

# **UNIVERSIDAD NACIONAL DE INGENIERIA**

## **FACULTAD DE CIENCIAS**

**Tema:**  
**Simulación de MonteCarlo**



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**Código:** 20120354I  
**Curso:** Modelamiento y Simulación  
**Código Curso:** CC562

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1. Sean Sea  $U_i \sim U(0,1)$  para  $i \geq 1$ , y si se define a

$$N = \min\{n : \sum_{i=1}^n U_i > 1\}$$

Estimar el  $E[N]$  mediante simulación Monte Carlo.

**Sol:**

**En MATLAB, Numericamente:**

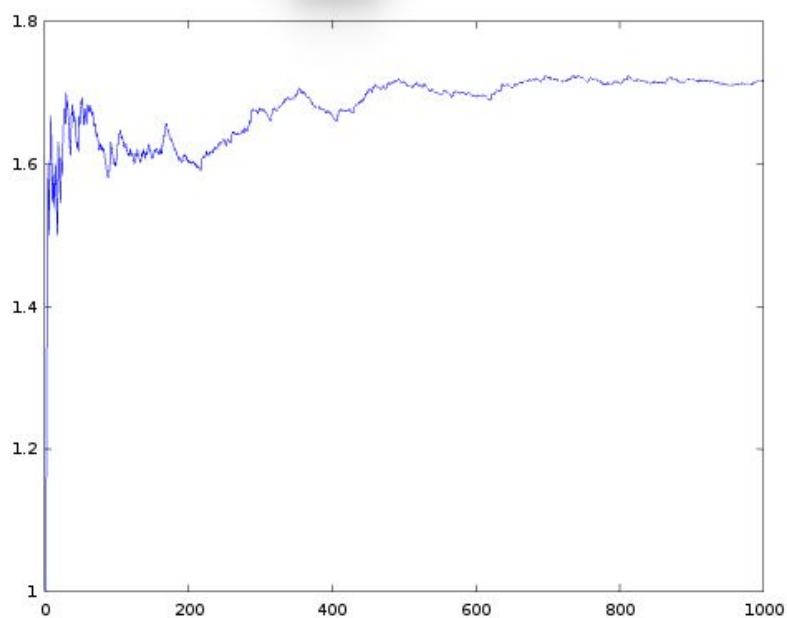
```
minNum=zeros(1000,1);n=1:length(minNum);n=n';sumatoria=zeros(length(minNum),1);
```

```
for m = 1:length(minNum)
    sum=0.0;i=0;x=rand();
    while (sum+x)<1
        i=i+1;sum=sum+x;x=rand();
    end
    sumatoria(m)=sum;
    minNum(m)=i;
end
```

```
E_N=cumsum(minNum)./n;
disp('-----');
disp('4.1 Determinar E[N]:');
fprintf('E[N]= %f \n',E_N(length(E_N)));
plot(n,E_N);
disp('-----');
ans =
```

**Determinar E[N]:**

**E[N]= 1.712000**



2. Aproximar la siguiente integral

$$\int_{-2}^2 e^{x+x^2} dx$$

Comparar con su valor exacto.

**Sol:**

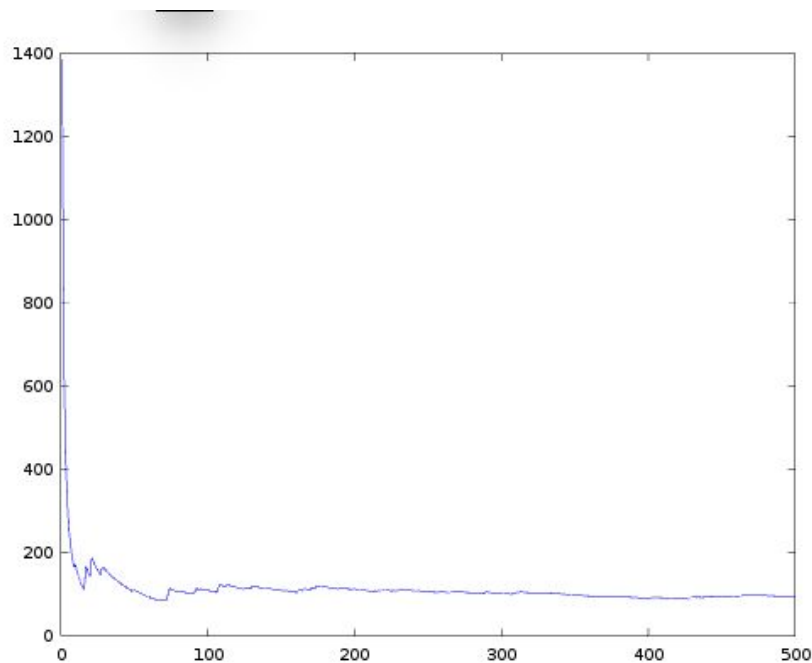
**En MATLAB, Numericamente:**

Se hace el cambio por montecarlo:

