

Measure and Integration

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Module No. # 07

Lecture No. # 27

Computation of Product Measure – II

Welcome to lecture number 27 on measure and integration. In the previous lecture, we had started looking at how to compute product measure of a set in the product sigma algebra. We had shown part of theorem and we will continue looking at the proof of that theorem in this lecture.

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Product of measures-recall

For $E \subseteq X \times Y$, $x \in X$ and $y \in Y$, we defined the sections


$$E_x := \{y \in Y \mid (x, y) \in E\}$$

and

$$E^y := \{x \in X \mid (x, y) \in E\}.$$

■ (i) For $E \in \mathcal{A} \otimes \mathcal{B}$, and for every $x \in X, y \in Y$

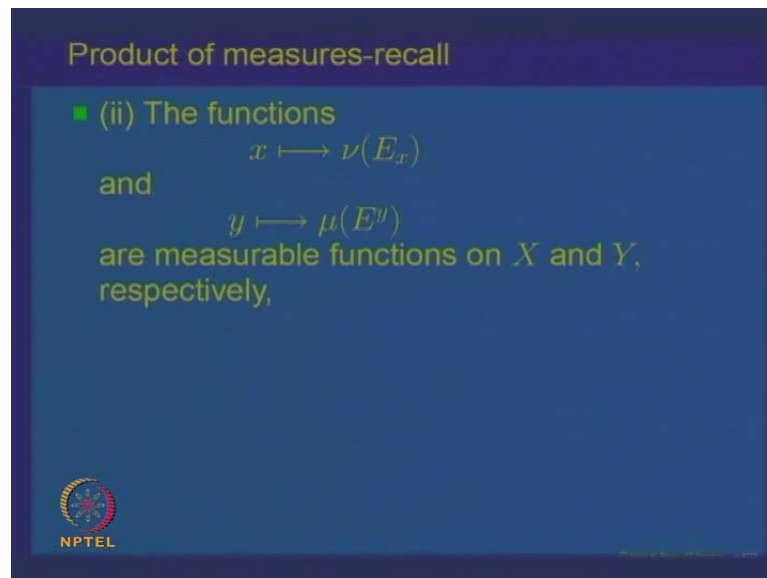
$$E_x \in \mathcal{B} \text{ and } E^y \in \mathcal{A}.$$

 NPTEL

Let us just recall, what we have been doing. We were looking at computing the product measure; we will continue that study today. Let us just recall, the settings we have a set E contained in the product set X cross Y and for any element x in X and y in Y we defined what is called the x section E_x and E_y in the previous lectures.

Then, we claimed that for every set E in the product sigma algebra, set sections E_x is a element of the sigma B and the section at y is an element in the sigma algebra A .

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This, we had proved and I am just recalling them. Then, we proved that the function x going to ν measure of E_x , E_x is a sub set of B is an element in the sigma algebra B and ν is a measure defined there.

We can compute, what is ν of E_x and the claim is that the functions for every x , the image being ν of E_x ; this is a function defined on X and the claim is it is a measurable. Similarly, function y going to the measure of the y section is a measurable function on the set Y with respect to sigma algebra A . These two we had proved and we wanted to prove finally the third one. If we integrate these functions with respect to μ and with respect to ν , these are non-negative measurable functions and we can integrate them. So, the claim is that the integral $\nu(E_x)$ and $d\mu(x)$ is same as the product measure $\mu \times \nu$ of E and it is same as the integral of the y section with respect to ν .

This is the step we were trying to prove in the previous lecture. To prove this, what we said let us look at the class of those sub sets E in the product sigma algebra for which this is true.

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Product of measures-recall

- (ii) The functions
$$x \mapsto \nu(E_x)$$
and
$$y \mapsto \mu(E^y)$$
are measurable functions on X and Y , respectively,
- (iii) and
$$\int_X \nu(E_x) d\mu(x) = (\mu \times \nu)(E) = \int_Y \mu(E^y) d\nu(y)$$

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We constructed the class \mathcal{P} . All those sub sets in the product sigma algebra such that the previous to claims, this claim 2 and claim 3 are both hold x going to νE_x and y going to μE_y are measurable functions.

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Product of measures-recall

- Let $\mathcal{P} := \{E \in \mathcal{A} \otimes \mathcal{B} \mid \text{(ii) and (iii) hold}\}$.

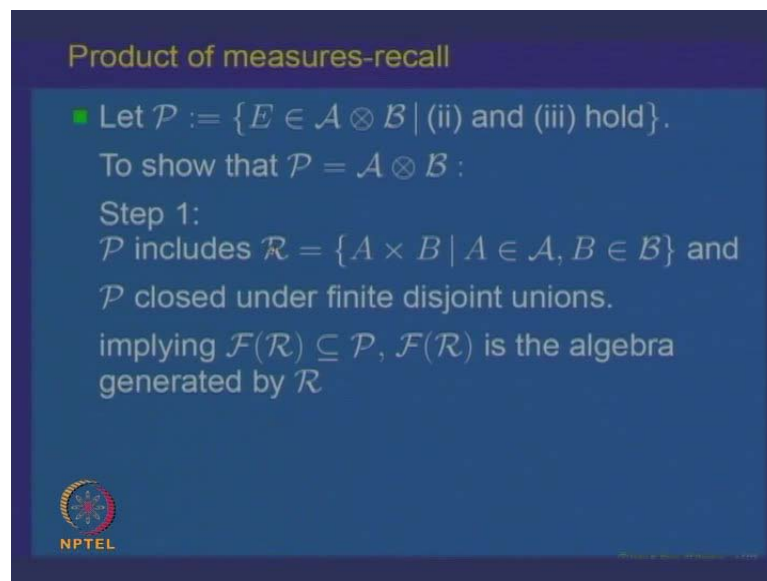
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\mathcal{P} is the family of all sub sets A cross B such that the property 2 and 3 hold. Let us just recall, what the properties 2 and 3 are.

Property 2 is that x going to $\nu \int_E x$ and y going to $\mu \int_E y$, these are non-negative measurable functions.

The property 3 says that, the integrals of $\nu \int_E x$ with respect to μ is same as the integral of $\mu \int_E x$ with respect to ν and both are equal to the product measure of E . So, both these properties holds for a set E then that set is in the collection \mathcal{P} .

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Product of measures-recall

- Let $\mathcal{P} := \{E \in \mathcal{A} \otimes \mathcal{B} \mid \text{(ii) and (iii) hold}\}$.

