# Probability and Statistics: Lecture-32

Monsoon-2020

by Dr. Pawan Kumar (IIIT, Hyderabad) on October 26, 2020



### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X,Y) \in A) = \int \int_A f_{XY}(x,y) \, dxdy$$

### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X, Y) \in A) = \int \int_A f_{XY}(x, y) dxdy$$

The function  $f_{XY}(x,y)$  is called the joint probability density function, PDF, of X and Y.

### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X, Y) \in A) = \int \int_{A} f_{XY}(x, y) dxdy$$

The function  $f_{XY}(x, y)$  is called the joint probability density function, PDF, of X and Y.

1. Here domain of  $f_{XY}(x,y)$  is  $\mathbb{R}^2$ , but we may redefine

### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X, Y) \in A) = \int \int_A f_{XY}(x, y) dxdy$$

The function  $f_{XY}(x, y)$  is called the joint probability density function, PDF, of X and Y.

1. Here domain of  $f_{XY}(x,y)$  is  $\mathbb{R}^2$ , but we may redefine

$$R_{XY} = \{(x, y) \mid f_{X,Y}(x, y) > 0\}$$

### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X, Y) \in A) = \int \int_{A} f_{XY}(x, y) dxdy$$

The function  $f_{XY}(x,y)$  is called the joint probability density function, PDF, of X and Y.

1. Here domain of  $f_{XY}(x,y)$  is  $\mathbb{R}^2$ , but we may redefine

$$R_{XY} = \{(x, y) \mid f_{X,Y}(x, y) > 0\}$$

2. If we indeed choose  $A = \mathbb{R}^2$ , then we must have

### **Joint Continuous Density Functions**

Two RVs X, Y are jointly continuous if there exists a nonnegative function  $f_{XY}: \mathbb{R}^2 \to \mathbb{R}$ , such that, for any set  $A \in \mathbb{R}^2$ , we have

$$P((X, Y) \in A) = \int \int_A f_{XY}(x, y) dxdy$$

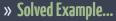
The function  $f_{XY}(x, y)$  is called the joint probability density function, PDF, of X and Y.

1. Here domain of  $f_{XY}(x,y)$  is  $\mathbb{R}^2$ , but we may redefine

$$R_{XY} = \{(x, y) \mid f_{X,Y}(x, y) > 0\}$$

2. If we indeed choose  $A=\mathbb{R}^2,$  then we must have

$$\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f_{XY}(x, y) \, dx dy = 1$$



### Solved Example

### Solved Example

$$f_{XY}(x,y) = egin{cases} x + cy^2 & 0 \le x \le 1, \ 0 \le y \le 1 \\ 0 & ext{otherwise} \end{cases}$$

### Solved Example

Let X, Y be two jointly continuous RVs with joint PDF

$$f_{XY}(x,y) = egin{cases} x + cy^2 & 0 \le x \le 1, \ 0 \le y \le 1 \\ 0 & ext{otherwise} \end{cases}$$

1. Find the constant *c* 



### Solved Example

Let X, Y be two jointly continuous RVs with joint PDF

$$f_{XY}(x,y) = egin{cases} x + cy^2 & 0 \le x \le 1, \ 0 \le y \le 1 \ 0 & ext{otherwise} \end{cases}$$

 $\checkmark$  Find the constant c

2 Find 
$$P(0 \le X \le \frac{1}{2}, \ 0 \le Y \le \frac{1}{2})$$

\* Answer to previous problem...

Answer to previous problem...

$$\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} f_{xy}(x,y) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = \int_{0}^{16} (x + cy^{2}) dy = \int_{0}^{16} (x + cy^{2}) dy$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

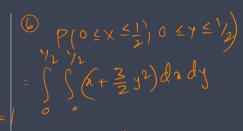
$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

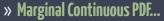
$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} (x + cy^{2}) dx dy = 1$$

$$= \int_{0}^{16} ($$







**Marginal Continuous PDF** 

Let X, Y be two random variable.

**Marginal Continuous PDF** 

Let X, Y be two random variable. Then the marginal PDFs of X and Y can be computed from the joint PDF  $f_{XY}$  as follows

### Marginal Continuous PDF

Let X, Y be two random variable. Then the marginal PDFs of X and Y can be computed from the joint PDF  $f_{XY}$  as follows

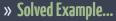
$$f_{X}(x) = \int_{-\infty}^{\infty} f_{XY}(x, y) dy$$
, for all  $x$ ,

### **Marginal Continuous PDF**

Let X, Y be two random variable. Then the marginal PDFs of X and Y can be computed from the joint PDF  $f_{XY}$  as follows

$$f_X(x) = \int_{-\infty}^{\infty} f_{XY}(x,y) \, dy$$
, for all  $x$ ,

$$f_Y(y) = \int_{-\infty}^{\infty} f_{XY}(x,y) dx$$
, for all y.