$y = \frac{x+2}{4}$ , entonces:  $x = 4y - 2$ , por lo que  $e^{x+x^2} = e^{(4y-2)+(4y-2)^2} = e^{16y^2-12y+2}$  y además se

debe que  $dx = 4dy$ , entonces la integral queda:  $4 \int_0^1 e^{16y^2-12y+2} dy$

```
y=rand(10000,1);
n=1:length(y);
n=n';
int_aprox=4*(cumsum(exp(2)*(1./exp(12*y)).*exp(16.*y.^(2))))./n;
plot(n,int_aprox);
int_aprox(length(y))
ans=93.864
```



**Valor Exacto, Analiticamente:**

Usando el matlab para calcular el valor exacto (pues a mano sale con la función error de taylor)

```
f=@(x) exp(x+x*x);
quad(f,-2,2)
ans = 93.163
```

```
h=@(y) 4*exp(16*y*y-12*y+2);
quad(h,0,1)
ans = 93.163
```

**Error = 93.864 - 93.163 = 0.70100**

3. Sea  $U \sim U(0, 1)$ . Utilizar simulación para aproximar lo siguiente

Se tiene que la covarianza es:

$$\text{Cov}(U, A) = E[UA] - E[U]E[A]$$

3.1.  $\text{Cov}(U, \sqrt{1-U^2})$

3.2.  $\text{Cov}(U^2, \sqrt{1-U^2})$

Sol:

**En MATLAB, Numericamente:**

3.1

```
U=rand(1000,1);
```

```
n=1:length(U);
```

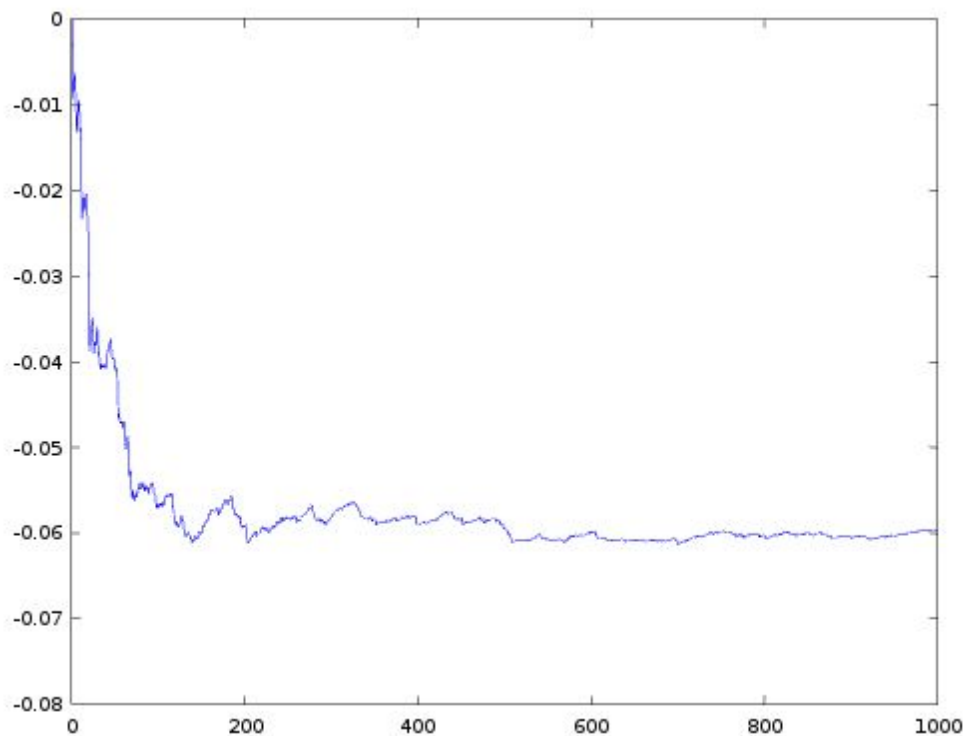
```
n=n';
```

```
aprox=((cumsum(U.*sqrt(1-U.*U)))./n)-((cumsum(U))./n).*((cumsum(sqrt(1-U.*U)))./n);
```

```
plot(n,aprox);
```