To show that $\mathcal{P} = \mathcal{A} \otimes \mathcal{B}$:

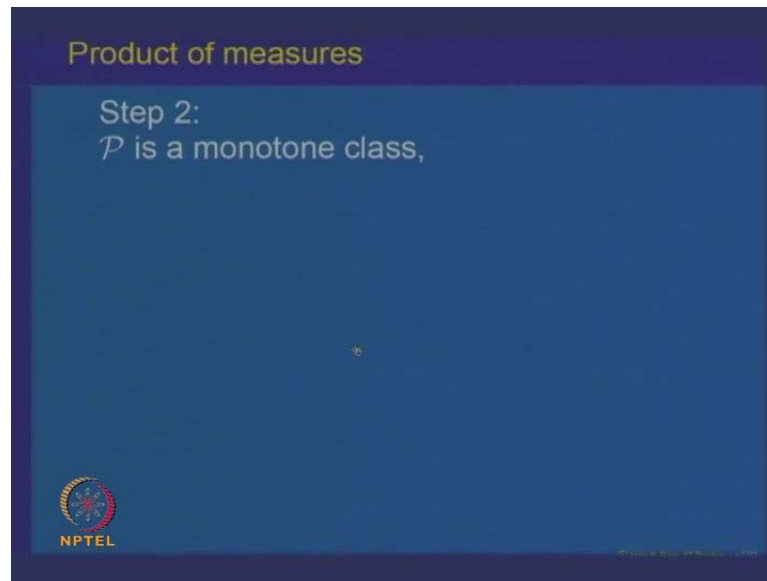
Step 1:
 \mathcal{P} includes $\mathcal{R} = \{A \times B \mid A \in \mathcal{A}, B \in \mathcal{B}\}$ and
 \mathcal{P} closed under finite disjoint unions.
implying $\mathcal{F}(\mathcal{R}) \subseteq \mathcal{P}$, $\mathcal{F}(\mathcal{R})$ is the algebra
generated by \mathcal{R} .

 NPTEL

Our aim is to prove that \mathcal{P} is equal to the product sigma algebra \mathcal{A} cross \mathcal{B} . We already observed in the previous lecture to show this. The first step is to prove that this class \mathcal{P} includes the rectangles. So, that is 1 and that we had proved. Also, we had proved that this class \mathcal{P} is closed under finite disjoint unions. Once this class \mathcal{P} is closed under finite disjoint unions and includes the rectangles, the rectangles form semi algebra. So, the algebra generated by it looks like the class of sets, which are finite disjoint union of rectangles and \mathcal{P} being closed under such operations, we will get that. As a consequence of this, the algebra $\mathcal{F}(\mathcal{R})$ generated by these rectangles is also inside \mathcal{P} .

As a consequence of step 1, we get that the algebra generated by the rectangles is inside the class \mathcal{P} .

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The second step, we wanted to prove that this class \mathcal{P} is a monotone class. The reason for prove that it is a monotone class, it is directly difficult to show that it is a sigma algebra because if you could show directly that \mathcal{P} is a sigma algebra. It includes algebra generated by a rectangle. Then, it will include the sigma algebra generated by it that direct route is not possible.

We follow the monotone class result. If, we are able to show that \mathcal{P} is a monotone class and \mathcal{F} \mathcal{R} being inside it the monotone class generated by \mathcal{F} \mathcal{R} will be inside \mathcal{P} and \mathcal{F} \mathcal{R} being algebra the monotone class generated by algebra is same as the sigma algebra generated by that class.

We will get that the sigma algebra generated by a rectangles will be inside \mathcal{P} and that is precisely what we want to show and that is A times B because the sigma algebra generated by rectangles is the product sigma algebra A cross B .

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$$\mathcal{P} = \left\{ E \in \mathcal{A} \otimes \mathcal{B} \mid \begin{array}{l} x \mapsto \nu(E_x) \\ y \mapsto \mu(E_y) \end{array} \right\} \text{ m.k.f.}$$

and $\int_X \nu(E_x) d\mu(x) = \int_Y \mu(E_y) d\nu(y) = (\mu \times \nu)(E)$

(1) Let $E_n \in \mathcal{P}, n \geq 1, E_n \uparrow$. To show $E = \bigcup_{n=1}^{\infty} E_n \in \mathcal{P}$?

$x \mapsto \nu(E_x)$ is \mathcal{A} -m.k.f.?
 $E_n \in \mathcal{P} \Rightarrow x \mapsto \nu(E_{n,x})$ is m.k.f. $\forall n$.

To complete that proof, we have to only show that the class \mathcal{P} is a monotone class. Let us start proving that \mathcal{P} is a monotone class.

So, \mathcal{P} is the class of all those sub sets E belonging to the product sigma algebra \mathcal{A} times \mathcal{B} such that if we look at set x going to take the E take it sections x that is the sub set of the set y in the sigma algebra \mathcal{B} so nu of that make sense so we get this function so this is measurable and the function y going to mu of E_y that is E is measurable. So, both these functions are measurable and the property that if you integrate nu of E_x with respect to mu; we are integrating over X this is same as the integral over Y of the second function mu of E_y with respect to ν and both of them are equal to the product sigma algebra mu cross nu of E .

This is the collection of all the sets E in the product sigma algebra this holds and we want to show that \mathcal{P} is a monotone class. Let us look at the first property, let E_n belong to \mathcal{P} and E_n be a collection of sets in the class \mathcal{P} say that E_n is increasing. To show that the set E , which is equal union of E_n 's also belongs to \mathcal{P} .

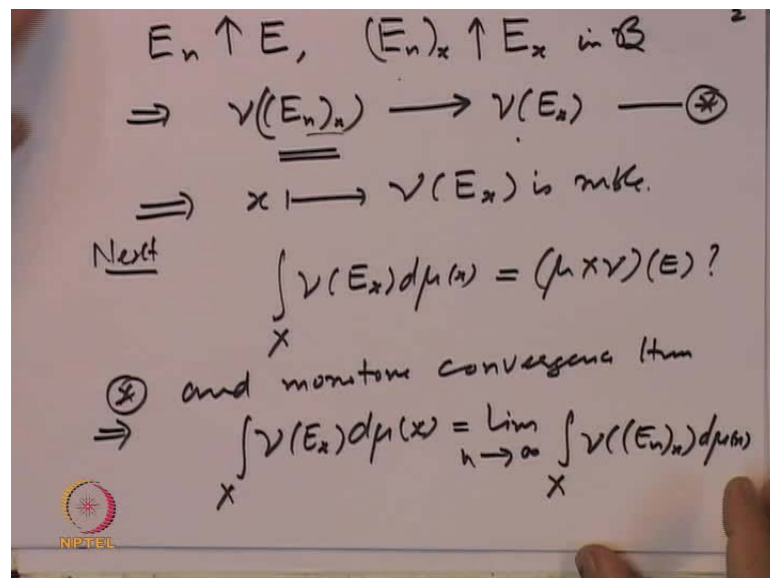
This is what we have to show first. The \mathcal{P} is a monotone class; we have to show it is closed under increasing unions and decreasing intersections.

That is the two properties we have to check. Let us take a sequence E_n in \mathcal{P} , which is increasing and let us say E is the union of this E_n 's. So, the claim is that E belongs to \mathcal{P} .

What we have to do? We have to look at the corresponding. What is the first property? We have to check. To check that E belongs, we have to look at ν of E_x . So, the first thing we have to show is that this is measurable and A is measurable function.