Solved Example

### Solved Example

$$f_{XY}(x, y) = egin{cases} x + cy^2 & 0 \le x \le 1, 0 \le y \le 1 \\ 0 & ext{otherwise} \end{cases}$$

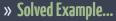
### Solved Example

Let *X*, *Y* be two jointly continuous RVs with joint *PDF* 

$$f_{XY}(x,y) = egin{cases} x + cy^2 & 0 \le x \le 1, 0 \le y \le 1 \\ 0 & ext{otherwise} \end{cases}$$

1. Find the PDFs  $f_X(x)$  and  $f_Y(y)$ 

» Answer to previous problem... fy(8)= [fxy(21)] dx



### Solved Example

### Solved Example

$$f_{XY}(x,y) = egin{cases} cx^2y & 0 \leq y \leq x \leq 1 \ 0 & ext{otherwise} \end{cases}$$

### Solved Example

Let X, Y be two jointly continuous RVs with joint PDFs

$$f_{XY}(x,y) = egin{cases} cx^2y & 0 \leq y \leq x \leq 1 \ 0 & ext{otherwise} \end{cases}$$

1. Find  $R_{XY}$  and plot it

### Solved Example

$$f_{XY}(x,y) = \begin{cases} cx^2y & 0 \le y \le x \le 1 \\ 0 & \text{otherwise} \end{cases}$$

- 1. Find  $R_{XY}$  and plot it
- 2. Find the constant c

### Solved Example

$$f_{\mathit{XY}}(\mathit{x}, \mathit{y}) = egin{cases} \mathit{cx}^2\mathit{y} & 0 \leq \mathit{y} \leq \mathit{x} \leq 1 \ 0 & \mathsf{otherwise} \end{cases}$$

- 1. Find  $R_{XY}$  and plot it
- 2. Find the constant c
- 3. Find the marginal PDFs  $f_X(x)$  and  $f_Y(y)$

### Solved Example

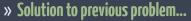
$$f_{\mathit{XY}}(\mathit{x}, \mathit{y}) = egin{cases} \mathit{cx}^2\mathit{y} & 0 \leq \mathit{y} \leq \mathit{x} \leq 1 \ 0 & \mathsf{otherwise} \end{cases}$$

- 1. Find  $R_{XY}$  and plot it
- 2. Find the constant c
- 3. Find the marginal PDFs  $f_X(x)$  and  $f_Y(y)$
- 4. Find  $P\left(Y \leq \frac{X}{2}\right)$

### Solved Example

$$f_{\mathit{XY}}(\mathit{x}, \mathit{y}) = egin{cases} \mathit{cx}^2\mathit{y} & 0 \leq \mathit{y} \leq \mathit{x} \leq 1 \ 0 & \mathsf{otherwise} \end{cases}$$

- $\bot$  Find  $R_{XY}$  and plot it
- 2 Find the constant c
- 5. Find the marginal PDFs  $f_X(x)$  and  $f_Y(y)$
- 4. Find  $P\left(Y \le \frac{X}{2}\right)$
- 5. Find  $P\left(Y \leq \frac{X}{2} \mid Y \leq \frac{X}{2}\right)$



Looking at the joint PDF, we have

» Solution to previous problem...

» Solution to previous problem...

Looking at the joint PDF, we have

$$R_{XY} = \{(\mathbf{x}, \mathbf{y}) \in \mathbb{R}^2 \mid 0 \le \mathbf{y} \le \mathbf{x} \le 1\}$$

» Solution to previous problem...

Looking at the joint PDF, we have

$$R_{XY} = \{ (\mathbf{x}, \mathbf{y}) \in \mathbb{R}^2 \mid 0 \le \mathbf{y} \le \mathbf{x} \le 1 \}$$

The plot is the following

# » Solution to previous problem...

Looking at the joint PDF, we have

$$R_{XY} = \{(x, y) \in \mathbb{R}^2 \mid 0 \le y \le x \le 1\}$$

The plot is the following

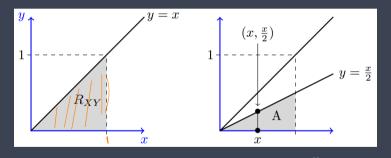


Figure showing  $R_{XY}$  and integration region  $P(Y \leq \frac{\lambda}{2})$ 

» Answer to previous problem...

$$\int_{0}^{\infty} \int_{0}^{\infty} \int_{0$$

$$\int_{0}^{\infty} \left( \frac{x^{2}y^{2}}{2} \right)^{x} dx = 1$$

$$\int_{0}^{\infty} \int_{0}^{\infty} \int_{0$$





$$C=10$$

\*\* Answer to previous problem...