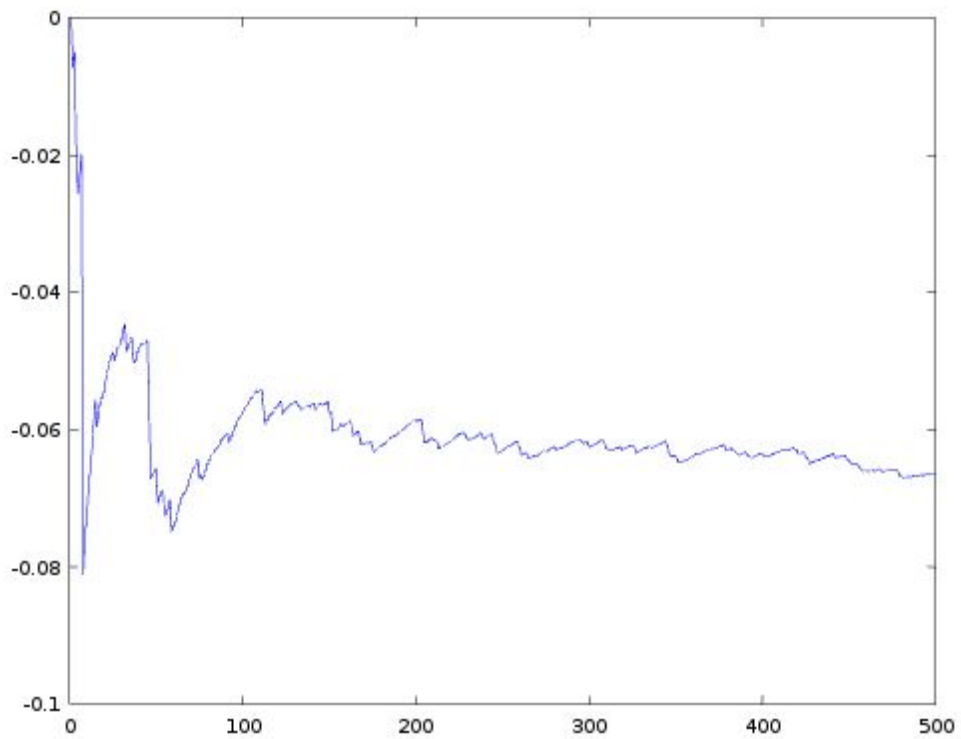
```
aprox(length(U))
```

```
ans = -0.059524
```



3.2

```
U=rand(1000,1);  
n=1:length(U);n=n';  
aprox=((cumsum(U.*U.*sqrt(1-U.*U)))./n)-((cumsum(U.*U))./n).*((cumsum(sqrt(1-U.*U))  
)./n);  
plot(n,aprox)  
aprox(length(U))  
ans = -0.066295
```



4. Sean Sea  $U_i \sim U(0,1)$  para  $i \geq 1$ , y si se define a

$$N = \text{Max}\{n : \prod_{i=0}^n U_i \geq e^{-3}\}$$

Donde  $\prod_{i=1}^0 U_i \equiv 1$

4.1. Determinar  $E[N]$

4.2. Determinar  $P[N = i]$  para  $i = 0, 1, 2, \dots, 6$  por simulación.

Sol:

