that $E_1 \cup E_2$ is measurable. E_1 is measurable and implies that for every subset Y contained in X . Let us have that special condition less than finite, we know that μ^* of Y is equal to μ^* of $Y \cap E_1$ plus μ^* of $Y \cap E_2^c$, sorry E_1 complement. This is true for every subset Y with that property. Let us replace, Y by $Y \cap (E_1 \cup E_2)$.

So, replace this Y so then we get so then what we have we have μ^* of $Y \cap (E_1 \cup E_2)$ is equal to $\mu^*(Y \cap E_1) + \mu^*(Y \cap E_1^c \cap E_2)$ so, Y is replaced by $Y \cap (E_1 \cup E_2)$, but E_1 is a subset of it. So, the first term is just μ^* of $Y \cap E_1$ plus the second term becomes μ^* of $(E_1 \cup E_2) \cap E_1^c$. So, first term will give you only empty set, union $Y \cap E_2 \cap E_1^c$. So, E_1 complement intersection E_2 and that is what we get by using the fact, E_1 is measurable and E_2 is also measurable. Thus, for every set Y , a corresponding equation holds for E_2 complement, but we will replace Y by $Y \cap E_1$.

So, μ^* of $Y \cap E_1^c$ is equal to $\mu^*(Y \cap E_1^c \cap E_2) + \mu^*(Y \cap E_1^c \cap E_2^c)$. So, using the fact that E_2 is measurable, we have written μ^* of $Y \cap E_1^c$ as the set intersection E_2 the set intersection E_2^c . Now, in these two equations, (Refer Slide Time: 06:14) look at this set this term $Y \cap E_1$

complement intersection E_2 and that is also sitting here. So, we will compute the value of this and put it to that equation. So, let us do that.

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Thus

$$\mu^*(Y \cap (E_1 \cup E_2)) = \mu^*(Y \cap E_1) + \mu^*(Y \cap E_1^c) - \mu^*(Y \cap E_1^c \cap E_2^c)$$

$$\Rightarrow \mu^*(Y \cap (E_1 \cup E_2)) + \mu^*(Y \cap E_1^c \cap E_2^c) = \mu^*(Y \cap E_1) + \mu^*(Y \cap E_1^c)$$

$$= \mu^*(Y)$$

$\Rightarrow E_1 \cup E_2$ is measurable.

$\nexists E_1, E_2$ are disjoint $\Rightarrow E_2 \subseteq E_1^c$

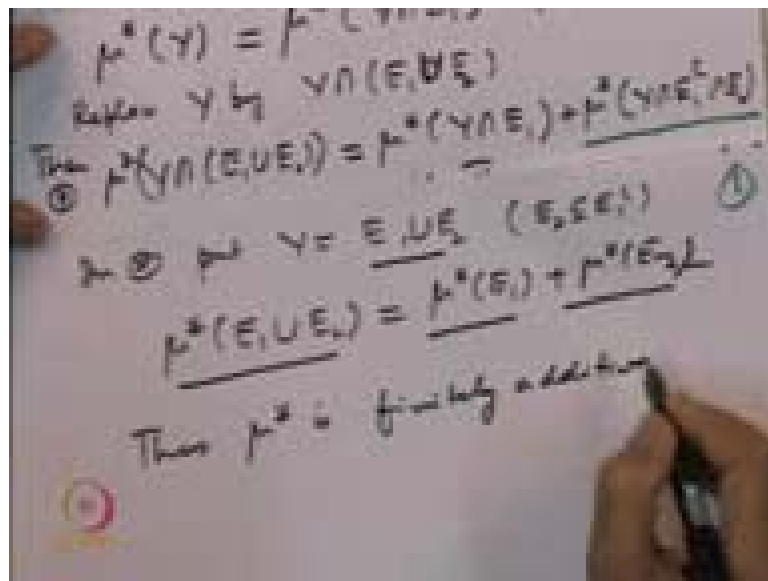
From this second equation, we put the value there and so we have got from these two equations (Refer Slide Time: 06:34). Thus, μ^* of $Y \cap (E_1 \cup E_2)$ that is the left hand side of this equation. so that is equal to the first term, μ^* of $Y \cap E_1$ plus μ^* of $Y \cap E_1^c \cap E_2^c$ is equal to μ^* of $Y \cap E_1$ minus that thing (Refer Slide Time: 07:04). So, μ^* of $Y \cap E_1^c \cap E_2^c$ minus μ^* of $Y \cap E_1^c \cap E_2^c$. Now, one should note down here - we have taken one term on the other side. So, this is possible because all the sets involved have finite outer measure and this is the equation of real numbers.

So, we can take one term on the other side and in general that will not be possible, if Y , one of the terms is equal to plus infinity. So, the condition μ^* of Y is finite is being used here. So, we get using the fact that E_1 and E_2 are measurable and we get this equation (Refer Slide Time: 07:53). From here, let us take this negative term on the other side and that implies μ^* of $Y \cap (E_1 \cup E_2)$ plus μ^* of $Y \cap E_1^c \cap E_2^c$ is equal to μ^* of $Y \cap E_1$ plus μ^* of $Y \cap E_1^c \cap E_2^c$ plus μ^* of $Y \cap E_1^c \cap E_2^c$. Now, using the fact that E_1 is measurable and this is same as μ^* of Y . so, we have shown

that for every subset Y with μ^* of Y finite. It's measure μ^* of Y can be written as μ^* of $E_1 \cap Y$ plus μ^* of $(E_1^c \cap Y)$ but note this set is nothing but $E_1 \cup E_2$ complement. So, this implies that $E_1 \cup E_2$ is measurable. Now, for the special case, if E_1 and E_2 are disjoint, it means $E_1 \cap E_2$ is empty set and that implies that E_1 is contained in E_2 complement or E_2 is contained in E_1 complement, either one is true. So, note this is true (Refer Slide Time: 09:53). In that case, let us go back and look at the first equation because E_1 and E_2 were measurable.

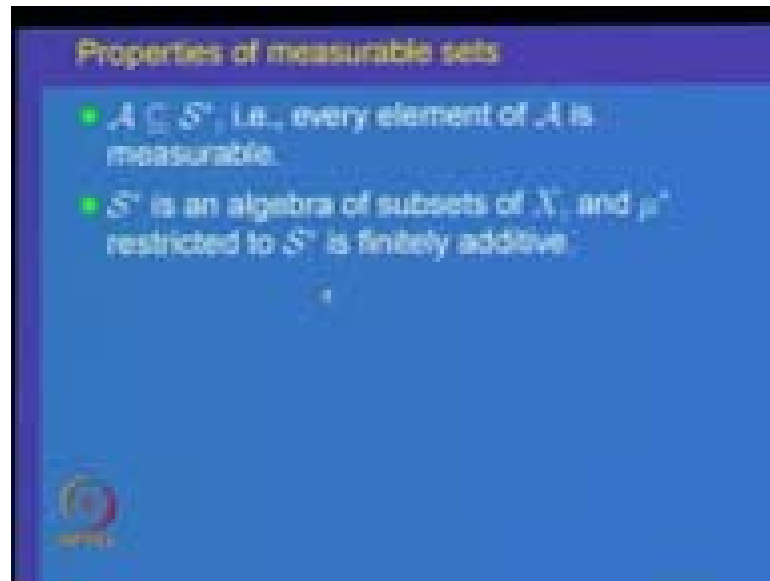
So, we had this condition. So, in this equation (Refer Slide Time: 09:58), this is true for every Y . So, let us replace this Y by $E_1 \cup E_2$ and that will give us the measure, μ^* of union of $E_1 \cup E_2$. So, in this we are going to replace Y by $E_1 \cup E_2$.

