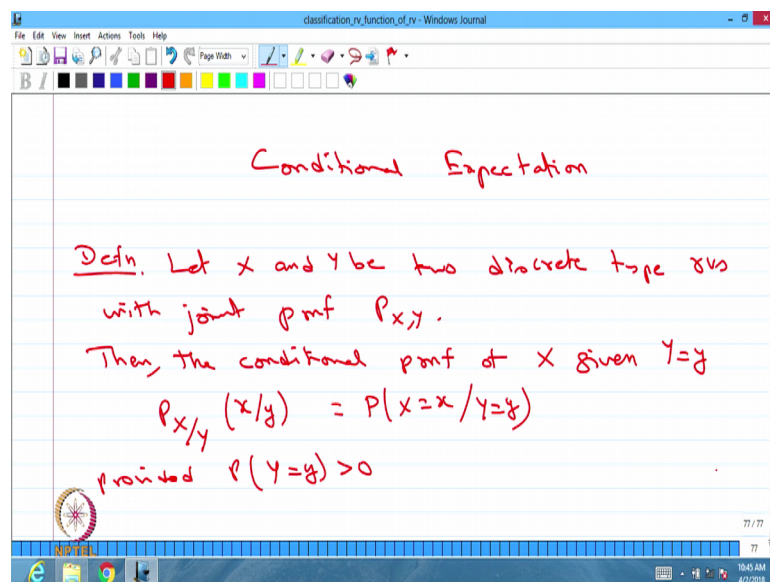


Introduction to Probability Theory and Stochastic Processes
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Lecture – 40

In this lecture we have already discussed moments of functions of several random variables, covariance variance matrix. In the lecture 1 and the lecture 2, we have discussed the correlation coefficient, in this lecture we are going to discuss about the condition expectation.

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This is a very important concept in probability, because the way we have discussed the conditional distribution conditional expectations also important; that means, after something happen, what is the distribution of the future events, we are finding the probability, then finding the distribution of the various random variable.

The same way we can go for computing the condition expectation, umm for that first we should know what is the conditional distribution, then we can find out the expectation of that is going to be call it as a conditional expectation; that means, first I should define what is a conditional distribution, then followed I can go for finding the expectation of that conditional distribution is a conditional expectation.

The provided condition of expectation in absolute sense it has been finite the same thing play here, also to compute the condition expectation, provided the expectation in absolute sense that is convergent or absolute sense it has a finite value.

So, let me give the definition of conditional expectation for the two dimensional discrete type random variable first, then I will go for the definition of condition expectation of two dimensional continuous type random variables so, definition.

First let me give the definition of conditional probability mass function, let X and Y be two discrete type random variables, with joint probability mass function is $P_{X,Y}$, then we have defined the conditional probability mass function of X given the other random variable takes a value Y is given by probability X , given the other random variable Y has a function of x given small y that is nothing, but the probability that X takes a value x , given Y takes a value small y .

This we have already defined provided, provided the probability of Y takes a value small y is greater than 0, this is the conditional probability mass function of the random variable X given Y takes a value small y .

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The conditional expectation of X given $Y=y$

$$E(X/Y=y) = \sum_x x P_{X/Y}(x/y)$$

The quantity $E(X/Y=y)$ is called the regression of X on $Y=y$.

$E(x/y)$ is the value of the r.v. $E(X/Y)$

Now, I can go for defining the conditional expectation, conditional expectation of the random variable X given the other random variable takes a value Y , that is defined as expectation of X given Y takes a value small y . Whenever we use a word slash; that

means, it is a conditional or given that is same as that is same as summation x times the conditional probability mass function of x given y .

So, the definition says the conditional expectation of X given Y takes a value small y means a summation over X , X times the conditional probability mass function of X given Y provided this right hand side summation in absolute sense, it is finite value. As long as the right hand side in the absolute sense, it is a finite value without absolute sense that summation quantity, is going to be call it as a conditional expectation of X given Y takes a value small y .