To do that, let us observe the following. This is what we have to show. Each E_n belongs to \mathcal{P} , which implies that x going to ν of E_n , its section at x is measurable for every n . So, this is what is given to us and we want to come to ν of E_x .

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But for that, let us observe that as E_n is increasing to E , the sections $(E_n)_x$ is increasing sequence of sets increasing to E_x . This is a sequence of sets in the sigma algebra \mathcal{B} .

So, that we have already seen, if a is a sub set of b then the section of a is the sub set of section of b . So, that will prove that the sections are increasing and increase to the union. So, union of the sections, union of $(E_n)_x$ is same as union of each $(E_n)_x$ and hence, this is increasing to E_x . This is a simple observation using the properties of the sections.

E_n is increasing and now you recall that ν being a measure, if a sequence of sets increases to another set, which implies that ν of E_n , the sections that will increase that will converge to ν of E . So, that proves ν of E_n increases.

Each one of them is a measurable function. So, ν of E is a limit of measurable functions, which implies that x going to ν of E is measurable.

Basically, what we are saying is because ν of E , the function x going to ν of E is a limit of the functions ν of E_n of x . That comes from the fact because E_n is increasing to E , the sections E_n is increased to the section E . That means, in the sigma algebra B and ν being a measure and ν of E_n must converge to ν of E and each one of them being measurable because it is in the collection P .

Each is a measurable function. So, limit of measurable functions is measurable. That proves one part that x going to ν of E is measurable.

Next, what we have to check is the following. We have to check that $\int \nu$ of E $d\mu$ over X is equal to μ cross ν of E . This is what we want to check.

Once again let us go back to the earlier fact. We saw that ν of E_n the sections is measurable functions; these are actually non negative measurable functions and they are converging to the function ν of E . That is an increasing sequence of measurable functions. This is ν of E_n is an increasing sequence of non-negative measurable functions converging to a measurable function ν of E . We can apply our monotone convergence theorem that says so once again this property star star and monotone convergence theorem apply and apply and they give us as a consequence that $\int \nu$ of E $d\mu$ over X because ν of E is a limit of increasing sequence of non-negative measurable functions.

$\int \nu$ of E must be equal to limit n going to infinity of the integrals of the corresponding sequence of non-negative measurable functions. They are ν of E_n section at x $d\mu$ over X . This is an application of monotone convergence theorem.

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$$= \lim_{n \to \infty} \int (\mu \times \nu)(E_n)$$

$$\int_X \nu(E_n) d\mu(x) = (\mu \times \nu)(E)$$

$$\Rightarrow E \in \mathcal{P}$$

Next $E_n \in \mathcal{P}, n \geq 1, E_n \downarrow E, \text{ i.e.}$

$$E = \bigcap_{n=1}^{\infty} E_n.$$

Claim $E \in \mathcal{P}?$

Let us observe that E_n belongs to the class \mathcal{P} . The property 2 says that if I integrate ν of E_n section with respect to μ , this integral is equal to the product measure $\mu \times \nu$ of E_n .

That is because E_n belongs to class \mathcal{P} . So, by the third property of that collections of set in \mathcal{P} that means ν of $\mu \times \nu$ of the product measure of E_n is the integral of the sections with respect to x . We can say that this integral is equal to limit n going to infinity of $\mu \times \nu$ of E_n .

Once that is true, we want to look at this limit. Let us observe that E_n is an increasing sequence of sets in the sigma algebra $\mathcal{A} \times \mathcal{B}$ and $\mu \times \nu$ is a measure. Once again, using the property of measure that if a sequence of sets is increasing then the measure of limit of the measure of the sequence is equal to measure of the limit that is equal to $\mu \times \nu$ of E .

Once again, we use the effect if E_n is increasing to E and $\mu \times \nu$ is a measure, this limit must be equal to $\mu \times \nu$ of E .

What we get is that this limit is equal to this. That means, we get that ν of integral over X ν of $E \times d\mu \times \nu$ is equal to $\mu \times \nu$ of E .

We had proved that if E_n is increasing, this implies that E belongs to the class P because we showed that E_n is increasing to E then both the property holds for this.

Now, we want do the similar thing for decreasing. Next, let us consider E_n belonging to P_n bigger than or equal to 1 and E_n 's decrease to E that is E is equal to intersection E_n 's n equal to 1 to infinity.

We want to claim that E belongs to P . This is what we want to check. So, we can try to copy the proof for the increasing case. Let us go back to the proof of the increasing case and let us see, we can carry over the proof by saying similarly.

Now, we have got E_n 's decreasing because E_n 's belong, what we said first thing was that because E_n 's belong to P . This is a measurable function that is a property of the set E_n being in the class P increasing or decreasing is not coming into picture. This step will carry over and then if E_n is increasing to E , we have got E_n is decreasing to E . This thing will change. If E_n 's are decreasing then it is true that the sections $E_n(x)$ will be decreasing to the section of the set E at x . So, the sections $E_n(x)$ will decrease to the set $E(x)$ so that that step also will be ok.

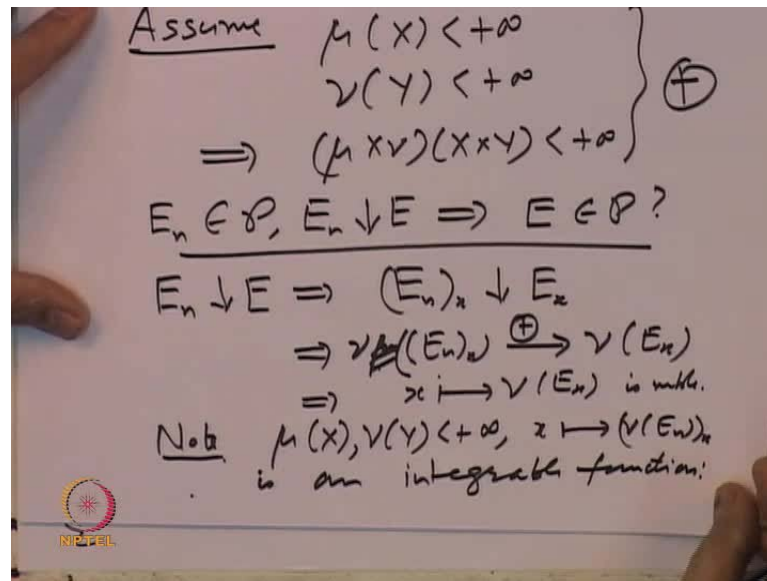
Now, we want to say that when E_n 's decrease to E , we want to say that here we use the property that for the increasing case. We said whenever a sequence increasing ν_n of E_n 's converge the corresponding result we know is not true for decreasing sequences.

Here, the proof trying to copy the proof for the increasing thing will fell down because these steps will not this equation star will not hold.

To make this star hold, we have to put an extra condition that the measures are finite because if measures are finite then E_n decreasing to E will imply measures converge.