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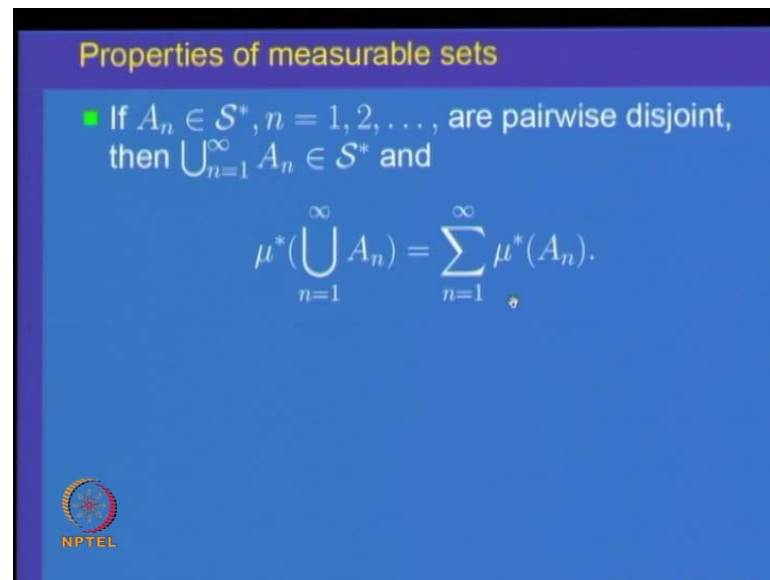
So, let us just put that equation here and look at what we are doing. So, in this equation, in the star we are putting Y equal to $E_1 \cup E_2$ and keep in mind they are disjoint. So, the left hand side will be μ^* of $E_1 \cup E_2$ equal to right hand side. The first term is μ^* of E_1 plus and in the second term; E_2 is a subset of E_1 complement because E_1 and E_2 are disjoint. This implies E_2 is a subset of E_1 complement. So, that means this is nothing but, plus μ^* of E_2 plus μ^* of E_2 . So, when E_1 and E_2 are disjoint, μ^* of $E_1 \cup E_2$ is μ^* of E_1 plus μ^* of E_2 . Thus, it means μ^* is finitely additive.

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So, we have proved this property, namely: \mathcal{S}^* is an algebra of subsets of X and μ^* restricted to \mathcal{S}^* is finitely additive. Next step is to go a bit further.

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We want to prove that whenever you got a sequence of sets in \mathcal{S}^* , which are pairwise disjoint, then their union is also in \mathcal{S}^* . μ^* of the union is equal to summation of μ^* of A_n . That means, we are going to show that \mathcal{S}^* is closed under pairwise disjoint union of sets in even countably infinite and μ^* is countably additive.

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$A_n \in \mathcal{S}^*, n=1,2,\dots$
 pairwise disjoint, $A_n \cap A_m = \emptyset$
 for $n \neq m$.

$A_1 \in \mathcal{S}^*, Y \subseteq X$
 $\Rightarrow \mu^*(Y) = \mu^*(Y \cap A_1) + \mu^*(Y \cap A_1^c)$
 $= \mu^*(Y \cap A_1) + \mu^*(Y \cap A_1^c \cap A_2)$
 $+ \mu^*(Y \cap A_1^c \cap A_2^c)$
 $= \mu^*(Y \cap A_1) + \mu^*(Y \cap A_2) + \mu^*(Y \cap A_1^c \cap A_2^c)$
 \dots
 $= \sum_{i=1}^n \mu^*(Y \cap A_i) + \mu^*(Y \cap A_1^c \cap \dots \cap A_n^c)$

So, let us prove this property. Let us take A_n belong to \mathcal{S} star n equal to 1, 2 and so on. Pairwise disjoint, that is, A_n intersection A_m is empty for n , not equal to m . so, we start A_1 belonging to \mathcal{S} star. A_1 measurable implies that μ star of any set Y can be for every Y contained in X . I can write this to be equal to μ star of Y intersection A_1 plus μ star of Y intersection A_1 compliment.

Now, use the fact that A_2 is measurable. So, leave the first term as it is Y intersection A_1 plus A_2 is measurable. So, measure of μ star of this set can be written as μ star of A_1 compliment intersection A_2 plus μ star of Y intersection A_1 compliment intersection A_2 compliment. So, this term μ star of Y intersection A_1 compliment is written as μ star of Y intersection A_1 compliment plus intersection A_2 plus μ star of Y intersection A_1 compliment intersection A_2 compliment. So, here we have used the fact that A_2 is measurable. Now, observe that A_1 and A_2 are disjoint. So, A_2 will be a subset of A_1 compliment and this set is nothing but, Y intersection A_2 . So, I get the first term same as μ star of Y intersection A_1 . The second term is μ star of Y intersection A_2 . The third term is μ star of Y intersection A_1 compliment intersection A_2 compliment. So, in the first, we used A_1 is measurable. In the second, we used A_2 is measurable and used A_1 and A_2 are disjoint. If we continue this process, after n steps we will have this is (Refer Slide Time: 15:01) equal to \dots The second step gives you, μ star Y intersection A_1 plus μ star of Y intersection A_2 . So, after n steps this will have μ star of Y intersection A_i

i equal to 1 to n plus one term will be there, which is μ^* of Y intersection A_1 complement intersection up to A_n complement.

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$$\begin{aligned} \mu^*(Y) &= \sum_{i=1}^n \mu^*(Y \cap A_i) + \mu^*(Y \cap (\bigcup_{i=1}^n A_i)^c) \quad (5) \\ &\geq \sum_{i=1}^n \mu^*(Y \cap A_i) + \mu^*(Y \cap (\bigcup_{i=1}^n A_i)^c) \\ &\geq \sum_{i=1}^{\infty} \mu^*(Y \cap A_i) + \mu^*(Y \cap (\bigcup_{i=1}^{\infty} A_i)^c) \\ &\geq \mu^*(Y \cap (\bigcup_{i=1}^{\infty} A_i)) + \mu^*(Y \cap (\bigcup_{i=1}^{\infty} A_i)^c) \\ &\Rightarrow \bigcup_{i=1}^{\infty} A_i \in \mathcal{S}^* \end{aligned}$$

So, let us write this last term in terms of union. It is equal to summation of i equal to 1 to n μ^* of Y intersection A_i plus μ^* of Y intersection union A_i i equal to 1 to n compliments. So, this term is represented in terms of compliments of the unions. So, this is after n steps. For every n , we have got μ^* of Y can be written as this (Refer Slide Time: 16:07) and now, it is true for every n . Here, I would like to write this union as 1 to infinity, if I do that, I will be make this set bigger.