**En MATLAB, Numericamente:**

```
maxNum=zeros(1000,1);
```

```
n=1:length(maxNum);
```

```
n=n';
```

```
productoria=zeros(1000,1);
```

```
for m = 1:1000
```

```
    prod=1.0;
```

```
    i=0;
```

```
    x=rand();
```

```
    while (prod*x)>=exp(-3)
```

```
        i=i+1;
```

```
        prod=prod*x;
```

```
        x=rand();
```

```
    end
```

```
    productoria(m)=prod;
```

```
    maxNum(m)=i;
```

```
end
```

```
E_N=cumsum(maxNum)./n;
```

```
P_0=cumsum(maxNum==0)./n;
```

```
P_1=cumsum(maxNum==1)./n;
```

```
P_2=cumsum(maxNum==2)./n;
```

```
P_3=cumsum(maxNum==3)./n;
```

```
P_4=cumsum(maxNum==4)./n;
```

```
P_5=cumsum(maxNum==5)./n;
```

```
P_6=cumsum(maxNum==6)./n;
```

```
disp('-----');
```

```
disp('4.1 Determinar E[N]:');
```

```
fprintf('E[N]= %f \n',E_N(length(E_N)));
```

```
plot(n,E_N);
```

```
disp('-----');
```

```
disp('4.2 Determinar P[N] para i = 0,1, ..., 6:');
```

```
fprintf('P[0]= %f \n',P_0(length(P_0)));
```

```
plot(n,P_0);
```

```
fprintf('P[1]= %f \n',P_1(length(P_1)));
```

```
plot(n,P_1);
```

```
fprintf('P[2]= %f \n',P_2(length(P_2)));
```

```
plot(n,P_2);
```

```
fprintf('P[3]= %f \n',P_3(length(P_3)));
```

```
plot(n,P_3);
```

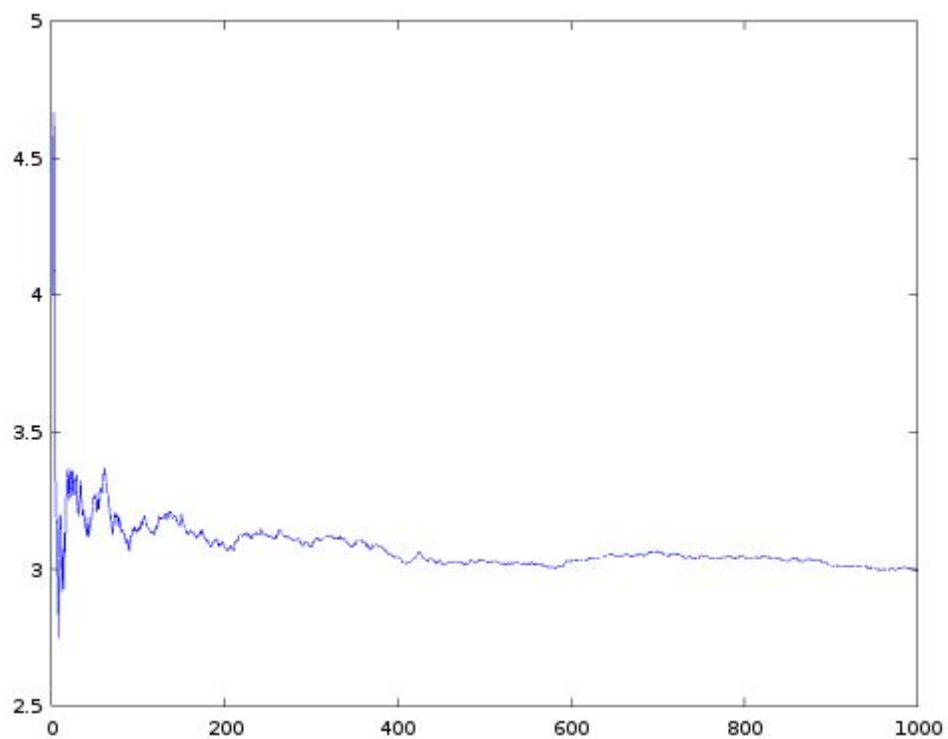
```

fprintf('P[4]= %f \n',P_4(length(P_4)));
plot(n,P_4);
fprintf('P[5]= %f \n',P_5(length(P_5)));
plot(n,P_5);
fprintf('P[6]= %f \n',P_6(length(P_6)));
plot(n,P_6);
disp('-----');
ans =

