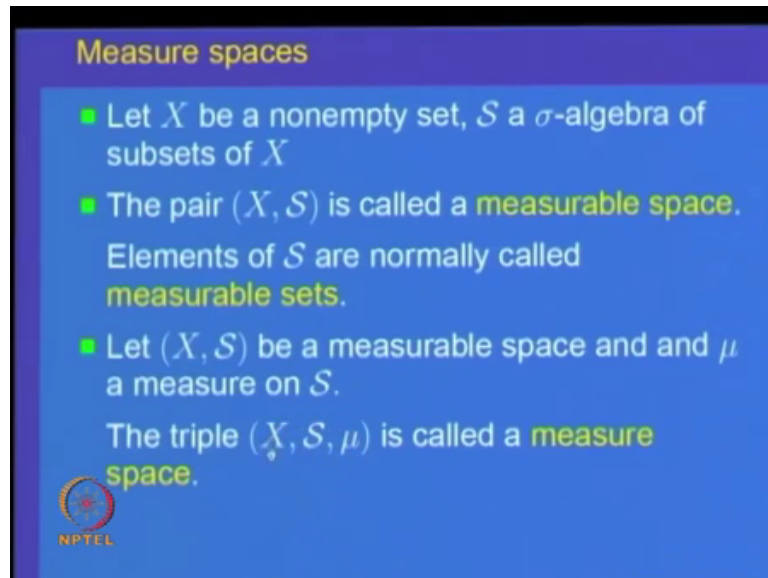


**Measure & Integration**  
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**Lecture - 11 B**  
**Measurable Sets**

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**Measure spaces**

- Let  $X$  be a nonempty set,  $\mathcal{S}$  a  $\sigma$ -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  $\mu$  a measure on  $\mathcal{S}$ . The triple  $(X, \mathcal{S}, \mu)$  is called a **measure space**.

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So, but we will this gives us a new notion. So, let us define that. So, let  $X$  be a non empty set,  $\mathcal{S}$  a sigma algebra of sub sets of the set  $X$ , the pair  $X, \mathcal{S}$ . Now onwards, we will be called a measurable space. So, a measurable space is a pair where  $X$  is a set and  $\mathcal{S}$  is a sigma algebra of sub sets of it and suppose we are given. So, this elements of  $\mathcal{S}$  normal, we are called measurable sets and. So, let us next suppose that, 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  $\mu$  that is called a measure space.

So, a measure space signifies a triple, a ordered triple where the first element  $X$  is a set  $X$ , a second one is a sigma algebra of sub sets of the set  $X$  and  $\mu$  is a function defined on the sigma algebra taking non negative values and it is countably additive, it is a measure.

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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, this triple is called a measure space. So, what we have done our extension process, we can now summarize it as follows given a measure on an algebra  $\mathcal{A}$  of sub sets of a set  $X$ ; what we did we constructed; two measure spaces one was  $X, \mathcal{S}(\mathcal{A})$  of a the sigma algebra generated by it  $\mu^*$ , which is the outer measure induced by  $\mu$  and we know  $\mu^*$  on  $\mathcal{S}(\mathcal{A})$  is a measure and we also have the measure space  $X, \mathcal{S}^*$  and  $\mu^*$  on  $\mathcal{S}^*$ , the class of all outer measurable sets. So, we get these two measures spaces keep in mind  $\mathcal{S}(\mathcal{A})$  is a sub set of  $\mathcal{S}^*$  and we gave the relation between these two namely the measures space. This is in some sense, we can say it is a bigger measure space because the algebra  $\mathcal{S}^*$  is bigger than  $\mathcal{S}(\mathcal{A})$  and this measure space as a special property namely that if you take any set  $E$  in  $X$  and  $\mu^*(E) = 0$  then  $E$  belongs to  $\mathcal{S}^*$ .

So, not only; so for example, this is a very special thing. Suppose, you take any sub set  $A$  of  $E$  then by monotone property  $\mu^*(A)$  also will be 0. So, that also will be inside  $\mathcal{S}^*$ . So,  $\mathcal{S}^*$  includes all  $\mu^*$ , null sets, such a measure normally is called a complete measure space. So, our construction as given the measure space  $X, \mathcal{S}^*, \mu^*$  and it is a complete measure space namely all sets of outer measure 0 are elements of  $\mathcal{S}^*$ , that is a nice condition to have. We will see it a bit later on. So, this is called a complete measure space.