Hence, the compliments will be a smaller set. So, if I replace this by Y intersection union i equal to 1 to infinity of A_i complement. This set is smaller than this set (Refer Slide Time: 16:40). So, μ^* of this will be bigger than μ^* of this. So, if I write μ^* , then this term is bigger than this term. So, this will be bigger than or equal to summation i equal to 1 to n and this term as it is. Y intersection A_i plus this (Refer Slide Time: 17:01). So, what we have done in the second term, where it has union 1 to n . I have taken union 1 to infinity and because of compliments this term will be smaller. So, instead of equality, I have got the inequality and this happens for every n . So, I can let n go to infinity and this will be bigger than or equal to summation i equal to 1 to infinity μ^* of Y intersection A_i plus μ^* of Y intersection union i equal to 1 to infinity A_i compliments. Now, μ^* is countably sub additive.

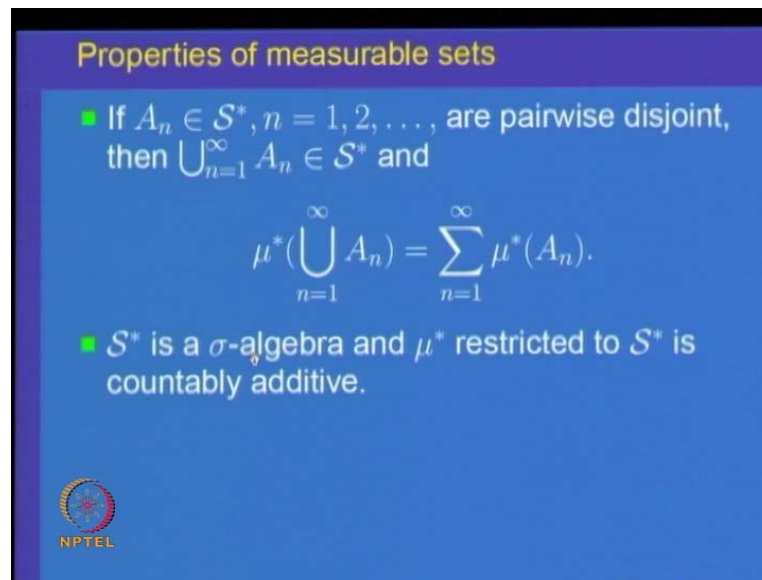
So, the first term is bigger than or equal to mu star of Y intersection union A_i i equal to 1 to infinity. Second term, as it is mu star of Y intersection union 1 to infinity A_i's compliment. So, using the fact that for every n, A_n is a measurable set. We are able to say that mu star of Y is bigger than or equal to mu star of Y intersection the union A_i's plus mu star of Y intersection, the compliment of the unions. So, that implies that unions A_i 1 to infinity belongs to S star is a measurable set and not only that, we can say something more. So, in this equation star, let us put Y is equal to union of A_i's. So, what will we get?

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The image shows a handwritten derivation on a whiteboard. At the top, there is an inequality: $\mu^*(Y) \geq \sum_{i=1}^{\infty} \mu^*(Y \cap A_i) + \mu^*(Y \cap (\bigcup_{i=1}^{\infty} A_i)^c)$. Below this, it says "In (*) put $Y = \bigcup_{i=1}^{\infty} A_i$ ". This leads to two inequalities: $\mu^*(\bigcup_{i=1}^{\infty} A_i) \geq \sum_{i=1}^{\infty} \mu^*(A_i) + 0$ and $\mu^*(\bigcup_{i=1}^{\infty} A_i) \leq \sum_{i=1}^{\infty} \mu^*(A_i)$. The final conclusion is $\Rightarrow \mu^*$ is countably additive on S^* . A NIPTEEL logo is visible in the bottom left corner of the whiteboard image.

Let us do that substitution and see, what we get. So, in this equation; in star, take Y equal to union of A_i's. Then left hand side is mu star of union A_i 1 to infinity is bigger than or equal to summation i equal to 1 to infinity mu star of Y is union A_i plus this is union and compliment and that is empty set, mu star of that is equal to 0. So, that is equal to 0. So, what we get is- mu star of the union of A_i's is bigger than or equal this, by sub additivity. Mu star of the union A_i's is less than or equal to summation 1 to infinity mu star of A_i's. So, it implies that mu star is countably additive on S star.

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Properties of measurable sets

- If $A_n \in \mathcal{S}^*$, $n = 1, 2, \dots$, are pairwise disjoint, then $\bigcup_{n=1}^{\infty} A_n \in \mathcal{S}^*$ and

$$\mu^*\left(\bigcup_{n=1}^{\infty} A_n\right) = \sum_{n=1}^{\infty} \mu^*(A_n).$$

- \mathcal{S}^* is a σ -algebra and μ^* restricted to \mathcal{S}^* is countably additive.




We have got the following property and what we have done till now is- \mathcal{S}^* , as a consequence of all these properties, we can say that \mathcal{S}^* is a class of all measurable sets is a sigma algebra of subsets of X and μ^* on this is countably additive. So, we started with a measure μ on an algebra \mathcal{A} of subsets of a set X . We defined an outer measure via this on all subsets of X . Then, we picked up a subclass namely: \mathcal{S}^* of sets, which are μ^* measurable. We have shown that μ^* , which in general is countably sub additive is actually countably additive on \mathcal{S}^* , the sigma algebra of measurable sets.

Why it is a sigma algebra? Because we already shown it is an algebra and it is closed under countable disjoint unions. So, any algebra, which is closed under countable disjoint unions is automatically a sigma algebra and we have shown this. It gives us a way of defining measures on ascending measures.