There is another name for this the quantity that is expectation of $E X$ given Y takes a value small y , that is called the regression of the random variable X given Y , takes a value small y we will study this in detailed the regression of X given Y takes a value small y in the statistic course, but here we are connecting the conditional expectation of X given Y that is nothing, but the regression of X given Y takes a value small y .

One more observation the conditional expectation X given Y is equal to small y is a function of Y is a function of Y ; that means, the expectation of X given capital Y is the value taken for the values of the different Y therefore, expectation X given small y is the value of the a random variable expectation $E X$ given capital Y . Since this is going to be a function of small y and capital Y is a random variables.

Therefore expectation of X given small y is the function of small y that is nothing, but the value of the random variable expectation of X given capital Y . The quantity expectation of X given capital Y takes value small y is called the regression of X on capital Y takes a value small y , we will study this regression of X on capital Y takes a value small y in detail in the statistic courses, but as far as this probability and stochastic process course is concerned, you can consider this as the this quantity as a regression of X on capital Y takes the value small y .

And the other observation is the conditional expectation of X given the capital Y takes a value small y is the function of y . And since capital Y is a random variable it is taking a different values of the small y therefore, expectation of X given small y is the value of the random variable expectation X given capital Y . Note that expectation of a random variable is a constant whereas, the conditional expectation of one random variable given another random variable take some value, that is value of the random variable

expectation of X given the random variable. So, there is a difference between expectation and the conditional expectation.

We will study some results over the conditional expectation, after I go for continuous type random variable definition and some more examples.

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The image shows a handwritten derivation in a software window titled "classification_rv_function_of_rv - Windows Journal". The text is written in red ink on a blue-lined background. It starts with "Example" underlined. Then it says "Let $X \sim P(\lambda)$ " and " $Y \sim P(\mu)$ ". It then states "Assume that X & Y are independent r.v.s". Next, it says "Then, $X+Y \sim P(\lambda+\mu)$ ". The main derivation is
$$P(X/x+Y=n) = P(X=x/x+Y=n) = \binom{n}{x} \left(\frac{\lambda}{\lambda+\mu}\right)^x \left(1 - \frac{\lambda}{\lambda+\mu}\right)^{n-x}$$
 with " $x = 0, 1, \dots, n$ " written below. The window also shows a standard toolbar and a taskbar at the bottom with the date 4/2/2018 and time 10:54 AM.

We will go for example, for conditional expectation of two dimensional discrete type random variables. Let X be Poisson distributed random variable with the parameter λ and let Y be a again Poisson distributed random variable with the parameter μ , assume that X and Y are independent random variables, we have already proved the sum of 2 independent Poisson distributed random variable, also going to be Poisson distribution with the parameter is sum.

Also we have already proved the probability of X given X plus Y take some value that is nothing, but the conditional distribution of X takes the value small x and X plus Y takes a value some n . This we have already proved that follows a $\binom{n}{x} \frac{\lambda^x}{\lambda + \mu} (1 - \frac{\lambda}{\lambda + \mu})^{n-x}$, where x can take the value 0 1 and so, on till n this is a conditional distribution of X given X plus Y .

Since it is a, the probability mass function the condition probability mass function of X given X plus Y , that follows a binomial distribution.

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The image shows a screenshot of a software window titled "classification_xy_function_of_ny - Windows Journal". The window contains handwritten mathematical derivations in red ink on a lined background. The derivations are as follows:

$$\text{Then, } X+Y \sim P(\lambda+\mu)$$
$$P(X/x+Y=n) = P(X=x/x+Y=n)$$
$$= \binom{n}{x} \left(\frac{\lambda}{\lambda+\mu}\right)^x \left(1 - \frac{\lambda}{\lambda+\mu}\right)^{n-x}$$