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**Some facts**


- The measure space  $(X, \mathcal{S}(\mathcal{A}), \mu^*)$  need not be complete in general.
- Every measure space  $(X, \mathcal{S}, \mu)$  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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So, a complete measure space in this space. So, is that the sigma algebra  $\mathcal{A}^*$ . Sigma algebra includes all null sets. All sets whose measure is 0 in general a measure space need not be complete. So, for example, in particular for example, this measures space need not be complete in general. So, there is a theorem which says every measure space  $X \mathcal{S} \mu$  can be completed and this process of completion of a measure space is a slightly technical, one the basic idea is given a measure  $\mu$  on a algebra  $\mathcal{S}$  of sub sets of a set  $X$  collect together all sets, whose outer measure  $\mu^*$  is 0 and adjoin them, add them to the sigma algebra  $\mathcal{S}$ ; that means, generate a new sigma algebra by looking, taking together  $\mathcal{S}$  and the sets, which are null sets.

So, that gives a bigger sigma algebra and on that bigger sigma algebra I can show. We can extend that measure  $\mu$  to the sigma algebra and the new measure space becomes complete. So, at the process is very much similar to looking at  $X \mathcal{S}$  of  $\mathcal{A}$  and  $\mu^*$  and viza  $V X \mathcal{S}^*$  and  $\mu^*$ . So, we will assume this theorem that every measure space  $X \mathcal{S} \mu$  can be completed. So, if you are interested in looking at the technical details for this look at the text book, which we mentioned in the first lecture, namely an introduction to measure an integration by me.

So, we will leave these details for those, who feel more interested in looking at the details. Next, we will give the, there are some equivalent ways of describing the set  $\mu^*$  of  $E$  and that is that  $\mu^*$  of  $E$  can be also written as infimum of  $\mu^*$  of  $A$ .


Where  $A$  belongs to  $\mathcal{S}$  of  $A$  and all  $E$  are inside a ring. So, look at all elements from the sigma algebra generated by  $A$ , which include the set  $E$  and look at the  $\mu^*$  of  $A$  and take the infimum of them. So, in some sense  $\mu^*$  of a set can be approximated by sets from  $\mu^*$  from elements of  $\mathcal{S}$  of  $A$  and a similar result is true for belonging to elements which are measurable sets.

So, these are technical things. So, these are some facts, which will not prove and most probably will not be using them in our course, but they are nice to know that relation between  $\mu^*$  of  $E$  and  $\mu^*$  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  $E$ .

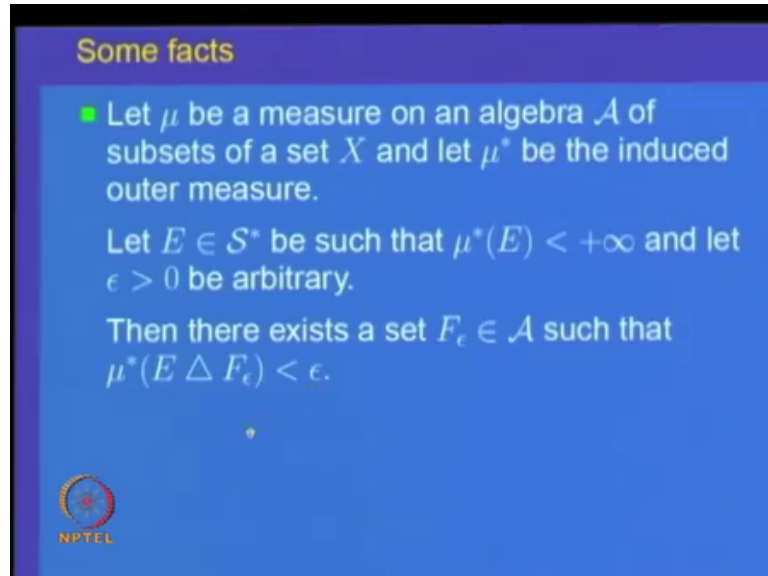
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Here is another fact, which again we will not be proving and most probably we will not be using namely that for every sub set  $E$  in  $X$ , you can find the set in the sigma algebra  $\mathcal{S}$  of  $A$ , the sigma algebra generated by  $A$  such that the set  $E$  is a sub set of  $F$ . So,  $F$  is which includes  $E$  and the outer measure of the 2 are same and that also 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 has got outer measure 0 such a set is called a measurable cover of  $E$ ; so such a set, because  $F$  covers  $E$  and a similar results for a set inside.