```

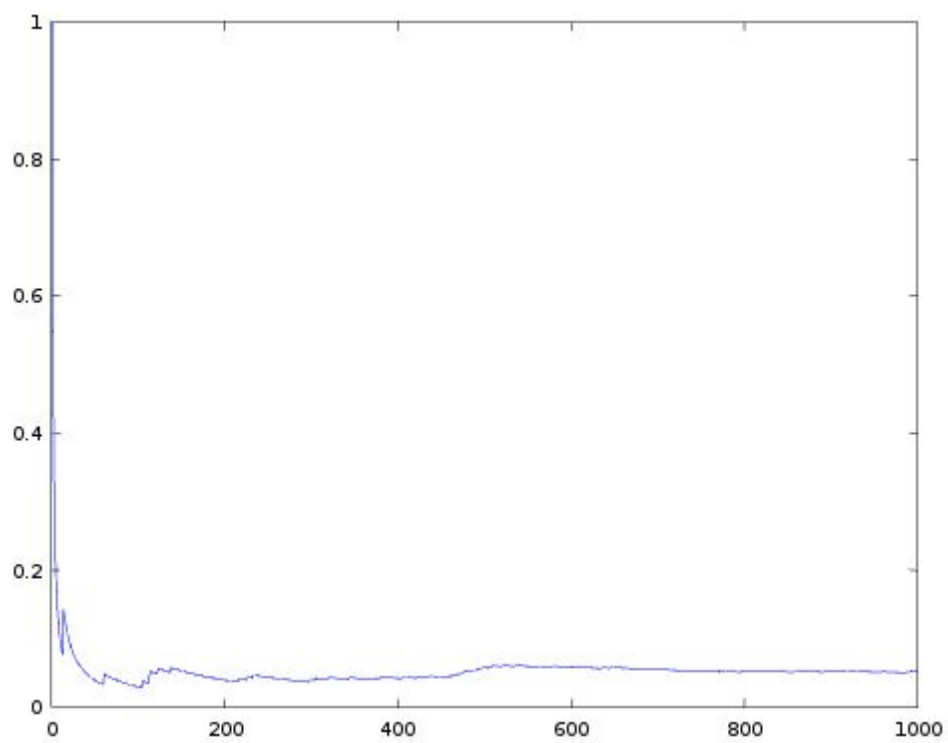
#### 4.1 Determinar $E[N]$ :

$E[N]= 2.937000$

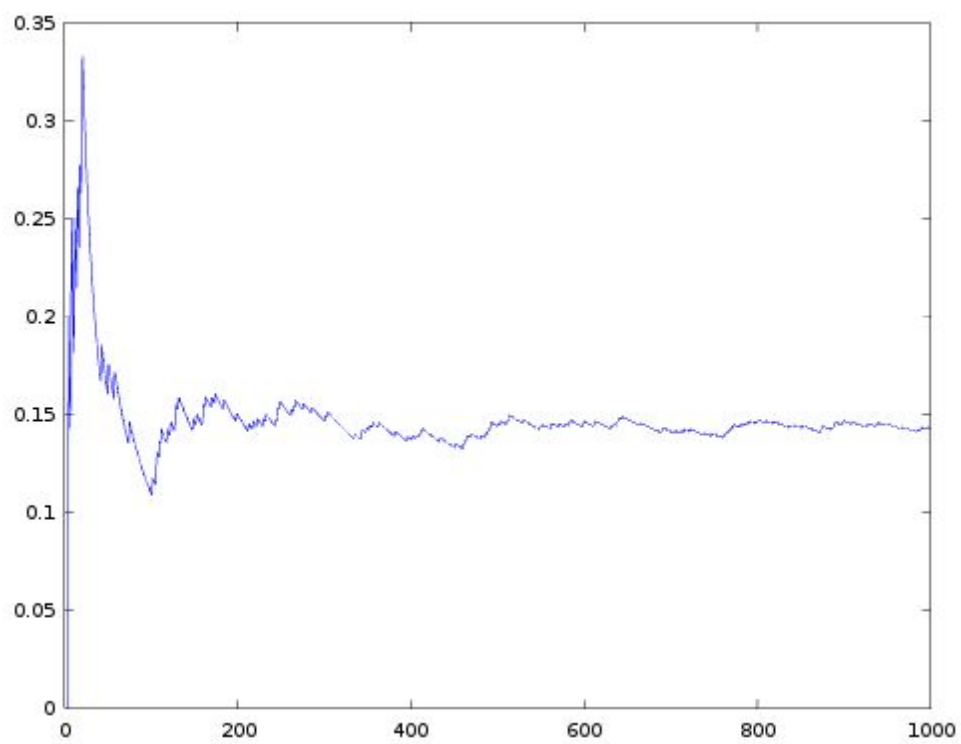


-----  
4.2 Determinar  $P[N]$  para  $i = 0, 1, \dots, 6$ :