$x = 0, 1, \dots, n$

$$X/x+Y=n \sim B\left(n, \frac{\lambda}{\lambda+\mu}\right)$$
$$E\left(X/x+Y=n\right) = n \cdot \left(\frac{\lambda}{\lambda+\mu}\right)$$

We can easily write X given X plus Y follows binomial distribution with the parameters n comma p p is λ divided by λ plus μ

Our interest is to find out the conditional expectation. So, the conditional expectation of X given X plus Y takes a value n . So, here also I can write is equal to n that is same as. Since it is a binomial distribution you know that the expectation of binomial distributed random variable is product of the parameters. So, n into P since we know the mean of binomial distribution exist therefore, we are directly writing the condition expectation of X given X plus Y is equal to n that is n times λ divided by λ plus μ .

Like that for any two dimensional or n dimensional discrete type random variable one can first find the conditional probability mass function, from there you can find out the conditional expectation. Now, we will go for the conditional expectation for two dimensional continuous type random variables.

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Defn. Let X and Y be two continuous type r.v.s with joint pdf $f_{X,Y}$.
Then, the conditional pdf of X given $Y=y$

$$f_{X/Y}(x/y) = \frac{f_{X,Y}(x,y)}{f_Y(y)}$$

provided $f_Y(y) > 0$

Let X and Y be two continuous type random variables with joint probability density function $f_{X,Y}$, then one can define the conditional probability density function of X given Y takes a value small y is $f_{X/Y}$ as a function of x given y that is nothing, but the joint probability density function divided by the marginal distribution of Y at the point small y provided, provided f_Y at the point y has to be strictly greater than 0. So, this is the condition probability density function of X given Y takes a value small y .

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The conditional expectation of X given $Y=y$

$$E(X/Y=y) = \int_{-\infty}^{\infty} x \cdot f_{X/Y}(x/y) dx$$

From here one can define the conditional expectation of the random variable X given Y takes a value small y , that is defined as expectation of X given other random variable takes a value small y that is nothing, but minus infinity to infinity X times the conditional probability density function of X given Y with respect to X provided the right hand side integration in absolute sense is the finite quantity.

So, this is the conditional expectation of X given Y takes a value small y , when both the random variables are of the continuous type we will go for the simple example.

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Example
 Let X and Y be two continuous type rvs
 with joint pdf

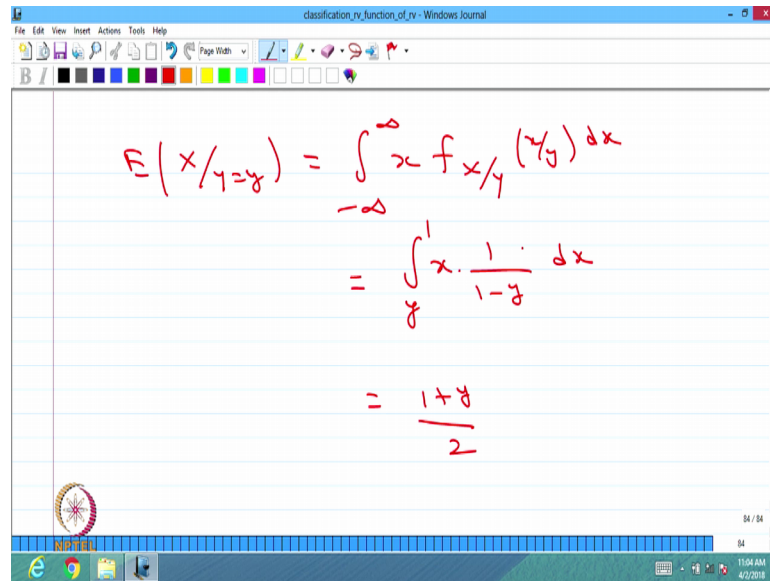
$$f_{X,Y}(x,y) = \begin{cases} 2, & 0 < y < x < 1 \\ 0, & \text{otherwise} \end{cases}$$

$$f_{X/Y}(x/y) = \begin{cases} \frac{1}{1-y}, & y < x < 1 \\ 0, & \text{otherwise} \end{cases}$$

The example is let X and Y be two continuous type random variables with the joint probability density function that is given by 2, when y lies between 0 to x , x lies between y to 1 otherwise 0, this example we have already discussed when I discussed the conditional distribution.