So, if  $E$  is in  $X$ , then you can find a set  $K$  inside  $E$ , such that the difference  $\mu^*$  of  $E$  minus  $K$  is 0 and such a set is called a measurable kernel of  $E$ . So, given any set  $E$ , there

is a cover by a measurable set and there is a smaller set inside which is a kernel. So, and difference is of sets of measure 0.

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**Some facts**

- Let  $\mu$  be a measure on an algebra  $\mathcal{A}$  of subsets of a set  $X$  and let  $\mu^*$  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  $\mu^*(E \Delta F_\epsilon) < \epsilon$ .

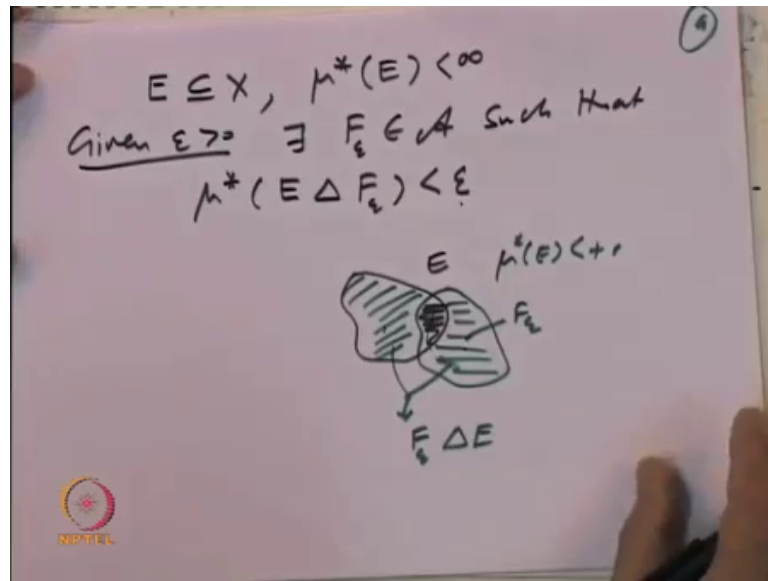
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So, these things we will not prove. We will prove result which will be needing epsilon and that relates the outer measure with measure of the set inside the algebra that we have started with. So, we start with a measure  $\mu$  on an algebra  $\mathcal{A}$  of subsets of a set  $X$ , let  $\mu^*$  be the induced outer measure. So, suppose we have got a set  $E$  such that  $\mu^*$  of  $E$  is finite. This set need not be in the sigma algebra. So, take any set  $E$ , such that  $\mu^*$  of  $E$  is finite. So, we do not need this condition that  $E$  should be measurable set. So, take any set whose outer measure is finite then given any epsilon you can find a set in the algebra  $\mathcal{A}$ . Such that  $\mu^*$  of  $E$  symmetric difference that set  $F_\epsilon$  is less than epsilon.

So, this is a very nice result which says any set of finite outer measure.

As I said this condition is not there, it is not needed for any. It is a type for any set of finite outer measure you can find a set in the algebra, such that  $\mu^*$  of  $E$  symmetric difference. So, the measure of the symmetric difference is small.

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So, let us look at a proof of this result. So, what we are saying is. So, let us take a set  $E$  contained in  $X$  with the condition that  $\mu^*$  of  $E$  is finite. So, it says given  $\epsilon$  bigger than 0, there exists a set  $F_\epsilon$  belonging to algebra, such that  $\mu^*$  of  $E$  symmetric difference with  $F_\epsilon$  is less than  $\epsilon$ .