To find the morganel,

$$R_{x} = R_{y} = \{0, 1\}$$

For  $0 \le y \le 1$ 
 $f_{x}(x) = \{0, 1\}$ 
 $f_{x}(x) = \{$ 

/108



Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

## Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x, y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

## Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \leq x, Y \leq y).$$

$$F_X(x) = F_{XY}(x, \infty)$$
 for any  $x$  (marginal CDF of  $X$ )

### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

- 1.  $F_X(x) = F_{XY}(x, \infty)$  for any x (marginal CDF of X)
- 2.  $F_Y(y) = F_{XY}(\infty, y)$  for any y (marginal CDF of Y)

### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

- 1.  $F_X(x) = F_{XY}(x, \infty)$  for any x (marginal CDF of X)
- 2.  $F_Y(y) = F_{XY}(\infty, y)$  for any y (marginal CDF of Y)
- 3.  $F_{XY}(\infty,\infty)=1$

### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

- 1.  $F_X(x) = F_{XY}(x, \infty)$  for any x (marginal CDF of X)
- 2.  $F_Y(y) = F_{XY}(\infty, y)$  for any y (marginal CDF of Y)
- 3.  $F_{XY}(\infty,\infty)=1$
- 4.  $F_{XY}(-\infty, y) = F_{XY}(x, -\infty) = 0$



#### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x,y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

- 1.  $F_X(x) = F_{XY}(x, \infty)$  for any x (marginal CDF of X)
- 2.  $F_Y(y) = F_{XY}(\infty, y)$  for any y (marginal CDF of Y)
- 3.  $F_{XY}(\infty,\infty)=1$
- 4.  $F_{XY}(-\infty, y) = F_{XY}(x, -\infty) = 0$
- 5.  $P(x_1 < X \le x_2, y_1 < Y \le y_2) = F_{XY}(x_2, y_2) F_{XY}(x_2, y_2) F_{XY}(x_2, y_1) + F_{XY}(x_1, y_1)$

### Joint cumulative distribution

Let X, Y be two continuous RVs with joint CDF  $F_{XY}(x, y)$  as follows

$$F_{XY}(x,y) = P(X \le x, Y \le y).$$

- 1.  $F_X(x) = F_{XY}(x, \infty)$  for any x (marginal CDF of X)
- 2.  $F_Y(y) = F_{XY}(\infty, y)$  for any y (marginal CDF of Y)
- 3.  $F_{XY}(\infty,\infty)=1$
- 4.  $F_{XY}(-\infty, y) = F_{XY}(x, -\infty) = 0$
- 5.  $P(x_1 < X \le x_2, y_1 < Y \le y_2) = F_{XY}(x_2, y_2) F_{XY}(x_2, y_2) F_{XY}(x_2, y_1) + F_{XY}(x_1, y_1)$
- 6. If X, Y are independent, then  $F_{XY} = F_X(x)F_Y(y)$

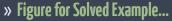
# » Solved Example

## Solved Example

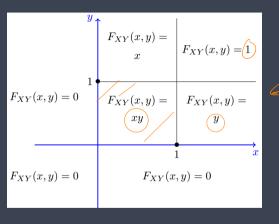
Let X, Y be two random variables with Uniform(0,1) distribution. Find  $F_{XY}(x,y)$ .

Since 
$$x$$
 and  $y$  are independent of  $x$  and  $y$  are independ

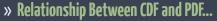


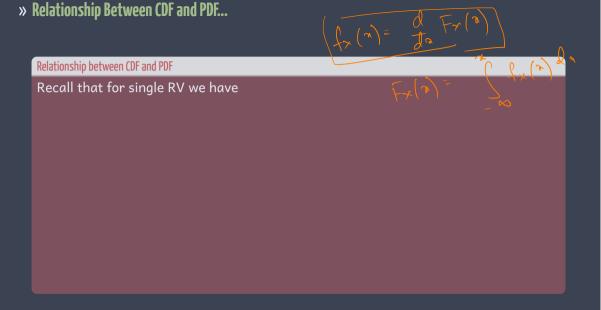


# » Figure for Solved Example...



Plot of joint CDF





» Relationship Between CDF and PDF...

## Relationship between CDF and PDF

Recall that for single RV we have

$$F_X(x) = \int_{-\infty}^x f_X(u) \, du$$
$$f_X(x) = \frac{dF_X(x)}{dx}$$

» Relationship Between CDF and PDF...