So, if E_n μ and ν_n are finite, for example if μ is finite then E_n sections of each E_n that is a decreasing sequence. So, ν_n of E_n will converge.

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To carry over the proof; in the similar case, we have to put extra conditions. So for this claim to hold, we have to assume that μ and ν are finite. Let us assume that μ of X is finite and ν of Y is finite that implies $\mu \times \nu$ of $X \times Y$ is finite.

Under these conditions, we want to show that if E_n belongs to P E_n 's decrease to E that implies E belongs to P .

To show that, we can repeat the steps. So, E_n 's let me just go through the proof again but the decreasing case also to emphasize we are exactly will be using the finiteness condition. So, E_n 's decrease to E so that implies that the sections $E_n \times$ decrease to E of x

That implies ν of $E_n \times$, because $E_n \times$ is a subset of B . This converges to ν of $E \times$. This is the stage, where will be using this condition. Under this condition, μ and ν are finite. Now, each E_n belongs to P . So, each one of them is a measurable functions that will imply x going to ν of $E \times$ is measurable.

This is a measurable function and we have got ν of $E_n \times$ decreases to ν of $E \times$. Earlier, we use monotone convergence theorem to conclude that ν of $E \times$ integral of ν of $E \times$ must be limit but here it is a decreasing sequence. So, we cannot use monotone convergence theorem here.

But let us note here that because μ of X is finite, ν of Y is finite. So, this function $\nu \circ \mu$ going to each of the functions $\nu \circ E_n$ is an integrable function.

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$$\nu((E_n)_x) \leq \nu((E_1)_x)$$

and $\int_X \nu((E_1)_x) d\mu(x) \leq \nu(Y) \mu(X) < +\infty$

Dominated convergence theorem

$$\left(\nu((E_n)_x) \downarrow \nu(E_n) \right)$$

$$\int_X \nu(E_n) d\mu(x) = \lim_{n \rightarrow \infty} \int_X \nu((E_n)_x) d\mu(x)$$

$$= \lim_{n \rightarrow \infty} \int_X \nu(E_n) d\mu(x)$$

Why is that? It is a decreasing sequence. Let us observe, $\nu \circ E_n$ for every n if I look at this non negative function, it is less than or equal to $\nu \circ E_1$ of x and $\nu \circ E_1$ of x is less than or equal to $\nu \circ E_1$, $\nu \circ E_1$ of x is less than or equal to $\nu \circ Y$ and so this is integrable is less than $\nu \circ Y$. So, this integral of $\nu \circ E_1$ $d\mu$ x is less than μ of X , which is finite.

So, $\nu \circ E_1$ of x is an integrable function on the measure space Y B ν and each $\nu \circ E_n$ of x is less than or equal to $\nu \circ E_1$ of x and each $\nu \circ E_n$ of x is integrable.

We can apply Dominated convergence theorem. Dominated convergence theorem applies to the fact that $\nu \circ E_n$ of x , which is a sequence of non-negative integrable functions and they are decreasing to the integrable function $\nu \circ E$ of x .

This is also integrable, which implies by dominated convergence theorem. This observation that the function $\nu \circ E$ of x $d\mu$ x over X , this function is integrable. Its integral is nothing but the limit n going to infinity of integrals $\nu \circ E_n$ of x $d\mu$ x .

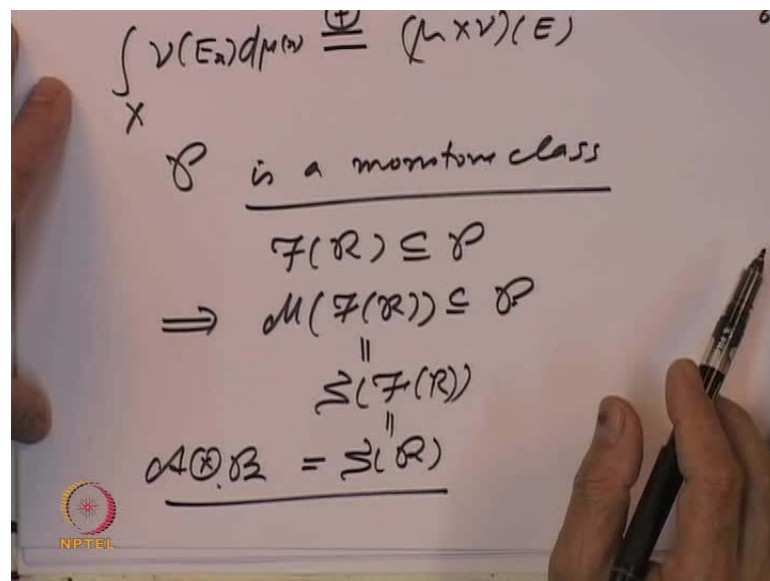
For the decreasing sequence, the proof differs in both the steps; first of all when we want to say that E_n 's are decreasing the sections decrease. So, the finiteness condition allows

us to say that ν of E is a limit of this functions and that implies that this is a measurable function.

Finiteness say this function is measurable because of this fact, the finiteness condition says this is a sequence of integrable function decreasing to the function. So dominated convergence theorem can be applied and that gives us so this limit is equal to ν of E integration with respect to μ is limit of and now the proof is as before this E_n being in the collection P . So, this integral is nothing but measure of μ cross ν of the set E_n .

That is limit n going to infinity of measures of the sets E_n and once again E_n 's are decreasing to E and μ cross ν is a finite measures. So that will imply so this is equal to μ cross ν of E , again using the fact that μ and ν are finite.

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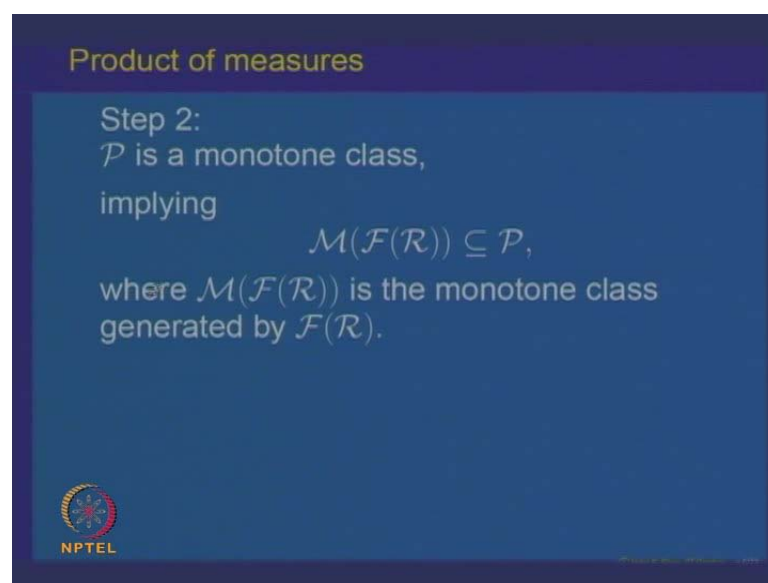
We get the conclusion that using finiteness condition the integral ν of E \times $d\mu$ \times over X is equal to; we have already shown it is the class P is closed under increasing sequences. Now, we have shown it is closed under decreasing sequences. So, P is a monotone class. That proves that P is a monotone class.