Let us see what we are saying. So, we are saying that, this is a set  $E$ , it says given a set  $E$  with the condition that  $\mu^*$  of  $E$  is finite. I can find a set call this as  $F_\epsilon$ , such that what is the symmetric difference; symmetric difference is  $E$  minus and  $F_\epsilon$  minus. So, that is the portion. So, this portion is  $F_\epsilon$  symmetric difference  $E$ . So, it says that the sets. So, this is the common portion. So, it says that the measure outer measure of the sets were which are outside the common portion is small. So, essentially almost we can say that  $E$  and  $F_\epsilon$  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  $\epsilon > 0$ ,  $\exists A_i \in \mathcal{A}, E \subseteq \bigcup_{i=1}^{\infty} A_i$ ,  
 and  $\mu^*(E) + \epsilon > \sum_{i=1}^{\infty} \mu(A_i)$   
 $\Rightarrow \sum_{i=1}^{\infty} \mu(A_i) < +\infty \Rightarrow \exists n_0$  s.t.  
 $\sum_{i=n_0+1}^{\infty} \mu(A_i) < \epsilon/2$

So, let us prove this property. So, to prove this, let us observe that  $\mu^*$  of, so,  $\mu^*$  of  $E$  is finite and what is  $\mu^*$ ;  $\mu^*$  of  $E$ , if you recall  $\mu^*$  of  $E$  is equal to infimum of  $\sum \mu(A_i)$   $i=1$  to infinity where this  $A_i$ 's union of  $A_i$ 's cover. So, union of  $A_i$ 's cover the set  $E$  and  $A_i$ 's in the algebra.

So, this being finite; so given  $\epsilon$  a small quantity bigger than zero there exists a covering, so that this sets  $A_i$  belonging to the algebra, such that  $E$  is contained in union of  $A_i$ 's and  $\mu^*$  of  $E$ , which is infimum plus the small number is bigger than  $\sum \mu(A_i)$  right, that is by the definition of the infimum is finite. So, note this implies, because this is finite. So, this implies that the series  $\sum_{i=1}^{\infty} \mu(A_i)$  is finite right. So, there exist as a consequence of this. There exist some  $n_0$  such that the tail of the series. So,  $\sum_{i=n_0+1}^{\infty} \mu(A_i)$  is less than say  $\epsilon/2$  that is because of the series this is convergent. So, once that is done we define.

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

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

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

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

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

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

So, let us define the set  $F_\epsilon$  to be equal to union of  $A_i$   $i$  equal to 1, to the stage  $n$ . So, note this set belongs to the algebra, because it is a finite union of elements in the algebra. So, it belongs to the algebra. So, let us calculate, look at the set  $E$  minus  $F_\epsilon$ . So, what is that? So, that is  $E$  minus union  $i$  equal to 1 to  $n$   $A_i$  right and now the set  $E$  is contained union  $i$  equal to 1 to infinity  $A_i$ . So, this is contained in this minus union  $i$  equal to 1 to  $n$   $A_i$ . So, I can say this is contained in union  $i$  equal to  $n+1$  to infinity of  $A_i$ . So, that implies that  $\mu^*(E \setminus F_\epsilon)$  is less than or equal to  $\mu^*$  of this set union  $i$ ,  $n+1$  to infinity  $A_i$  and which by sub additive.

So, this was sub set of this. So,  $\mu^*$  of this is sub less than or equal to by monotone property and by sub additive property. This is less than or equal to sigma  $i$  equal to  $n+1$  to infinity  $\mu^*(A_i)$  and that if you recall, we have less than  $\epsilon$  by 2. So, this is less than  $\epsilon$  by 2. So, we get that  $\mu^*(E \setminus F_\epsilon)$  is less than  $\epsilon$  by 2.



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

Let us also compute the measure of the other part namely, we want to compute also mu star of F epsilon minus E. Let us compute that. We want to compute, what is this equal to. So, F epsilon minus E is union I equal to 1 to n naught A i minus E and note. So, this is a sub set of union of I equal to 1 to infinity A i minus E and E is a sub set of this. So, that implies that mu star of F epsilon minus E is less than or equal to mu star of this. So, that is sigma I equal to 1 to infinity mu of A i minus mu of mu star of E and that, if you recall is by the well, the way we started, we had mu star of summation mu star of A i this relation.

So, this says sigma mu of A i minus mu of E is less than epsilon. So, we could have started with if required by epsilon by 2. So, then we have gotten the, this is less than epsilon by 2. So, we are getting that mu star of F epsilon minus E is less than epsilon by 2 and we already shown that mu star of we already shown that mu star of F minus E epsilon is less than epsilon by 2; so putting this two together. So, call this as 1, call this as 2.