### Relationship between CDF and PDF

Recall that for single RV we have

$$F_X(x) = \int_{-\infty}^x f_X(u) \, du$$
$$f_X(x) = \frac{dF_X(x)}{dx}$$

Similarly, for two RVs we have

» Relationship Between CDF and PDF...

## Relationship between CDF and PDF

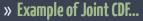
Recall that for single RV we have

$$F_X(x) = \int_{-\infty}^{\infty} f_X(u)$$
$$f_X(x) = \frac{dF_X(x)}{dx}$$

Similarly, for two RVs we have

$$F_{XY}(x,y) = \int_{-\infty}^{y} \int_{-\infty}^{x} f_{XY}(u,v) \, du \, dv$$
$$f_{XY} = \frac{\partial^{2}}{\partial x \partial y} F_{XY}(x,y)$$





» Example of Joint CDF...

Solved Example

Let X, Y be two jointly continuous RVs with joint PDF

» Example of Joint CDF...

## Solved Example

Let X, Y be two jointly continuous RVs with joint PDF

$$f_{XY}(x,y) = \begin{cases} x + cy^2 & 0 \le x \le 1, 0 \le y \le 1 \\ 0 & \text{otherwise} \end{cases}$$

# » Example of Joint CDF...

## Solved Example

Let X, Y be two jointly continuous RVs with joint PDF

$$f_{XY}(x,y) = egin{cases} x + cy^2 & 0 \le x \le 1, 0 \le y \le 1 \\ 0 & ext{otherwise} \end{cases}$$

1. Find the joint CDF of X and Y

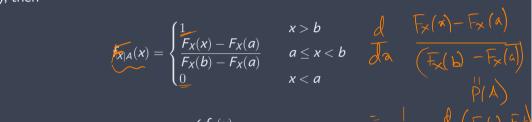
© To find the const C=  $\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} (u + \frac{3}{2}v^2) dx dy$ Recall  $C = \frac{3}{2}$  (found before)

=  $\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} (u + \frac{3}{2}v^2) dx dy$ » Answer to previous problem...

» Answer to previous problem...

» Definition of Conditional PDF and Conditional CDF

Let X be a continuous RV and A be an event that a < X < b (where possibly  $b = \infty$  or

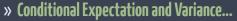


> Answer to previous problem...

Let 
$$A = \{ a \in x \in b \}$$
 $F_{x|A}(x) = P(x \in x \mid A)$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= P(x \in x) \quad a \in x \in b$ 
 $= F_{x}(a) - F_{x}(a)$ 
 $= F_{x}(b) - F_{x}(a)$ 

If  $x \in a$ , then  $F_{x|A}(x) = 0$ 
 $= F_{x|A}(x) = 0$ 





» Conditional Expectation and Variance...

Definition of Conditional Expectation and Variance

For a random variable  $\boldsymbol{X}$  and event  $\boldsymbol{A},$  we have

» Conditional Expectation and Variance...

# Definition of Conditional Expectation and Variance

For a random variable *X* and event *A*, we have

$$\Rightarrow E[X \mid A] = \int_{-\infty}^{\infty} x f_{X \mid A}$$

$$E[g(X) \mid A] = \int_{-\infty}^{\infty} g(x) f_{X|A}(x) dx$$

$$Var(X | A) = E[X^2 | A] - (E[X | A])^2$$

5/10

» Solved Example: Conditional PDF and CDF...

Solved Example

Let  $X \sim \text{Exponential}(1)$ .

Solved Example

Let  ${\it X} \sim {\it Exponential}(1).$  Answer the following.

# Solved Example

Let  ${\it X} \sim {\it Exponential}(1).$  Answer the following.

1. Find the conditional PDF and CDF of X given X > 1

# Solved Example

Let  $X \sim \text{Exponential}(1)$ . Answer the following.

- 1. Find the conditional PDF and CDF of X given X > 1
- 2. Find E[X | X > 1]

## Solved Example

Let  ${\it X} \sim {\it Exponential}(1).$  Answer the following.

- 1 Find the conditional PDF and CDF of X given X > 1
- **2**. Find E[X | X > 1]
- 3. Find Var(X | X > 1)

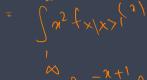
26/108

» Answer to previous problem...

$$\int_{A} x \left[ \frac{1}{x} \right] \left( \frac{1}{x} \right) dx$$

$$\int_{\alpha}^{\infty} x \int_{x}^{x} |x| dx = e \int_{x}^{x} e^{-x}$$





$$= \bigcap_{n} \frac{1}{e^{n+1}} d^n$$

$$= \bigcap_{n=0}^{\infty} n^{2n+1} \delta$$



27/108