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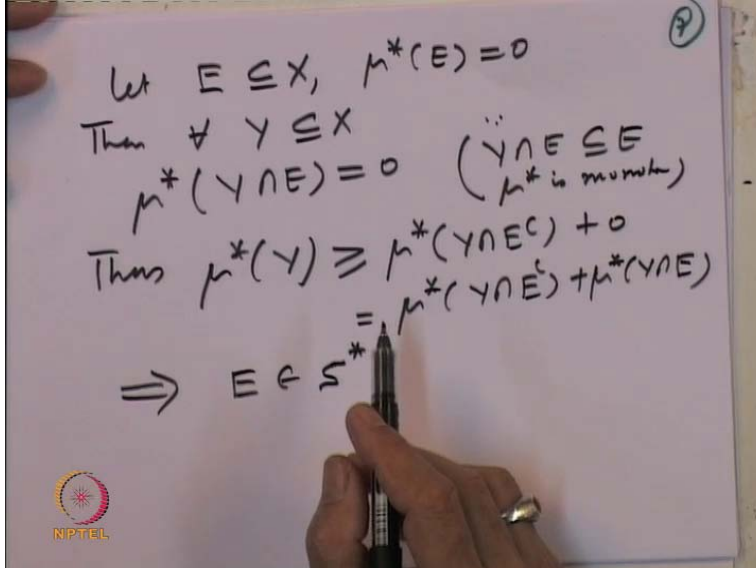
Properties of measurable sets

- Let $\mathcal{N} := \{E \subseteq X \mid \mu^*(E) = 0\}$.
Then $\mathcal{N} \subseteq \mathcal{S}^*$.
- Let $\mu : \mathcal{A} \rightarrow [0, \infty]$
be a measure.
If μ is σ -finite, then there exists a unique extension of μ to a measure $\bar{\mu} : \mathcal{S}(\mathcal{A}) \rightarrow [0, \infty]$.



Before doing that, let us observe one more thing. Let us look at sets E in X , whose outer measure is 0. These are called sets of null outer measurable sets. So, the claim is every set, whose outer measure is 0 is automatically measurable.

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Let $E \subseteq X$, $\mu^*(E) = 0$

Then $\forall Y \subseteq X$
 $\mu^*(Y \cap E) = 0$ ($\because \mu^*$ is monotone)

Thus $\mu^*(Y) \geq \mu^*(Y \cap E^c) + 0$
 $= \mu^*(Y \cap E^c) + \mu^*(Y \cap E)$

$\Rightarrow E \in \mathcal{S}^*$



So, let us check that and let E be a subset of X . μ^* of E equal to 0, for every Y contained in X μ^* of Y intersection E is equal to 0 because Y intersection E is contained in E because μ^* is monotone. So, this is 0 and thus μ^* of Y is bigger than or equal to μ^* of Y intersection E complement because again Y intersection E

complement is a subset of this. I can add 0 to it and that is equal to mu star of Y intersection E complement plus mu star of Y intersection E. That is precisely saying that the set E is measurable.

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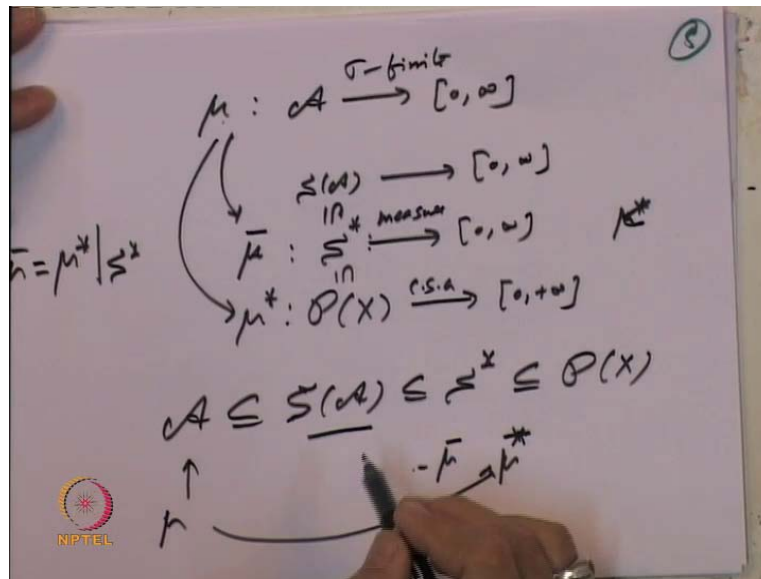
Properties of measurable sets

- Let $\mathcal{N} := \{E \subseteq X \mid \mu^*(E) = 0\}$.
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If μ is σ -finite, then there exists a unique extension of μ to a measure $\bar{\mu} : \mathcal{S}(\mathcal{A}) \rightarrow [0, \infty]$.

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That shows the class of mu star null sets are also measurable. So, this class N is inside S star. So, let us summarize the process. Now, what we have? So, let us start with a measure mu on a algebra; a mu is a measure. A is a algebra of subsets of the set X, if mu is sigma finite, then there exists a unique extension of mu to the sigma algebra generated by A. How do we conclude that? The conclusion for that is as follows:

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So, μ is on the algebra and it is sigma finite; given. So, we define outer measure μ^* from it, which is defined on all subsets of X . It is countably sub additive. We picked up the class of measurable sets S^* . So, if we restrict μ to this, let us call it as $\bar{\mu}$. There is a restriction of μ to the smaller class S^* . Keep in mind, S^* is the class of measurable sets. So, what is μ^* ? $\bar{\mu}$ is equal to μ^* and restricted to S^* . This is a measure (Refer Slide Time: 24:55), S^* is sigma algebra and we know that this is an extension. So, from μ we come to $\bar{\mu}$, an extension of μ from the algebra to S^* . Note: All sets in A are measurable. So, the sigma algebra is also inside here.

A is inside S of A , which is inside S^* and which is inside all subsets of X . so, μ is defined here. We get μ^* here and when we restrict, we get $\bar{\mu}$ and that is same as $\bar{\mu}$ on S of A . So, we get measure $\bar{\mu}$ on S of A and that is same as $\bar{\mu}$ on S of A . so, what is $\bar{\mu}$? $\bar{\mu}$ is the restriction of the outer measure μ^* to the sigma algebra generated by A . That is inside the class of measurable set. So, it is a well defined measure because μ is sigma finite. Suppose, there was another extension by some other method to the sigma algebra, then by the uniqueness of measures on the sigma algebras, we know that there is only one possible extension and that we have already proved. In that case, an extension exist, if two measures agree on the algebra, they will also agree on the sigma algebra, provided they are sigma finite. So, uniqueness follows from that theorem.

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Properties of measurable sets

- Let
$$\mathcal{N} := \{E \subseteq X \mid \mu^*(E) = 0\}.$$
Then $\mathcal{N} \subseteq \mathcal{S}^*$.
- Let
$$\mu : \mathcal{A} \rightarrow [0, \infty]$$
be a measure.
If μ is σ -finite, then there exists a unique extension of μ to a measure
$$\bar{\mu} : \mathcal{S}(\mathcal{A}) \rightarrow [0, \infty].$$




So, we have got, if μ is a sigma finite measure on an algebra, then we can extend it to the sigma algebra generated by it. This is the extension process. So, one has to start with a measure μ on an algebra. Recall, we already have extended it from a semi algebra to the generated algebra. Essentially, it says, if we have a measure on a semi algebra of subsets of a set X , the measure μ is sigma finite. Then, it can be uniquely extended to a sigma finite measure on the sigma algebra generated by that algebra.

