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**Department: Mathematics and Computing**

**Course: MA 323 - Monte Carlo Simulation**

**Lab: 04**

In [1]:

```
import matplotlib.pyplot as plt
import seaborn as sns
import numpy as np
import math
import time
```

In [2]:

```
def LCG(a,b,m,seed):
    xi=seed
    xi=(xi*a+b)%m
    return xi
```

## 1) Box-Muller method

In [3]:

```
N= [100, 10000]
Z= []
Mean= []
Variance= []
Time= []
```

In [4]:

```
for n in N:
    start= time.time()
    seed_u1=3
    seed_u2=5
    for i in range(0,n//2):
        seed_u1=LCG(1741,2731,12960,seed_u1)
        seed_u2=LCG(1741,2731,12960,seed_u2)
        U1=seed_u1/12960
        U2=seed_u2/12960
        if (U1!=0):
            R= -2*math.log(U1)
            V= 2*math.pi*U2
            Z1= math.sqrt(R)*math.cos(V)
            Z2= math.sqrt(R)*math.sin(V)
            Z.append(Z1)
            Z.append(Z2)
    end= time.time()
    # print(len(Z))
    Time.append(end-start)
    mean= sum(Z) / len(Z)
    variance= sum((k - mean) ** 2 for k in Z) / len(Z)
    Mean.append(mean)
    Variance.append(variance)
```

```

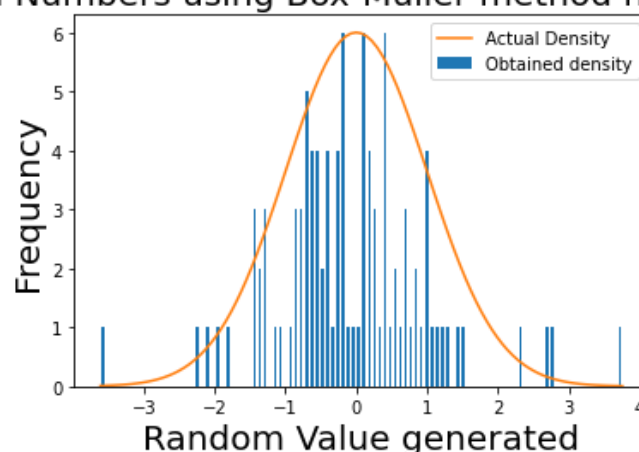
x1,x2,x3= plt.hist(Z, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi))*pow(math.e, (-1*0*0)/2.0)
for x in x2:
    f= (1/math.sqrt(2.00*math.pi))*pow(math.e, (-1*x*x)/2.0)
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Box-Muller method having distribution N(0,1)
", size=20)
plt.legend()
plt.show()

# Now for N(0,5)
Z1= []
for i in Z:
    Z1.append(0+math.sqrt(5)*i)
x1,x2,x3= plt.hist(Z1, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*0*0)/(2.0*5.0))
for x in x2:
    f= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*x*x)/(2.0*5.0))
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Box-Muller method having distribution N(0,5)
", size=20)
plt.legend()
plt.show()

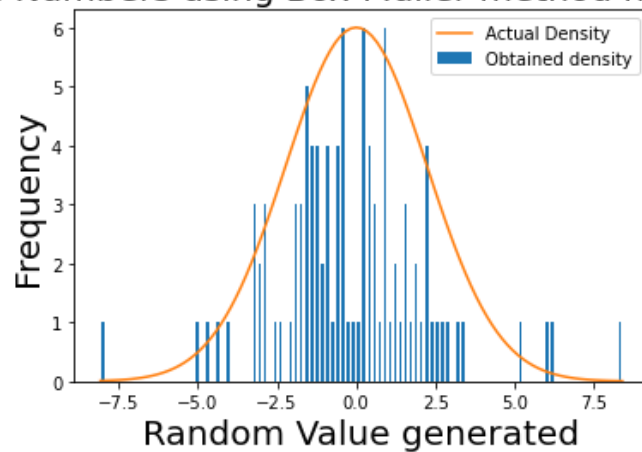
# Now for N(5,5)
Z2= []
for i in Z:
    Z2.append(5+math.sqrt(5)*i)
x1,x2,x3= plt.hist(Z2, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*0*0)/(2.0*5.0))
for x in x2:
    f= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*(x-5)*(x-5))/(2.0*5.0))
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Box-Muller method having distribution N(5,5)
", size=20)
plt.legend()
plt.show()
print("Mean for N=100 is ", Mean[0])
print("Mean for N=10000 is ", Mean[1])
print("Variance for N=100 is ", Variance[0])
print("Variance for N=10000 is ", Variance[1])
print("Time for N=100 is ", Time[0])
print("Time for N=10000 is ", Time[1])