For this problem we have already got the conditional, we have got the conditional probability density function, that is 1 divided by 1 minus y , when x takes the value when x takes a value y to 1 otherwise it is 0. So, this is the conditional probability density function of x given y , here y as we did treated as a constant. So, this is a conditional distribution of x given y .

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The screenshot shows a Windows Journal window titled "classification_xy_function_of_xy - Windows Journal". The window contains handwritten mathematical derivations in red ink on a lined background. The derivations are as follows:

$$E(X|Y=y) = \int_{-\infty}^{\infty} x f_{X|Y}(x|y) dx$$
$$= \int_y^1 x \cdot \frac{1}{1-y} dx$$
$$= \frac{1+y}{2}$$

The window also shows a taskbar at the bottom with the Start button, several application icons, and a system tray displaying the time as 11:04 AM on 4/2/2010.

One can find the conditional expectation of X given Y takes a value small y that is nothing, but by definition minus infinity to infinity x times the conditional probability density function of x given y , this is same as we know the conditional probability density function of x given y takes a value 1 divided by 1 minus y between the interval y to 1 therefore, it is going to be y to 1 , x 1 divided by 1 minus y integration with respect to x , if you do the simplification answer is 1 plus y by 2 .

So, the conditional probability density function is 1 divided by 1 minus y between the interval y to 1 ; that means, it is a uniform distribution between the interval y to 1 therefore, the mean of mean of uniform distribution between the interval y to 1 , that is 1 plus y divided by 2 , that is same as the conditional expectation of X given Y takes a value small y .

So, that is 1 plus y by 2 that is going to either you do by integration simplifying you will get this answer, or by observing the conditional distribution is nothing, but the uniform distribution.

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The image shows a screenshot of a software window titled "classification_xy_function_of_xy - Windows Journal". The window contains handwritten mathematical work on a lined background. The work defines the conditional probability density function $f_{Y/X}(y/x)$ as $\frac{1}{x}$ for $0 < y < x$ and 0 otherwise. It then calculates the conditional expectation $E(Y/X > x)$ by integrating $y \cdot \frac{1}{x}$ from $y=0$ to $y=x$, resulting in $\frac{x}{2}$.

$$f_{Y/X}(y/x) = \begin{cases} \frac{1}{x}, & 0 < y < x \\ 0, & \text{otherwise} \end{cases}$$
$$E(Y/X > x) = \int_{-\infty}^{\infty} y f_{Y/X}(y/x) dy$$
$$= \int_0^x y \cdot \frac{1}{x} dy$$
$$= \frac{x}{2}$$

Therefore the conditional expectation is same as the expectation of uniform distribution during the interval y to 1 . Similarly one can get the conditional probability density function of Y given X , in the same problem you can get that is 1 divided by x between y lies between 0 to x otherwise it is 0 . So, this is a conditional probability density function of Y given X .

So, from here you can get the conditional expectation of Y given X takes a value small x , that is same as minus infinity to infinity y times, the condition probability density function of y given x , by doing the simplification you will get 0 to x by substitution you will get 0 to x y times 1 divided by x dy .

Again if you do the simplification you will get x by 2 , either by simplifying this integration you can get x by 2 , or here also you can observe the again the conditional distribution of y given x , that is uniform distribution between the interval 0 to x therefore, conditional expectation of y given x that is same as expectation of uniform distribution between the interval 0 to x that is x by 2 . So, till now we have discussed the conditional expectation for the two dimensional discrete type random variable with one example, two dimensional continuous type random variables with one example.