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Properties of measurable sets

In fact, we have extended
$$\mu : \mathcal{A} \rightarrow [0, \infty]$$
to a measure on \mathcal{S}^* which includes $\mathcal{S}(\mathcal{A})$ and also \mathcal{N} , the class of all sets $E \subseteq X$ with $\mu^*(E) = 0$.

- One can show that
$$\mathcal{S}^* = \mathcal{S}(\mathcal{A}) \cup \mathcal{N}$$
$$:= \{E \cup N \mid E \in \mathcal{S}(\mathcal{A}), N \in \mathcal{N}\}.$$

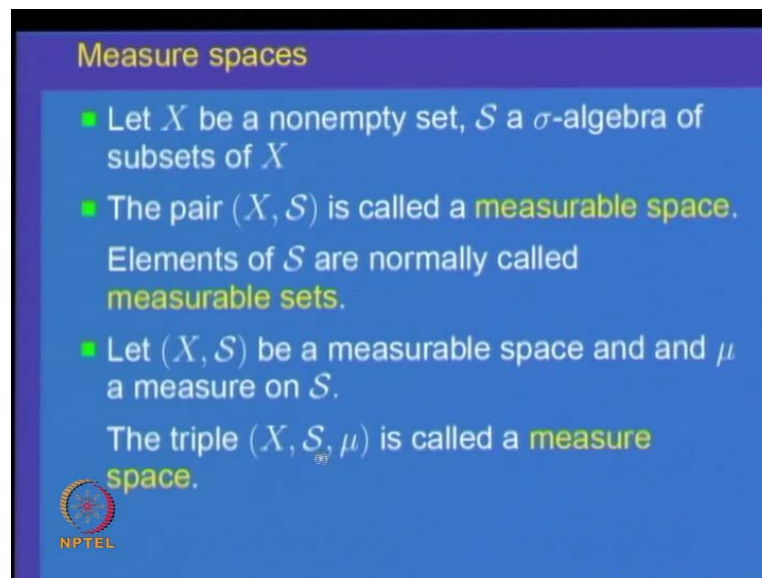


In fact, we have proved something more. We have actually shown that not only μ , which is defined on the algebra extends to \mathcal{S} of A , the sigma algebra generated by it.

Actually, it extends to a class \mathcal{S}^* , which not only includes \mathcal{S} of A . It also includes the class of μ^* null sets, sets of outer measure $\mu^* 0$. So, let us denote the class of the sigma algebra generated by \mathcal{S} of A and the null sets by a new name. So, what we are saying is- one can show that this \mathcal{S}^* , the class of all outer measurable sets, which is sigma algebra and includes \mathcal{S} of A .


It also includes N So, it includes this union and we are writing it as sets of the type. So, $\mathcal{S}^* = \mathcal{S} \cup N$. A union of N is not the union of these two classes. It denotes sets of the type $E \cup N$, where E belongs to \mathcal{S} of A and N is a null set. So, take sets, which are in the sigma algebra generated by A , adjoined to it any μ^* null set. So, look at this new collection and one can show that \mathcal{S}^* is same as $E \cup N$. It involves two things: one is- this collection is a sigma algebra and the other is- this sigma algebra is same as \mathcal{S}^* . We will not go into the details of this, as they are slightly technical. We will assume this, but it gives us new notion. So, let us define that.

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Measure spaces

- Let X be a nonempty set, \mathcal{S} a σ -algebra of subsets of X
- The pair (X, \mathcal{S}) is called a **measurable space**. Elements of \mathcal{S} are normally called **measurable sets**.
- Let (X, \mathcal{S}) be a measurable space and μ a measure on \mathcal{S} . The triple (X, \mathcal{S}, μ) is called a **measure space**.

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So, let X be a nonempty set. \mathcal{S} , a sigma Algebra of subsets of the set X . The pair (X, \mathcal{S}) from now onwards will be called as a measurable space So, a measurable space is a pair, where X is a set and \mathcal{S} is a sigma algebra of subsets of it. This elements (Refer Slide Time: 29:30) of \mathcal{S} normally are called measurable sets. Suppose, we are given a

measurable space X, \mathcal{S} and we are given a measure on the sigma algebra \mathcal{S} . Then we get a triple X, \mathcal{S} and μ and it is called a measure space. So, a measure space signifies an ordered triple, where the first element X is a set X , the second one is a sigma algebra of subsets of a set X and μ is a function defined on the sigma algebra taking non negative values and it is countably additive; it is a measure. So, this triple is called a measure space

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Measure spaces

- Extension process:
Given a measure on an algebra \mathcal{A} of subsets of a set X , we constructed the measure spaces $(X, \mathcal{S}(\mathcal{A}), \mu^*)$, and $(X, \mathcal{S}^*, \mu^*)$ and exhibited the relations between them.
- The measure space $(X, \mathcal{S}^*, \mu^*)$ has the property that if $E \subseteq X$ and $\mu^*(E) = 0$, then $E \in \mathcal{S}^*$.

This property is called the **completeness of the measure space** $(X, \mathcal{S}^*, \mu^*)$.

So, what we have done in our extension process? We can now summarize it as follows: Given a measure on a algebra, \mathcal{A} of subsets of a set X . What we did? We constructed two measure spaces: one was- X, \mathcal{S} of \mathcal{A} the sigma algebra generated by it μ^* , which is the outer measure induced by μ . We know μ^* on \mathcal{S} of \mathcal{A} is a measure and. we also have the measure space X, \mathcal{S}^* and μ^* . μ^* on \mathcal{S}^* is the class of all outer measurable sets.

So, we get these two measures spaces. Keep in mind, \mathcal{S} of \mathcal{A} is a subset of \mathcal{S}^* . We gave the relation between these two, namely: the measure space and this is in some sense we can say it is a bigger measure space because the sigma algebra \mathcal{S}^* is bigger than \mathcal{S} of \mathcal{A} . This measure space has a special property, namely: if we take any set E in X , μ^* of E is 0, then E belongs to \mathcal{S}^* . So, for example, this is a very special thing. Suppose, you take any subset A of E , then by monotone property μ^* of A also will be 0. So, that also will be inside \mathcal{S}^* . \mathcal{S}^* includes all μ^* null sets. Such a

measure, normally is called a complete measure space. So, our construction has given the measure space $(X, \mathcal{S}^*, \mu^*)$. It is a complete measure space, namely: all sets of outer measure 0 are elements of \mathcal{S}^* and that is a nice condition to have. We will see it later on. So, this is called a complete measure space. So, a complete measure space is a space such that the sigma algebra \mathcal{S}^* or sigma algebra includes all null sets, whose measure is 0.