As a consequence of the fact that P is a monotone class, the consequence of this would be namely - we already have \mathcal{F} of \mathcal{R} is inside the class P and P is a monotone class, which will imply that the monotone class generated by \mathcal{F} of \mathcal{R} will also be inside P but this is

nothing but the sigma algebra generated by the class \mathcal{R} of rectangles are same as the sigma algebra generated by rectangles and that is same as the product sigma algebra.

So, this will prove that the product sigma algebra is equal to \mathcal{P} namely that the required conditions hold for the corresponding that proves step 2 namely - \mathcal{P} is a monotone class and that implies that the monotone class generated by \mathcal{F} of \mathcal{R} is inside \mathcal{P} .

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Hence this will prove that monotone class generated by \mathcal{F} of \mathcal{R} is algebra. So, the monotone class generated by algebra is precisely the sigma algebra generated by \mathcal{E} and \mathcal{A} cross \mathcal{B} will be inside the class \mathcal{P} . Hence, everything is inside so \mathcal{A} cross \mathcal{B} is equal to \mathcal{P} .

This is a theorem, where we have used very sensibly the fact that when μ and ν are finite; in that case, we can extend that argument of the increasing to the case of decreasing also. This also illustrates the technique the monotone class sigma algebra technique.

We have approved the theorem required claim that \mathcal{P} is a monotone class under the conditions μ and ν is finite.

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Product of measures

proof step 2:


- Let $E = A \times B \in \mathcal{R}$. Then

$$\nu(E_x) = \nu(B)\chi_A(x) \quad \forall x \in X,$$
$$\mu(E_y) = \mu(A)\chi_B(y) \quad \forall y \in Y.$$

implying

$$x \mapsto \nu(E_x) \text{ and } y \mapsto \mu(E_y)$$

are measurable functions,



Now, with the usual arguments one can extend to the case when it is sigma finite. Let us see that, but before doing that let me just go through the proof of the step 2 again to illustrate the basic facts.

The first thing we looked at was, if E is a product set A cross B . So, I am just reversing the proof of step 2 to highlight the important points in the proof.

So, A cross B belongs to \mathcal{R} is a rectangle then ν of E_x was the first step showing the \mathcal{R} is the class \mathcal{R} includes rectangles. There we use the fact that if you take a set, which is a rectangle then its section is nothing but either the set A or the set B or the empty set according to the point x or y .

So, ν of E_x is nothing but ν of B times the indicator function of x because if x does not belong to A then this is 0 and the section is just B . Similarly, μ of E_y is μ of A times the indicator function of B .

These two facts prove that x going to ν of E_x and y going to μ of E_y for rectangles is measurable functions.

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Product of measures

and


$$\int_X \nu(E_x) d\mu(x) = \mu(A)\nu(B) = \int_Y \mu(E^y) d\nu(y).$$

Thus $\mathcal{R} \subseteq \mathcal{P}$.

Next, for $E_1, E_2 \in \mathcal{P}$ with $E_1 \cap E_2 = \emptyset$,

$$(E_1)_x \cap (E_2)_x = \emptyset \text{ and } (E_1 \cup E_2)_x = (E_1)_x \cup (E_2)_x.$$

Hence

$$\nu((E_1 \cup E_2)_x) = \nu((E_1)_x) + \nu((E_2)_x).$$


If we integrate this integral of ν will be equal to ν of B into μ of A . So this is the product measure of the product set A cross B . That says the rectangles are inside it and so that is the straight forward argument, which says rectangles comes inside \mathcal{P} .


Showing that \mathcal{P} is closed under finite disjoint unions, this also straight forward because that follows from the fact that E_1 and E_2 are 2 sets in the class \mathcal{P} , which are disjoint.

Then, the sections are disjoint of these two sets and the sections of the union are equal to union of the sections. As a consequence of this, the ν of the section of the union section of union so $E_1 \cup E_2$ section at x μ of that is addition ν of $E_1 \times$ plus ν of $E_2 \times$ because the sections are disjoint and E_1 and E_2 both belong to \mathcal{P} imply these two are measurable functions. Hence, the sum of measurable functions is measurable so this becomes measurable.

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Product of measures

- Thus $x \mapsto \nu((E_1 \cup E_2)_x)$ is measurable and
$$\begin{aligned}\int_X \nu((E_1 \cup E_2)_x) d\mu(x) &= \int_X [\nu((E_1)_x) + \nu((E_2)_x)] d\mu(x) \\ &= (\mu \times \nu)(E_1) + (\mu \times \nu)(E_2) \\ &= (\mu \times \nu)(E_1 \cup E_2).\end{aligned}$$
- Similarly, $y \mapsto \mu((E_1 \cup E_2)^y)$ is measurable and
$$\int_Y \mu((E_1 \cup E_2)^y) d\nu(y) = (\mu \times \nu)(E_1 \cup E_2).$$



That is the straight forward proof of fact that, if E_1 and E_2 belong to \mathcal{P} then $E_1 \cap E_2$ and $E_1 \cup E_2$ also belongs to \mathcal{P} . Finally, look at the integral, integral of ν of the section of the union because that splits into two parts. So, ν of $E_1 \cup E_2$ is ν of E_1 plus ν of E_2 with respect to μ .

The integral splits into two parts that is $\mu \times \nu$ of E_1 because E_1 belongs to \mathcal{P} and this is $\mu \times \nu$ of E_2 because E_2 belongs to \mathcal{P} .

Now, using the fact that $\mu \times \nu$ is a measure that gives us this equal to $\mu \times \nu$ of $E_1 \cup E_2$.

Similar thing will work for the y sections. So, proving that rectangles are inside the class \mathcal{P} and \mathcal{P} is closed under finite disjoint unions is there other straight forward computation.

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Product of measures


Hence \mathcal{P} is closed under finite disjoint unions.

- Finally, to show that \mathcal{P} is a monotone class, first assume that both μ and ν are finite.

For $E_n \in \mathcal{P}, n \geq 1$, with $E_n \subseteq E_{n+1} \forall n$ and $E = \bigcup_{n=1}^{\infty} E_n$,

$$(E_n)_x \subseteq (E_{n+1})_x \text{ and } (E_n)^y \subseteq (E_{n+1})^y.$$

implying



The problem arise is when we want to show that \mathcal{P} is a monotone class. So, there we first assume that μ and ν are finite. Once μ and ν are finite, we want to show it is closed under increasing union and decreasing intersections. Take a sequence of sets E_n 's which is increasing.

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Product of measures

$$\{\nu((E_n)_x)\}_{n \geq 1} \text{ and } \{\mu((E_n)^y)\}_{n \geq 1}$$

are increasing sequences of nonnegative measurable functions.