```

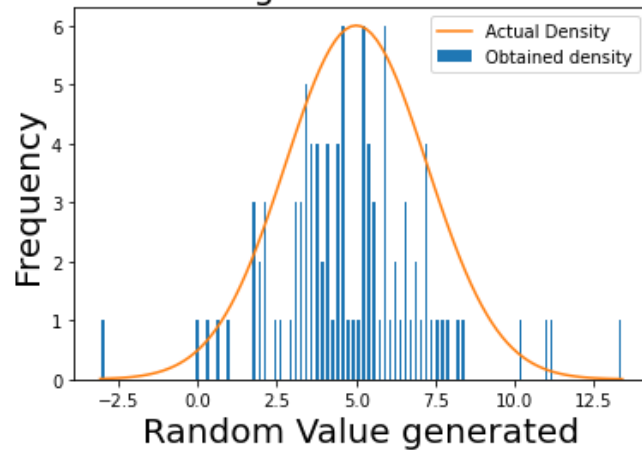
## Generating Random Numbers using Box-Muller method having distribution N(0,1)



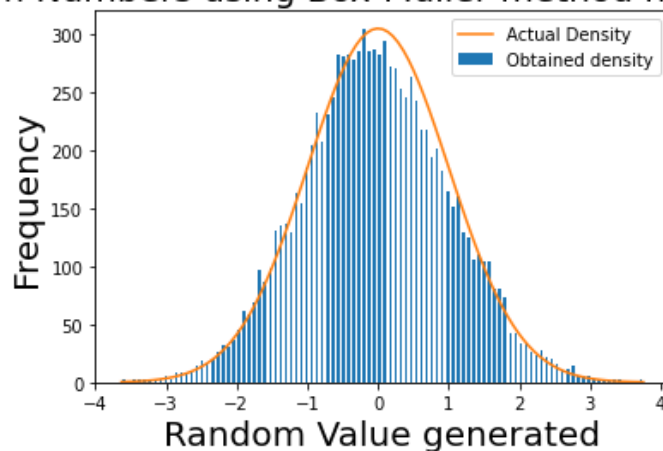
Generating Random Numbers using Box-Muller method having distribution  $N(0,5)$



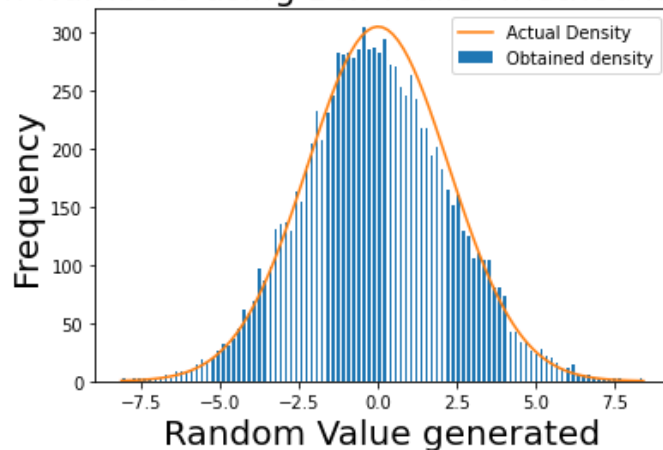
Generating Random Numbers using Box-Muller method having distribution  $N(5,5)$



Generating Random Numbers using Box-Muller method having distribution  $N(0,1)$

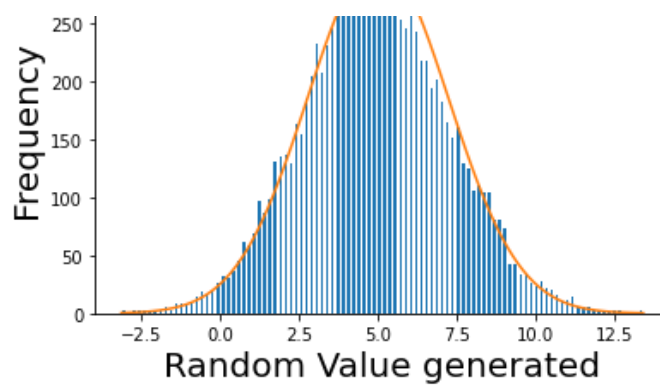


Generating Random Numbers using Box-Muller method having distribution  $N(0,5)$



Generating Random Numbers using Box-Muller method having distribution  $N(5,5)$





Mean for N=100 is -0.08301780364112182  
 Mean for N=10000 is -0.03241891940542742  
 Variance for N=100 is 1.1292005571213954  
 Variance for N=10000 is 1.0704260144375155  
 Time for N=100 is 0.0001995563507080078  
 Time for N=10000 is 0.01676344871520996