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Some facts

- The measure space $(X, \mathcal{S}(\mathcal{A}), \mu^*)$ need not be complete in general.
- Every measure space (X, \mathcal{S}, μ) can be completed.
For details refer the text book mentioned in the first lecture.
- Equivalent ways of describing $\mu^*(E)$:
For every set $E \subseteq X$,

$$\mu^*(E) = \inf \{ \mu^*(A) \mid A \in \mathcal{S}(\mathcal{A}), E \subseteq A \}$$

$$= \inf \{ \mu^*(A) \mid A \in \mathcal{S}^*, E \subseteq A \}.$$

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In general, a measure space need not be complete. For example, this measure space need not be complete. So, there is a theorem, which says every measure space (X, \mathcal{S}, μ) can be completed. This process of completion of a measure space is a slightly technical one. The basic idea is- given a measure μ on a algebra \mathcal{S} of subsets of a set X collect together all sets, whose outer measure μ^* is 0 and adjoin them or add them to the sigma algebra \mathcal{S} . That means, generate a new sigma algebra by taking \mathcal{S} and the sets, which are null sets. So, that gives a bigger sigma algebra and on that bigger sigma algebra, one can show, we can extend that measure μ to the sigma algebra. New measure space becomes complete. So, the process is very much similar to looking at $(X, \mathcal{S}^*, \mu^*)$ of (X, \mathcal{S}, μ) and these are the $(X, \mathcal{S}^*, \mu^*)$. So, we will assume this theorem that every measure space (X, \mathcal{S}, μ) can be completed. So, if you are interested in looking at the technical details for this, look at the textbook, which we mentioned in the first lecture, namely: An Introduction to Measure and Integration by me. So, we will leave these details for those who feel more interested in looking at the details. Next, we will

give some equivalent ways of describing the set, μ^* of E . μ^* of E can be also written as infimum of μ^* of A , where A belongs to \mathcal{S} of A and all E are inside A . So, look at all elements from the sigma algebra generated by A , which include that set E . Look at the μ^* of A and take the infimum of them. So, in some sense, μ^* of a set can be approximated by sets from elements of \mathcal{S} of A and a similar result is true for elements, which are measurable sets. So, these are technical things and facts, which we will not prove. Most probably, we will not be using them in our course, but it is nice to know the relation between μ^* of E and μ^* of sets in the sigma algebra \mathcal{S} of A and \mathcal{S}^* of A .


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Some facts

- For every $E \subseteq X$, there exists a set $F \in \mathcal{S}(\mathcal{A})$ such that

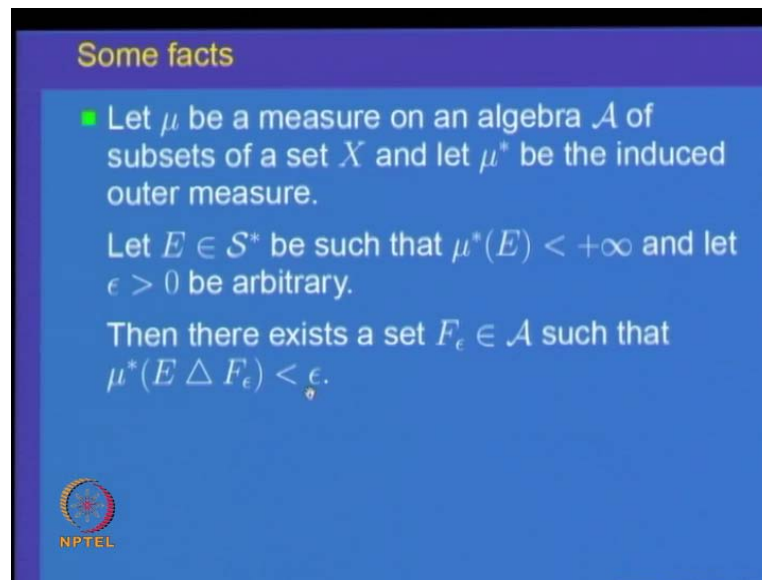
$$E \subseteq F, \mu^*(E) = \mu^*(F) \text{ and } \mu^*(F \setminus E) = 0.$$
 The set F is called a **measurable cover** of E .
- For every $E \subseteq X$, there exists a set $K \in \mathcal{S}(\mathcal{A})$, such that

$$K \subseteq E, \text{ and } \mu^*(E \setminus K) = 0.$$
 The set K is called a **measurable kernel** of E .

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Here is another fact which again we will not be proving and most probably we will not be using, namely: that for every subset E in X , you can find a set in the sigma algebra \mathcal{S} of A ; the sigma algebra generated by A , such that the set E is a subset of F . So, F , which includes E and the outer measure of the two are same and that in turn implies that outer measure of F minus E is 0. So, essentially it says for every set E contained in X , there is a set in the sigma algebra \mathcal{S} of A , such that the difference is got outer measure 0. Such a set is called a measurable cover of E because F covers E . and a similar result for a set that is inside. If E is in X , then you can find a set K inside E , such that the difference μ^* of E minus K is 0. Such a set is called a measurable kernel of E . So, given any set E , there is a cover by a measurable set. There is a smaller set inside, which is a kernel and difference is sets of a measure is 0. So, these things we will not prove.

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Some facts

- Let μ be a measure on an algebra \mathcal{A} of subsets of a set X and let μ^* be the induced outer measure.

Let $E \in \mathcal{S}^*$ be such that $\mu^*(E) < +\infty$ and let $\epsilon > 0$ be arbitrary.

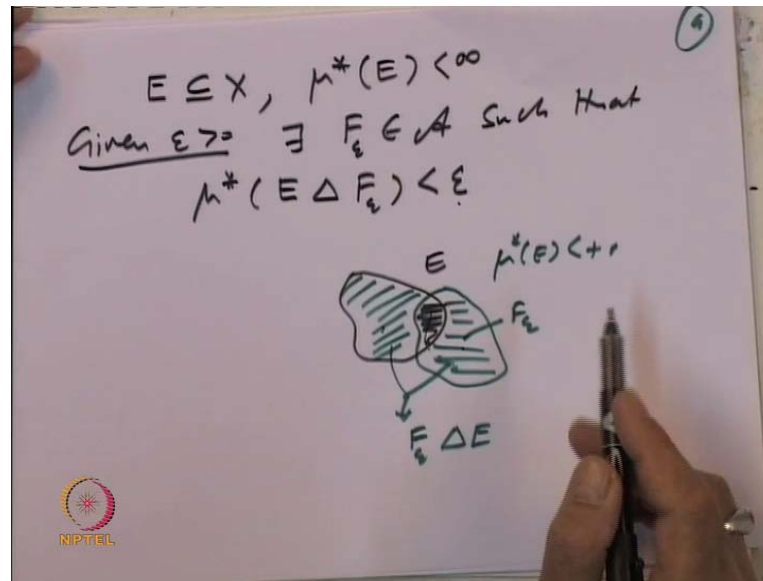
Then there exists a set $F_\epsilon \in \mathcal{A}$ such that $\mu^*(E \Delta F_\epsilon) < \epsilon$.