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

So, by putting 1 and 2 together  $\mu^*(E \Delta F_\epsilon)$  is less than or equal to  $\mu^*(E \setminus F_\epsilon) + \mu^*(F_\epsilon \setminus E)$  and both of them are less than  $\epsilon/2$  plus  $\epsilon/2$  which is equal to  $\epsilon$ . So, that proves the required property which we wanted to prove namely that given  $\epsilon > 0$ , there is a set  $F_\epsilon$ , which is in the algebra  $\mathcal{A}$ , such that  $\mu^*(E \Delta F_\epsilon)$  is less than  $\epsilon$ . So, this is an approximation property, which will be used to prove some facts.


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**Probability spaces:**

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

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

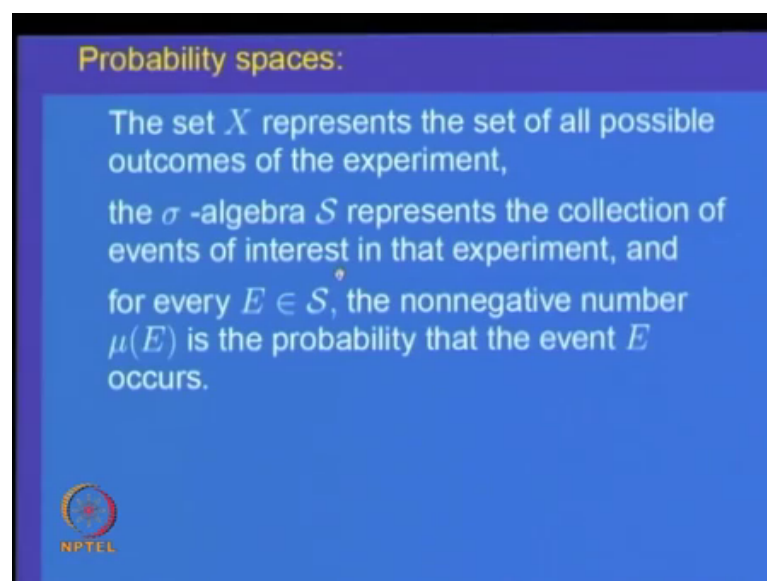
- $(X, \mathcal{S}, \mu)$  gives a mathematical model for analyzing statistical experiments.



So, this is the process of extension theory. So, 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  $(X, \mathcal{S}, \mu)$ , where  $\mu(X) = 1$ . So, that is a totally finite measure and  $\mu$  of the whole space is equal to 1 is called a probability space and the measure  $\mu$  is called a probability. So, I measure space where  $\mu(X) = 1$  is called a probability space and  $\mu$  is called a probability.


The reason for this terminology is that, 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  $\sigma$ -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.



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

So, in any particular experiment, the all possible outcomes of that experiment are they constitute a set and that is the set  $X$  and all the sigma algebra  $S$  represents the collection of events of interest in that experiment. So, any sub set of the set of outcomes in the experiment is called an event. So, for example, when you are tossing a coin, there are 2 outcomes possible head and tail. So, if you look at the single ton H that is an event, when you toss head, can come or you toss a tail can come or if you throwing a dye then the outcomes possible are 1 2 3 4 5 and 6.

Look at the sub set 1 3 and 5 of  $X$ ; the set of all odd outcomes. So, when you throw is possible to find out whether that event has occurred or not; that means, whether the outcome was a odd number or not. So, that is the sub set of the set of all possible outcomes. So, in general when you want to describe it is statistical experiment 2 has to construct a class of sub sets, of that set  $X$  of interest and 1 requires because of mathematical considerations, that class should be a sigma algebra.

So, the sigma algebra represents the collection of events of interest, in that particular experiment and finally, for every event  $E$  of interest, you want to assign some what is the possibility of that event happening a probability of that event taking place. So, a probability is a measure defined on the sigma algebra of all possible events of interest and 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 and we want that to be a measure. So, that is the reason that the triple  $X$  as  $\mu$  is called a probability space and gives a mathematical model for analyzing statistical experiments, when  $\mu$  of  $X$  is equal to 1.

So, in till today's lecture, we have constructed measure spaces and from the next lecture onwards. We will specialize. This measure space when  $X$  is real line and that gives the important. Example of a measure space and a measure called Lebesgue measure. So, we will do that in the next lecture.

Thank you.