

## **Selection Rejection Methodology For Two Dimensional Continuous Random Variables and Its Application To Two Dimensional Normal Distribution**

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### **Abstract**

In this paper we have generalized the Selection-Rejection Methodology for one dimensional continuous random variables to two dimensional continuous random variables and applied it to the two dimensional normal distribution.

**Keywords:** random variable, iterations, target probability distribution and proposal probability distribution.

### **Introduction**

The Selection-Rejection Methodology for one dimensional continuous random variables was developed based on the idea of Acceptance-Rejection Method by the renowned mathematician, Von Neumann, from the University of Berlin. Von Neumann[1] came forward with his method during 1950's but later on Karl Sigman[2] from Columbia University gave the similar methodology in 2007. Again in 1989, Bernard D.Flury[3] from Indiana University came forward with the theory "Acceptance-Rejection Sampling Made Easy". D.P.Kroese[4] from University of Queensland put forward his theory of Acceptance-Rejection in 2011. Selection-Rejection Methodology can be applied to almost all statistical distributions and hence it has got immense physical significance.

### **Selection-Rejection Methodology For Two Dimensional Continuous Random Variables**

Let  $X, Y$  be a two dimensional continuous random variable with probability distribution function  $f(x, y) \forall x, y \in R$ , where  $R = \text{set of all real numbers}$ . Let  $g(x, y) \forall x, y \in R$  where  $R = \text{set of all real numbers}$  be another probability density function such that  $\frac{f(x, y)}{g(x, y)} \leq k \forall x, y \in R$ , where  $k \geq 1$  is a real number. By successively

selecting different values of  $X, Y$  we will try to make the ratio  $\frac{f(x, y)}{kg(x, y)}$  as close to 1 as possible. The probability density function  $f(x, y)$  is called target distribution and the probability density function  $g(x, y)$  is called proposal distribution.

**The step by step procedure for the Selection-Rejection Methodology is as follows.**

**Step (1):-** Let  $X, Y$  be a two dimensional continuous random variable with probability distribution function  $f(x, y) \forall x, y \in R$ , where  $R = \text{set of all real numbers}$ .

**Step (2):-** Let  $X', Y'$  be another two dimensional continuous random variable (which is independent of  $X, Y$ ) with probability distribution function  $g(x, y) \forall x, y \in R$ , where  $R = \text{set of all real numbers}$ .

**Step (3):-** Let  $\frac{f(X', Y')}{g(X', Y')} \leq k \forall X', Y' \in R$ , where  $k \geq 1$  a real number.

**Step (4):-** Let  $0 < R_1 < 1$  and  $0 < R_2 < 1$  be two random numbers.

**Step (5):-** Set  $X'$  in terms of  $R_1$  and set  $Y'$  in terms of  $R_2$  depending on the expression obtained for the ratio  $\frac{f(X', Y')}{kg(X', Y')}$ .

**Step (6):-** If  $R_1 R_2 \leq \frac{f(X', Y')}{kg(X', Y')}$ , then set  $X, Y = X', Y'$  and select the continuous random variable  $X', Y'$ ; otherwise reject the variable  $X', Y'$  and repeat the process from step (1).

The probability that the continuous random variable  $X', Y'$  is selected is  $\frac{1}{k}$ .

The number of iterations required to select  $X', Y'$  is  $k$ .

It may be noted that  $0 \leq \frac{f(X', Y')}{kg(X', Y')} \leq 1$

**To prove that the probability for the selection of  $X, Y$  is  $\frac{1}{k}$ ,**

Proof: -  $P(\text{Select} | X', Y') = P\left(R_1 R_2 \leq \frac{f(X', Y')}{kg(X', Y')}\right) = \frac{f(X', Y')}{kg(X', Y')} \dots$

$$\begin{aligned}
 P(X', Y' \text{ is selected}) &= \int_{-\infty}^x \int_{-\infty}^y \frac{f(w, v)}{kg(w, v)} g(w, v) dw dv \\
 &= \frac{1}{k} \int_{-\infty}^x \int_{-\infty}^y f(w, v) dw dv = \frac{1}{k} \left[ \because \int_{-\infty}^x \int_{-\infty}^y f(w, v) dw dv = 1 \right]
 \end{aligned}$$

Hence the proof.

Since the probability of selection (i.e. success) is  $\frac{1}{k}$ , the number of iterations needed will follow a geometric distribution with  $p = \frac{1}{k}$ . So, on average it will take  $k$  iterations to generate a number.

**Application To Two Dimensional Normal Distribution.**

Two dimensional normal distribution is given by

$$f(x, y) = \frac{1}{\sqrt{2\pi}} e^{-\left(\frac{x^2+y^2}{2}\right)}, x \geq 0, y \geq 0, x, y \in R \tag{1}$$

Here  $f(x, y)$  is the target function.

Let  $g(x, y) = e^{-x-y}, x \geq 0, y \geq 0$  be the proposal distribution. (2)

Let  $h(x, y) = \frac{f(x, y)}{g(x, y)} = \frac{1}{\sqrt{2\pi}} \exp\left(-\left(\frac{x^2 + y^2 - 2x - 2y}{2}\right)\right)$  (3)

With the help of differential calculus we can show that  $h(x, y)$  attains maximum at 1,1 and the maximum value of  $h(x, y)$  is  $\frac{e}{\sqrt{2\pi}} \approx 1.0845$  (approximately).

Choosing  $k = \frac{e}{\sqrt{2\pi}}$ , we get

$$\frac{f(x, y)}{kg(x, y)} = \exp\left(-\frac{x-1}{2}\right) \times \exp\left(-\frac{y-1}{2}\right) \tag{4}$$

Selection-Rejection Methodology for the two dimensional distribution is as follows

**Step (1):-** Let  $X, Y$  be a two dimensional continuous random variable with probability distribution function  $f(x, y) \forall x, y \in R$ , where  $R$ =set of all real numbers.

**Step (2):-** Let  $X', Y'$  be a two dimensional continuous random variable with probability distribution function  $g(x, y) \forall x, y \in R$ , where  $R$ =set of all real numbers.

**Step (3):-**Let  $0 < R_1 < 1$  and  $0 < R_2 < 1$  be two random numbers.

**Step (4):-** Set  $X' = 1 + \sqrt{-2\ln(R_1)}$  and  $Y' = 1 + \sqrt{-2\ln(R_2)}$

**Step (5):-** If  $R_1 R_2 \leq \exp\left(-\frac{X'-1}{2}\right) \times \exp\left(-\frac{Y'-1}{2}\right)$ , then set

$X, Y = X', Y'$  and select  $X', Y'$ ; otherwise reject  $X', Y'$  and repeat the process from Step(1).

## Conclusion

Selection-Rejection Methodology is valid for any dimension of continuous random variable. In this method we approximate the target function to proposal function so that after a number of successive iterations the proposal function becomes almost equal to target function and proposal function is selected.

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