We will prove a result, which we will need later on. That relates the outer measure with measure of the set inside the algebra that we have started with. We start with a measure μ on algebra \mathcal{A} of subsets of a set X . Let, μ^* be the induced outer measure.

Suppose, we have got a set E , such that μ^* of E is finite. This set need not be in the sigma algebra. So, take any set E , such that μ^* of E is... so, we do not need this condition that E should be a measurable set. So, take any set, whose outer measure is finite and then given any epsilon. You can find a set in the algebra \mathcal{A} , such that μ^* of E symmetric difference that set F_ϵ is less than epsilon. So, this is a very nice result which says any set of finite outer measure, as I said, this is I mentioned is not there; it is not needed for any - it is a typo - for any set of finite outer measure, you can find a set in the algebra, such that μ^* of E symmetric difference. So, the measure of the symmetric difference is small.

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Let us look at a proof of this result. So, what we are saying is- let us take a set E contained in X with the condition that μ^* of E is finite. It says, given ϵ bigger than 0, there exists a set F_ϵ belonging to algebra, such that μ^* of E symmetric difference with F_ϵ is less than ϵ . Let us see, what we were saying. We were saying that, this is the set E and it says given a set E with the condition that μ^* of E is finite.

I can find a set, call this as F_ϵ such that, what is the symmetric difference? Symmetric difference is E minus and F_ϵ minus. So, that is the portion and this portion (Refer Slide Time: 39:29) is F_ϵ symmetric difference E . So, it says these are common portion and it says, outer measure of the sets, which are outside the common portion is small. Essentially, almost you can say that E and F_ϵ are same.

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$\mu^*(E) < +\infty$
 $\mu^*(E) = \inf \left\{ \sum_{i=1}^{\infty} \mu(A_i) \mid \bigcup_{i=1}^{\infty} A_i \supseteq E, A_i \in \mathcal{A} \right\}$
 Given $\varepsilon > 0$, $\exists A_i \in \mathcal{A}$, $E \subseteq \bigcup_{i=1}^{\infty} A_i$,
 and $\mu^*(E) + \varepsilon > \sum_{i=1}^{\infty} \mu(A_i)$
 $\Rightarrow \sum_{i=1}^{\infty} \mu(A_i) < +\infty \Rightarrow \exists n_0$ s.t.
 $\sum_{i=n_0+1}^{\infty} \mu(A_i) < \varepsilon/2$

So, let us prove this property. Let us observe that μ^* of E is finite. What is μ^* of E ? If you recall, μ^* of E is equal to infimum of $\sum \mu(A_i)$ i equal to 1 to infinity, where this A_i is the union of A_i 's cover the set E and A_i 's in the algebra. So, this being finite, given: ε , a small quantity bigger than 0. There exists a covering for sets A_i belonging to the algebra, such that E is contained in union of A_i 's and μ^* of E , which is infimum plus the small number is bigger than $\sum \mu(A_i)$ and that is by the definition of the infimum; infimum is finite.

Note, because this is finite, it implies that the series i equal to 1 to infinity $\mu(A_i)$ is finite. So, as a consequence of this, there exist some n_0 , such that the tail of the series, n_0 plus 1 to infinity $\mu(A_i)$ is less than $\varepsilon/2$. That is because the series is convergent.

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Define $F_\epsilon = \bigcup_{i=1}^{n_0} A_i \in \mathcal{A}$

$$E \setminus F_\epsilon = E \setminus \left(\bigcup_{i=1}^{n_0} A_i \right)$$

$$\subseteq \left(\bigcup_{i=1}^{\infty} A_i \right) \setminus \left(\bigcup_{i=1}^{n_0} A_i \right)$$

$$\subseteq \bigcup_{i=n_0+1}^{\infty} A_i$$

$$\Rightarrow \mu^*(E \setminus F_\epsilon) \leq \mu^* \left(\bigcup_{i=n_0+1}^{\infty} A_i \right)$$

$$\leq \sum_{i=n_0+1}^{\infty} \mu^*(A_i) < \epsilon/2$$

Once that is done, let us define the set F_ϵ to be equal to union of A_i i equal to 1 to the stage n_0 . Note: this set belongs to the algebra because it is a finite union of elements in the algebra and it belongs to the algebra. So, let us look at the set E minus F_ϵ . What is that? That is E minus union i equal to 1 to n_0 A_i . Now, the set E is contained in union i equal to 1 to infinity A_i . This is contained in this minus union i equal to 1 to n_0 A_i .

So, I can say this is contained in union i equal to n_0 plus 1 to infinity of A_i . So that implies μ^* of E minus F_ϵ is less than or equal to μ^* of the set union i n_0 plus 1 to infinity A_i and is sub additive. So, (Refer Slide Time: 43:30) this was subset of this. So, μ^* of this is less than or equal to ... by monotone property and by sub additive property this is less than or equal to sigma i equal to n_0 plus 1 to infinity μ^* of A_i . If you recall, we have less than epsilon by 2. So, we get that μ^* of E minus F_ϵ is less than epsilon by 2

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$$\begin{aligned} \text{Also } \mu^*(F_\epsilon \setminus E) &= ? \\ F_\epsilon \setminus E &= \left(\bigcup_{i=1}^{\infty} A_i \right) \setminus E \\ &\subseteq \left(\bigcup_{i=1}^{\infty} A_i \right) \setminus E \\ \mu^*(F_\epsilon \setminus E) &\leq \sum_{i=1}^{\infty} \mu(A_i) - \mu^*(E) \\ &< \epsilon/2 \end{aligned}$$

So, we get that $\mu^*(F_\epsilon \setminus E)$ is less than $\epsilon/2$. Let us also compute the measure of the other part, namely: We also want to compute $\mu^*(F_\epsilon \setminus E)$. We want to compute, what is this equal to? $F_\epsilon \setminus E$ is $\bigcup_{i=1}^{\infty} A_i \setminus E$. Note: This is a subset of $\bigcup_{i=1}^{\infty} A_i \setminus E$. E is a subset of this and that implies $\mu^*(F_\epsilon \setminus E) \leq \mu^*\left(\bigcup_{i=1}^{\infty} A_i \setminus E\right)$. So, that is, $\sum_{i=1}^{\infty} \mu(A_i) - \mu^*(E)$.

If you recall the way we started, we had $\sum_{i=1}^{\infty} \mu(A_i)$. This relation (Refer Slide Time: 45:15) says, $\sum_{i=1}^{\infty} \mu(A_i) - \mu^*(E) < \epsilon$. So, we could have started with $\epsilon/2$ and then we have got this is less than $\epsilon/2$. So, we are getting that $\mu^*(F_\epsilon \setminus E)$ is less than $\epsilon/2$.