## 2) Marsaglia and Bray method

In [5]:

```

Z= []
NoOfValues= [100, 10000]
Mean= []
Variance= []
Time= []
NoOfAcceptedValues= []
NoOfRejectedValues= []

for n in NoOfValues:
    accepted= 0
    rejected= 0
    start= time.time()
    seed_u1=3
    seed_u2=5
    for i in range(0,n//2):
        while(1):
            seed_u1=LCG(1741,2731,12960,seed_u1)
            seed_u2=LCG(1741,2731,12960,seed_u2)
            U1=seed_u1/12960
            U2=seed_u2/12960
            U1= 2*U1-1
            U2= 2*U2-1
            X= pow(U1,2)+pow(U2,2)
            if X<=1:
                accepted+=1
                break
            else:
                rejected+=1
        Y= math.sqrt(-2.0*math.log(X)/X)
        Z1= U1*Y
        Z2= U2*Y
        Z.append(Z1)
        Z.append(Z2)
    # print(Z)
    NoOfAcceptedValues.append(accepted)
    NoOfRejectedValues.append(rejected)
    end= time.time()
    Time.append(end-start)

mean= sum(Z) / len(Z)
variance= sum((k - mean) ** 2 for k in Z) / len(Z)

Mean.append(mean)
Variance.append(variance)
  
```

```

x1,x2,x3= plt.hist(Z, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi))*pow(math.e, (-1*0*0)/2.0)
for x in x2:
    f= (1/math.sqrt(2.00*math.pi))*pow(math.e, (-1*x*x)/2.0)
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Marsaglia & Bray method method having distr
ibution N(0,1)", size=20)
plt.legend()
plt.show()

# Now for N(0,5)
Z1= []
for i in Z:
    Z1.append(0+math.sqrt(5)*i)
x1,x2,x3= plt.hist(Z1, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*0*0)/(2.0*5.0))
for x in x2:
    f= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*x*x)/(2.0*5.0))
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Marsaglia & Bray method method having distr
ibution N(0,5)", size=20)
plt.legend()
plt.show()

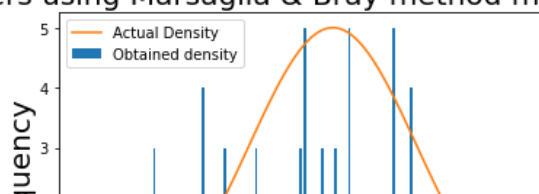
# Now for N(5,5)
Z2= []
for i in Z:
    Z2.append(5+math.sqrt(5)*i)
x1,x2,x3= plt.hist(Z2, bins = 100, rwidth = 0.5, label= "Obtained density")
y= []
c= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*0*0)/(2.0*5.0))
for x in x2:
    f= (1/math.sqrt(2.00*math.pi*5))*pow(math.e, (-1*(x-5)*(x-5))/(2.0*5.0))
    y.append((f*max(x1))/c)
plt.plot(x2,y, label= "Actual Density")
plt.xlabel("Random Value generated", size=20)
plt.ylabel("Frequency", size=20)
plt.title("Generating Random Numbers using Marsaglia & Bray method method having distr
ibution N(5,5)", size=20)
plt.legend()
plt.show()

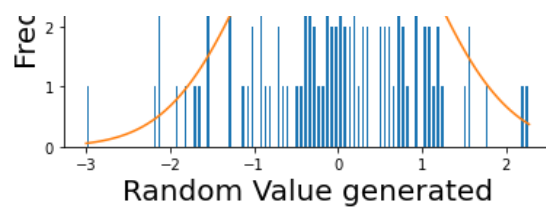
print("Mean for N=100 is ", Mean[0])
print("Mean for N=10000 is ", Mean[1])
print("Variance for N=100 is ", Variance[0])
print("Variance for N=10000 is ", Variance[1])
print("Time for N=100 is ", Time[0])
print("Time for N=10000 is ", Time[1])

print("\n\n")
print("Proportion of values rejected in both cases(100 and 10,1000 values)")
for j in range(0,2):
    print(NoOfRejectedValues[j]*1.00/(NoOfRejectedValues[j]*1.00+NoOfAcceptedValues[j]*1
.00))
print("Actual value of 1-pi/4 : ",1.00-math.pi/4.00)

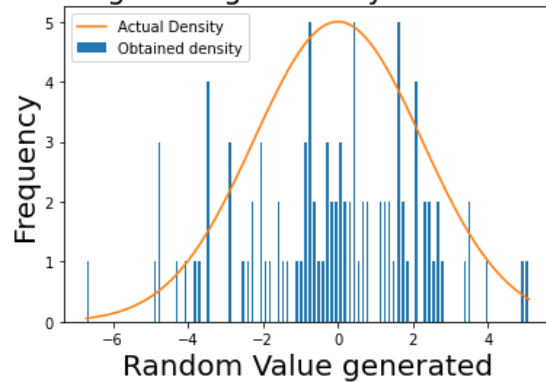
```