Hence, $\lim_{n \rightarrow \infty} \nu((E_n)_x) = \nu(E_x)$ and $\lim_{n \rightarrow \infty} \mu((E_n)^y) = \mu(E^y)$.

By the monotone convergence theorem, $x \mapsto \nu(E_x)$ and $y \mapsto \mu(E^y)$ are nonnegative measurable functions with




Simple fact that if E_n 's are increasing, the sections are increasing and μ and ν being measures imply μ of the sections E_n 's will converge to μ of E . So, μ of E_x and ν of E^y are limits of limits of measurable functions. So, they become measurable.

Till now, no finiteness condition has been used. So, this is true whenever μ and ν are any two measures.

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Product of measures

$$\left. \begin{aligned} \int_X \nu(E_x) d\mu(x) &= \lim_{n \rightarrow \infty} \int_X \nu((E_n)_x) d\mu(x), \\ \int_Y \mu(E^y) d\nu(y) &= \lim_{n \rightarrow \infty} \int_Y \mu((E_n)^y) d\nu(y). \end{aligned} \right\}$$


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Product of measures


- Since $E_n \in \mathcal{P} \forall n \geq 1$,

$$\int_X \nu((E_n)_x) d\mu(x) = (\mu \times \nu)(E_n)$$

$$= \int_Y \mu((E_n)^y) d\nu(y).$$

Thus

$$\int_X \nu(E_x) d\mu(x) = \lim_{n \rightarrow \infty} (\mu \times \nu)(E_n)$$


$$= \int_Y \mu(E^y) d\nu(y).$$


For the decreasing part, we will need the finiteness condition. So, for the increasing part everything goes straight monotone convergence theorem application gives you ν of E_x is limit of that and that is equal to the product measure and everything is ok.

(Refer Slide Time: 30:44)

Product of measures

- Similarly, if $E_n \in \mathcal{P}$ and $E_n \supseteq E_{n+1} \forall n \geq 1$, using the fact that μ, ν and $\mu \times \nu$ are finite, we show $\bigcap_{n=1}^{\infty} E_n \in \mathcal{P}$, the main step being

$$\lim_{n \rightarrow \infty} \nu((E_n)_x) = \nu(E_x), \quad \lim_{n \rightarrow \infty} \mu((E_n)^y) = \mu(E^y)$$
$$\lim_{n \rightarrow \infty} (\mu \times \nu)(E_n) = (\mu \times \nu)(E),$$


Let us look at the part, where we find difficulty arises. So, difficulty arises, when we want to show that E_n belongs to \mathcal{P} and E_n 's are decreasing then the set E , which is a intersections of E_n also belongs to \mathcal{P} .

Here, the main step is to conclude that ν of $E_n \times x$ is equal to ν of $E \times x$.

For that we need finiteness condition because whenever a set a sequence of sets is decreasing to a set. Then measure of the sets need not converge to measure of the limiting set unless the measures are finite.

Finiteness conditions will give us that and then instead of monotone convergence theorem, we can apply the dominated convergence theorem to conclude that $\mu \times \nu$ of E_n is equal to corresponding integral.

So, that will prove that μ and ν being finite. \mathcal{P} is a monotone class but still we are not concluded the proof for the general case. For the general case, one can apply the usual sigma finiteness criteria namely - whenever to measure a sigma finite, the whole space can be cut up into finite number countable disjoints pieces. Each of finite measure and on each the result holds and put them together to get the result holds for the whole space.

(Refer Slide Time: 32:08)

Product of measures


Thus \mathcal{P} is a monotone class when μ, ν are finite measures.

In the general case, usual σ -finite arguments apply.

μ and ν are σ -finite, imply

$$X = \bigcup_{j=1}^{\infty} A_j \text{ and } Y = \bigcup_{i=1}^{\infty} B_i,$$

where $\forall i, j, A_i \in \mathcal{A}, B_j \in \mathcal{B}$ with $\mu(A_i) < +\infty$ and $\nu(B_j) < +\infty$.



Let us see the argument, how it works? Because μ and ν are sigma finite, X can be decompose into a disjoint union of sets A_i and Y can be decompose into a union of sets B_j . Such that disjoint unions μ of each A_i is finite and ν of each B_j is finite.


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Product of measures

Then

$$(\mu \times \nu)(A_i \times B_j) < +\infty \quad \forall i, j.$$

For $E \in \mathcal{A} \otimes \mathcal{B}$, by the earlier discussion, we have $\forall i, j$

$$\begin{aligned} \int_X \nu((E \cap (A_i \times B_j))_x) d\mu(x) &= (\mu \times \nu)(E \cap (A_i \times B_j)) \\ &= \int_Y \mu((E \cap (A_i \times B_j))^y) d\nu(y). \end{aligned}$$


Using that, we can write down that $\mu \times \nu$ of $A_i \times B_j$ is finite because this is nothing but μ of A_i times ν of B_j . As a consequence, on each of these pieces our earlier results hold the \mathcal{P} was a monotone class.

Let us see, how that is use to prove for a general set E in $A \times B$. For a set, in the sigma algebra $A \times B$ note that the integral of the measure ν of $E \cap A_i \times B_j$ is finite because each ν of each of these sets has got finite measure.

We are applying the earlier result on the piece $A_i \times B_j$. For every i and j using the earlier case, we have that the integral over X of the x sections of $E \cap A_i \times B_j$ is nothing but $\mu \times \nu$ of $E \cap A_i \times B_j$ and that is equal to the μ integral of the Y sections of the corresponding sets.

This step follows basically from the fact that $\mu \times \nu$ of $A_i \times B_j$ is finite. For any set, $E \cap A_i \times B_j$ and on that rectangle μ and ν are finite. So, this earlier case gives us the result.

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Product of measures

Thus

$$\begin{aligned}
 (\mu \times \nu)(E) &= \sum_{i=1}^{\infty} \sum_{j=1}^{\infty} (\mu \times \nu)((A_i \times B_j) \cap E) \\
 &= \sum_{i=1}^{\infty} \sum_{j=1}^{\infty} \int_X \nu((E \cap (A_i \times B_j))_x) d\mu(x) \\
 &= \sum_{i=1}^{\infty} \sum_{j=1}^{\infty} \int_Y \mu((E \cap (A_i \times B_j))_y) d\nu(y).
 \end{aligned}$$

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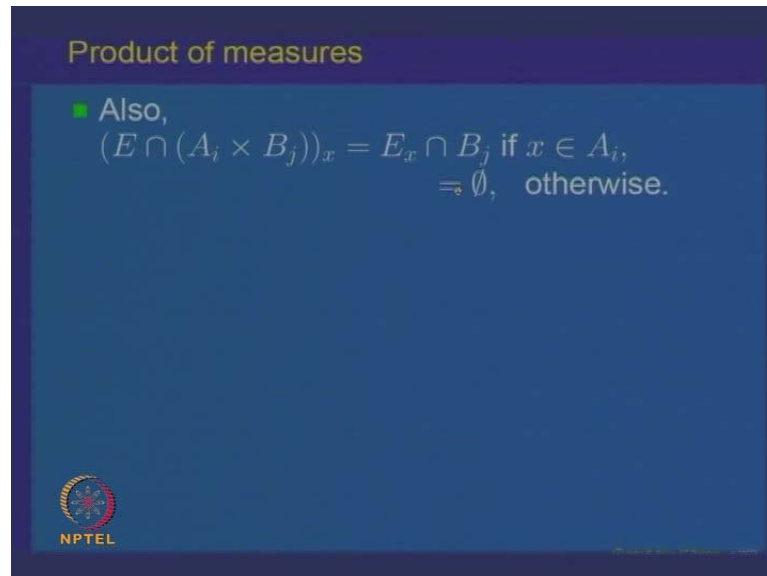
Now, we have to only sum both sides with respect to i and j . Let us look at $\mu \times \nu$ of E which is equal to or the whole space is equal to union over i and j of the rectangles $A_i \times B_j$ that is a partition.