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Handwritten mathematical derivations on a whiteboard:

$$\begin{aligned} &\leq \bigcup_{i=n_0+1}^{\infty} A_i \\ \Rightarrow \mu^*(E \setminus F_\epsilon) &\leq \mu^*\left(\bigcup_{i=n_0+1}^{\infty} A_i\right) \\ &\leq \sum_{i=n_0+1}^{\infty} \mu^*(A_i) < \epsilon/2 \quad \text{--- (1)} \end{aligned}$$

$$\begin{aligned} \mu^*(F_\epsilon \setminus E) &\leq \sum_{i=1}^{\infty} \mu(A_i) - \mu(E) \\ &< \epsilon/2 \quad \text{--- (2)} \end{aligned}$$

$$\begin{aligned} \mu^*(E \Delta F_\epsilon) &\leq \mu^*(E \setminus F_\epsilon) + \mu^*(F_\epsilon \setminus E) \\ &< \epsilon/2 + \epsilon/2 = \epsilon. \end{aligned}$$

We have already shown that $\mu^*(F \setminus E) < \epsilon/2$. So, putting these two together, we call this as 1 and call this as 2. So, by putting 1 and 2 together, $\mu^*(E \Delta F) < \epsilon$ is less than or equal to $\mu^*(E \setminus F) + \mu^*(F \setminus E)$ and both of them are less than $\epsilon/2$ plus $\epsilon/2$, which is equal to ϵ .

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Some facts

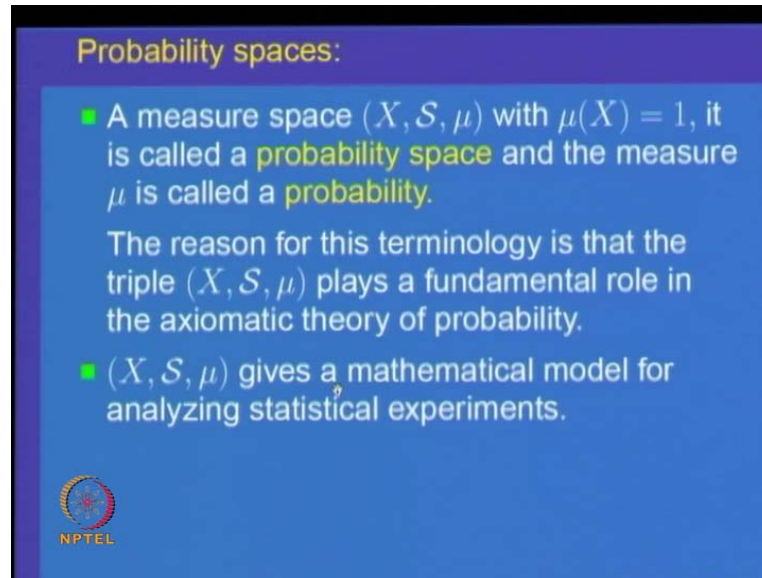
- Let μ be a measure on an algebra \mathcal{A} of subsets of a set X and let μ^* be the induced outer measure.

Let $E \in \mathcal{S}^*$ be such that $\mu^*(E) < +\infty$ and let $\epsilon > 0$ be arbitrary.

Then there exists a set $F_\epsilon \in \mathcal{A}$ such that $\mu^*(E \Delta F_\epsilon) < \epsilon$.

So, that proves the required property, which we wanted to prove, namely: that given epsilon bigger than 0. There is a set F epsilon, which is in the algebra A , say that μ star of E delta F epsilon is less than epsilon.

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Probability spaces:

- A measure space (X, \mathcal{S}, μ) with $\mu(X) = 1$, it is called a **probability space** and the measure μ is called a **probability**.

The reason for this terminology is that the triple (X, \mathcal{S}, μ) plays a fundamental role in the axiomatic theory of probability.

- (X, \mathcal{S}, μ) gives a mathematical model for analyzing statistical experiments.

 NPTEL

So, this is an approximation property, which we will be using later on to prove some facts. So, this is the process of extension theory. The process of extension theory gives us ways of constructing triples, which are measure spaces. At this point, it is worth mentioning there are measure spaces of importance in other subjects, called probability theory.


A measure space X, \mathcal{S}, μ , where μ of X is 1, that is, totally finite measure and μ of the whole space is equal to 1 and is called a probability space. The measure μ is called a probability. So, a measure space, where μ of X is one; is called a probability space and μ is called a probability.

The reason for this terminology is such triples play a fundamental role in axiomatic theory of probability. Whenever you want to describe a phenomena - a statistical phenomena which depends upon some randomness, one has to construct a probability space to analyze it. So, this gives a mathematical model in the theory of probability to analyze statistical experiments.

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Probability spaces:

The set X represents the set of all possible outcomes of the experiment, the σ -algebra \mathcal{S} represents the collection of events of interest in that experiment, and for every $E \in \mathcal{S}$, the nonnegative number $\mu(E)$ is the probability that the event E occurs.

 NPTEL

So, let me give you a few things more, the set X denotes in the triple X, \mathcal{S}, μ . X represents the set of all possible outcomes of the experiment. For example, you are tossing a coin and all possible outcomes are head or tail. You are throwing a die and there are six possible outcomes: the number 1, 2, 3, 4, 5, 6. You are observing the temperature of a particular place every day at a particular time; the observation will be a real number.

So, in any particular experiment, all possible outcomes of that experiment constitutes a set. That is the set X and all the sigma algebra \mathcal{S} , represents the collection of events of interest in that experiment. So, any subset of the set of outcomes in the experiment is called an event. So, for example, when you are tossing a coin, there are two outcomes possible: head and tail. If you look at the singleton h , that is, an event when you toss head can come or a tail can come. If you are throwing a die, then the outcomes possible are 1, 2, 3, 4, 5, 6. Look at the subset 1, 3 and 5 of X , the set of all odd outcomes. So, when you throw, it is possible to find out whether that event has occurred or not. It means, whether the outcome was an odd number or not. So, that is a subset of set of all possible outcomes.

In general, when you want to describe its statistical experiment, one has to construct a class of subsets of that set X of interest that one requires because of mathematical considerations that class would be a sigma algebra. So, the sigma algebra represents the

collection of events of interest in that particular experiment. Finally, for every event E of interest, you want to assign the possibility of that event happening or the probability of that event taking place.

So, a probability is a measure defined on the sigma algebra of all possible event of interest in taking non-negative values and of course, probability of the whole space, the chance of the whole space happening is 1 and probability of the empty set is 0. So, the probability is a set function defined on the collection of all events of interest. We want that to be a measure. So, that is the reason that the triple X, S, μ is called a probability space. It gives a mathematical model for analyzing statistical experiments, when μ of X is equal to 1.

So, in today's lecture, we have constructed measure spaces. From the next lecture onwards, we will specialize this measure space, when X is real line. It gives an important example of measure space and a measure called Lebesgue measure. So, we will do that in the next lecture. Thank you.