### Generating Random Numbers using Marsaglia & Bray method method having distribution N(0,1)

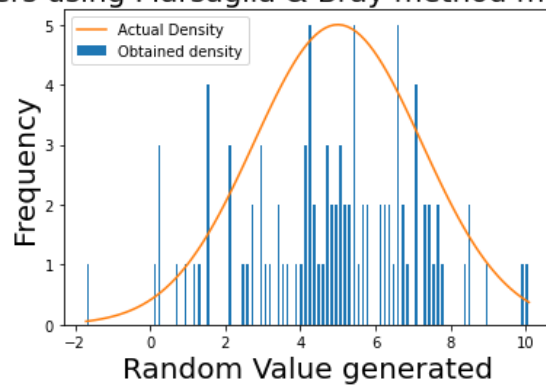




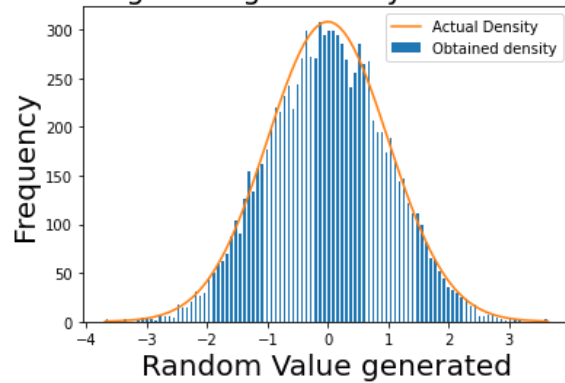
Generating Random Numbers using Marsaglia & Bray method method having distribution  $N(0,5)$



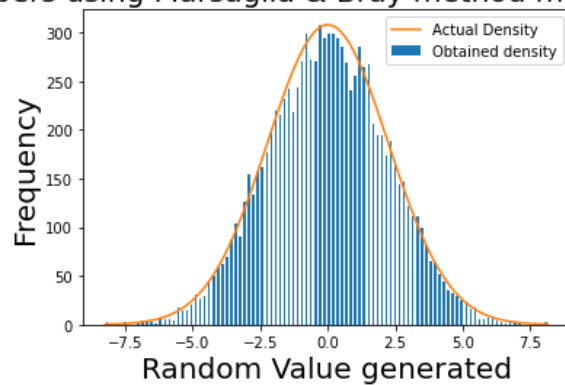
Generating Random Numbers using Marsaglia & Bray method method having distribution  $N(5,5)$



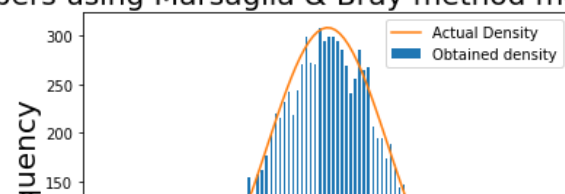
Generating Random Numbers using Marsaglia & Bray method method having distribution  $N(0,1)$

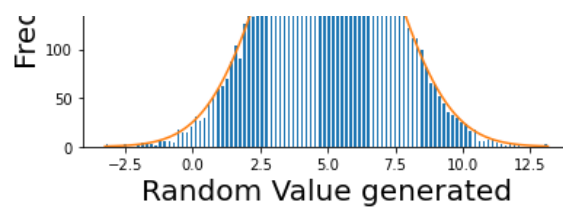


Generating Random Numbers using Marsaglia & Bray method method having distribution  $N(0,5)$



Generating Random Numbers using Marsaglia & Bray method method having distribution  $N(5,5)$





Mean for N=100 is -0.08758640892644651  
 Mean for N=10000 is 0.0008888468932104934  
 Variance for N=100 is 1.0762504461887914  
 Variance for N=10000 is 0.9730110527166492  
 Time for N=100 is 0.00037288665771484375  
 Time for N=10000 is 0.019336462020874023

Proportion of values rejected in both cases (100 and 10,000 values)  
 0.2537313432835821  
 0.22528664394174155  
 Actual value of  $1 - \pi/4$  : 0.21460183660255172

## Question 1(c):

As expected, it is clear that as we generate more samples, our distribution approaches the theoretical plot. \ Changing the mean from 0 to 5 is basically just moving the bars by 5 units towards right, it would not affect the shape of the distribution.

## Question2:

From the above computed time for N=100 and N=10000 for both the methods, we observe that the **Box-Muller method** is a bit faster than the **Marsaglia & Bray method**

## Question 3:

For Marsaglia & Bray method, by keeping the track of proportion of values rejected, we observe :  
**0.2537313432835821** for n=100 \ **0.22528664394174155** for n=10000\ and the theoretical value of  $1 - \pi/4$  is  
**0.21460183660255172**