So, $\mu \times \nu$ of E can be written as using countable additivity of the measure $\mu \times \nu$. As summation over i , summation over j and $\mu \times \nu$ of the pieces $A_i \times B_j$. Now, for each one of this piece, we know the result holds. So, I can write this as integral of the x sections or as integrals of the y sections.

This term $\mu \times \nu$ of $A_i \times B_j$ intersection E is equal to this integral or this integral because of the fact that for the finite case the result holds.

Now, using the fact that if you look at the section $E \cap A_i \times B_j$ of x . This section is nothing but ν of E_x times A_i cross.

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So, this is a small observation that you will look at set E and take its piece inside the rectangle $A_i \times B_j$ and take its section. So, this section is going to be equal to the section of E intersection with B_j . Of course, if x belongs to A_i and x does not belong to A_i then there is not going to be any intersection. So, this is going to be an empty set.

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Product of measures

- Also,
 $(E \cap (A_i \times B_j))_x = E_x \cap B_j$ if $x \in A_i$,
 $= \emptyset$, otherwise.
- Thus, by monotone convergence theorem,


$$\begin{aligned} & \sum_{i=1}^{\infty} \sum_{j=1}^{\infty} \int_X \nu((E \cap (A_i \times B_j))_x) d\mu(x) \\ &= \sum_{j=1}^{\infty} \left(\sum_{i=1}^{\infty} \int_{A_i} \nu(E_x \cap B_j) d\mu(x) \right) \end{aligned}$$


This is the observation and that observation can be used in this part that if x does not belong to A_i , then this thing is going to be 0. Using that we can write that sum. So this sum which was integral over X of E intersection **this can be written as so this set is nothing but ν of E_x intersection B_j** because that is the only place, where the section appears.

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Product of measures

Hence, $(\mu \times \nu)(E)$

$$\begin{aligned} &= \sum_{j=1}^{\infty} \int_X \nu(E_x \cap B_j) d\mu(x) \\ &= \int_X \left(\sum_{j=1}^{\infty} \nu(E_x \cap B_j) \right) d\mu(x) \\ &= \int_X \nu(E_x \cap (\cup_{j=1}^{\infty} B_j)) d\mu(x) \\ &= \int_X \nu(E_x) d\mu(x). \end{aligned}$$


When x belongs to A_i , this is integral over $A_i \times \nu(E_x \cap B_j)$. So, this integral is equal to this because of this fact. Now, the summation over i means that this integral is over X . This summation you can transform into integral over X .

Now, you can interchange the two integral and the summation again you will be using fact here that this is an integral, which depends on j . So, you can push it out and take it inside basically you will be applying implicitly a monotone convergence theorem. To say that this is equal to, I can take the integral sign X and because this is the sequence of functions, which are non-negative measurable and so on.

Here, an application of monotone convergence theorem, which helps you to interchange summation and the integral sign. So, summation goes inside and now summation over B_j is disjoint that gives you over the whole space Y so that is just E_x .

We get that $\mu \times \nu$ of E is equal to the integral of the section ν of E_x $d\mu(x)$. You see here, almost every step we are using sum theorem or the other to justify the facts. This is the case for the x sections and the similar results will hold for y sections.

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Product of measures

- Similarly,

$$\begin{aligned}
 (\mu \times \nu)(E) &= \sum_{i=1}^{\infty} \sum_{j=1}^{\infty} \int_Y \mu((E \cap (A_i \times B_j))^y) d\nu(y) \\
 &= \int_Y \mu(E^y) d\nu(y),
 \end{aligned}$$

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That will prove that $\mu \times \nu$ is also equal to integral over the y sections and that will complete the proof of the fact that one can reduce the result in the case of sigma finite. So, from finite to sigma finite is almost straight forward in the sense that we can split the

whole space into countable number of pieces of finite measure. So, on each piece we apply and then submit up to go back to the original piece.


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Product of measures Remark:

- The product measure space $(X \times Y, \mathcal{A} \otimes \mathcal{B}, \mu \times \nu)$ need not be a complete measure space even if the measure spaces (X, \mathcal{A}, μ) and (Y, \mathcal{B}, ν) are complete.
- For example, if

$$A \subset X, A \notin \mathcal{A} \text{ and } \emptyset \neq B \in \mathcal{B} \text{ } \mu(B) = 0,$$
 then

$$(\mu \times \nu)^*(A \times B) = 0, \text{ but } A \times B \notin \mathcal{A} \otimes \mathcal{B}.$$



We have proved the theorem namely how to compute the measure of a product set.

Let us observe one thing here, even if we start with measure spaces X \mathcal{A} μ and Y \mathcal{B} ν to be complete, the product measure space which we are denoting by X cross Y \mathcal{A} times \mathcal{B} μ cross ν need not be complete.

Because how do we get this measure μ cross ν on A cross B , we looked at product μ cross ν on rectangles and extended it and defined the outer measure and then looked at measurable sets μ cross ν and that included the sigma algebra.

This \mathcal{A} times \mathcal{B} the product sigma algebra is not the sigma algebra with respect to which of all μ cross ν measurable sets. So, it may not be complete say for example, you can take any set A in X such that A does not belong to the algebra \mathcal{A} .

Take any non-empty set B of measure 0, then the outer measure of μ cross ν will be equal to 0 because μ of B is equal to 0.


But the rectangle A cross B does not belong to product sigma algebra because A does not belong to \mathcal{A} . In case, one wants to look at the completion of this, which is possible.

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Product of measures Remark:

- In fact, if $\overline{\mathcal{A} \otimes \mathcal{B}}$ is the σ -algebra of $(\mu \times \nu)^*$ -measurable subsets of $X \times Y$, then, $\mathcal{A} \times \mathcal{B} \subseteq \overline{\mathcal{A} \otimes \mathcal{B}}$, and $(X \times Y, \overline{\mathcal{A} \otimes \mathcal{B}}, \mu \times \nu)$, is a complete measure space.

The measure space $(X \times Y, \overline{\mathcal{A} \otimes \mathcal{B}}, \mu \times \nu)$ is nothing but the completion of the measure space $(X \times Y, \mathcal{A} \otimes \mathcal{B}, \mu \times \nu)$.




If we look at the sigma algebra $\mathcal{A} \times \mathcal{B}$ and denote that to be the sigma algebra of $\mu \times \nu$ measurable product sub sets. The product space, then of course that the product sigma algebra is inside it and that will be a complete measure space. We can say that $X \times Y$ and $\mu \times \nu$ measurable sets as before is the completion of product measure space $X \times Y$ $\mathcal{A} \times \mathcal{B}$ $\mu \times \nu$.

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Product of measures

- Further, for $E \in \overline{\mathcal{A} \otimes \mathcal{B}}$ the functions $x \mapsto \nu(E_x)$ and $y \mapsto \mu(E^y)$ are measurable and

$$\int_X \nu(E_x) d\mu(x) = (\mu \times \nu)(E) = \int_Y \mu(E^y) d\nu(y)$$


This is just a small observation, which we should keep in mind that the product sigma algebra, which is a sigma algebra generated by the rectangles need not be giving you a complete measures space.

However, one can always complete it and the corresponding result holds for sets in A times B that is a small technical results, which we can proved. We had proved this result for sets in the product sigma algebra; you can integrate the sections and get back the product measure. This also applies to any set E in the product sigma algebra that means in the completions space also the corresponding result holds.

This is the way; we can compute the product measure of a set in the sigma algebra. I want to go over to an interpretation of this result, which leads to a very important result in integration of product spaces.

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The whiteboard shows the following mathematical expressions and relationships:

$$\int_X \nu(E_x) d\mu(x) = \int_Y \mu(E_y) d\nu(y)$$

Below this, there are two equivalent expressions for the product measure of a set E :

$$(\mu \times \nu)(E) = \int_{X \times Y} \chi_E d(\mu \times \nu)$$

$$\int_X \left(\int_Y \chi_E(x,y) d\nu(y) \right) d\mu(x) = \int_Y \left(\int_X \chi_E(x,y) d\mu(x) \right) d\nu(y)$$

Arrows indicate the correspondence between the variables x and y in the first equation and the nested integrals in the second equation. A hand is visible at the bottom right, pointing to the equations.

What we had was the result, what we have shown is for every set E in the product sigma algebra A times B . We can take it section with respect to every point x that gives us a set in the sigma algebra B . We can define ν of that and that becomes, we show it is a non negative measurable function.

So, I can integrate this over X with respect to μ . On the other hand, I can also take the section of E with respect to every point y and then take its measure. We showed that the

section belong to A . Take its measure μ of $E \times y$. We should that that is a non negative measurable function and I can integrate it over Y $d\nu$ of y .

We showed that these two are equal and in fact both of them are equal to the product $\mu \times \nu$ of E . But a simple observation that the measure of a set is the integral of the indicator functions.

What is this? I can write it as integral over X , this ν of $E \times y$ I can write it as integral over Y of the indicator function of $E \times y$ $d\nu$ of y . Similarly, this thing I can write it as integral over Y μ of $E \times y$. I can write integral of over X of the indicator function of $E \times y$ $d\nu$ of y .

Then, we should have $d\mu$ of x . This $E \times y$ and this is $d\nu$ of y . So, this $E \times y$ there should be $d\mu$ of x and then $d\nu$ of y . This product thing, I can write it as integral over $X \times Y$ of the indicator function of E d the product measure $\mu \times \nu$.

We get an integral representation of this result that I can take the indicator function of the set E but note that the indicator function of $E \times y$ is nothing but see this is non zero when y belongs to $E \times x$ that means x, y belongs to E .

So this is just the indicator function of $E \times y$. Similarly, this also the indicator function of $E \times x$. Everywhere, it is an indicator function of E . What we are saying is look at the indicator function of the set E and integrated with respect to y . Keep x fix and integrate with respect to y that depends on x integrated with respect to x or take the indicator function of E then integrated with respect to x . Keep y fix, that integral depends on y and integrate over y . So, that is another number that you will get and it says both of them are equal to integral of the indicator function of the set E with respect to the product measure $\mu \times \nu$.

(Refer Slide Time: 45:05)

The slide is titled "Integration on product spaces" in yellow text on a dark blue background. Below the title, it says "This can be interpreted as follows:" and "For every $E \in \mathcal{A} \otimes \mathcal{B}$,". The main content consists of three lines of mathematical equations showing the equality of the double integral of the indicator function $\chi_E(x, y)$ over the product space $X \times Y$ with respect to the product measure $\mu \times \nu$ and two iterated integrals. The first iterated integral integrates with respect to y first, then x . The second iterated integral integrates with respect to x first, then y . In the bottom left corner, there is a small circular logo with the text "NPTEL" below it.

Integration on product spaces

This can be interpreted as follows:
For every $E \in \mathcal{A} \otimes \mathcal{B}$,

$$\int_{X \times Y} \chi_E(x, y) d(\mu \times \nu)(x, y)$$
$$= \int_X \left(\int_Y \chi_E(x, y) d\nu(y) \right) d\mu(x)$$
$$= \int_Y \left(\int_X \chi_E(x, y) d\mu(x) \right) d\nu(y).$$

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Let me just rewrite and show it to you in the form of in the slide. What we are saying is the result that we proved just now for every set E in the product sigma algebra \mathcal{A} cross \mathcal{B} , I can rewrite the result in the form of integrals that it is same as saying that the integral of the indicator function of E with respect to the product measure μ cross ν is same. Look at the indicator function it is a function of two variables.

For this function of two variables, I can fix in x . If I fix in x and vary only y then this indicator function becomes a function of one variable y .

It says let me integrate this function indicator function of E for a fixed x with respect to y . This integral can be computed and this integral depends on x . It says that, it is a measurable function and its integral can be taken with respect to x with respect to the measure μ and that is same as that integral.

Similarly, instead of fixing the first variable x , I can fix the second variable as y . I can fix this as y , and then this becomes a function of x . I can integrate it to with respect to x . I get a number which depends upon y and that function is integrable with respect to y and that integral is also equal to the original one.

So, the result of computation of product measure of a set E in the set \mathcal{A} cross \mathcal{B} can be written in terms of the integrals of indicator function over the product set. Basically, this

illustrates that to integrate the indicator function, which is a function of two variables. I can integrate it as one variable at a time.

This is an important result, which leads to important results in integration that given a function of two variables, if you want to integrate it with respect to the product measure then, this gives the hint that possible what we can do is fix one variable of the two variable function. So, it becomes the function of one variable, integrate it out the one variable. Then, it becomes the functions of the other variable, integrate out that variable also you get the integral with respect to the product measure. We will prove this in the next lecture. This result can be extended to non negative measurable functions on product spaces and eventually it can be extended to integrable functions.

That leads to important theorems in the theory of integration on product space is called Fubini's theorem. So, we will continue looking at that in the next lecture. Thank you.