$P[0] = 0.052000$

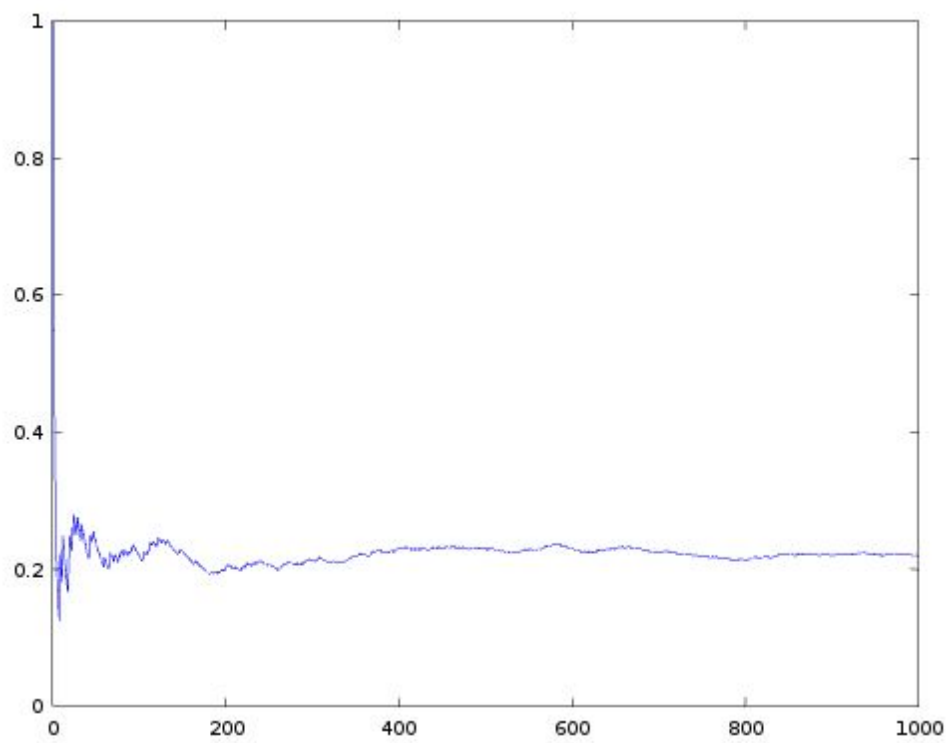


$P[1] = 0.153000$

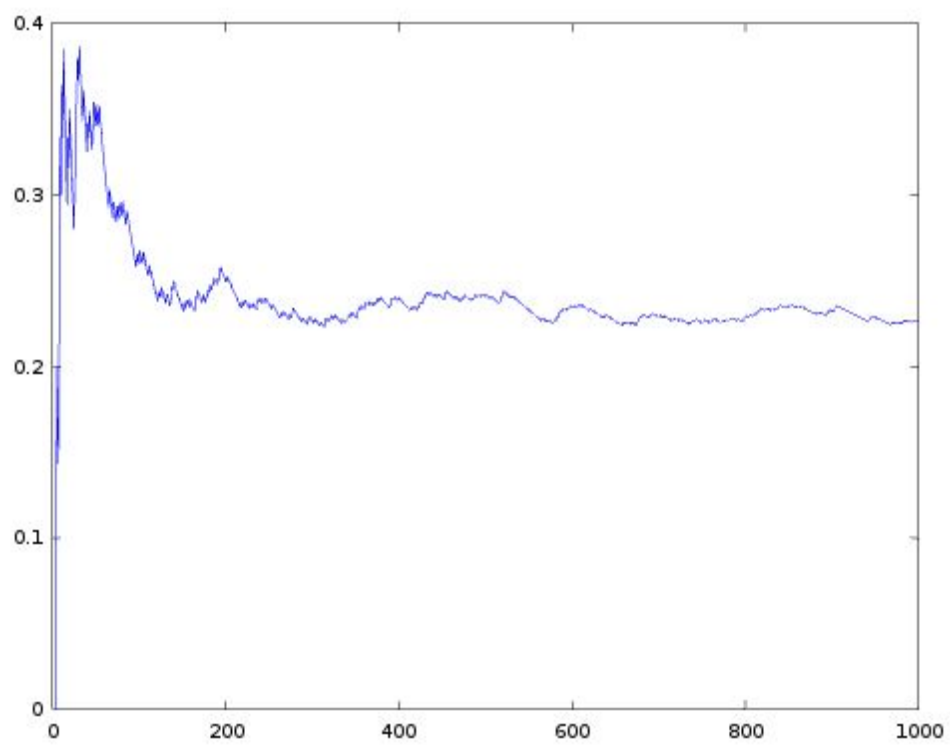




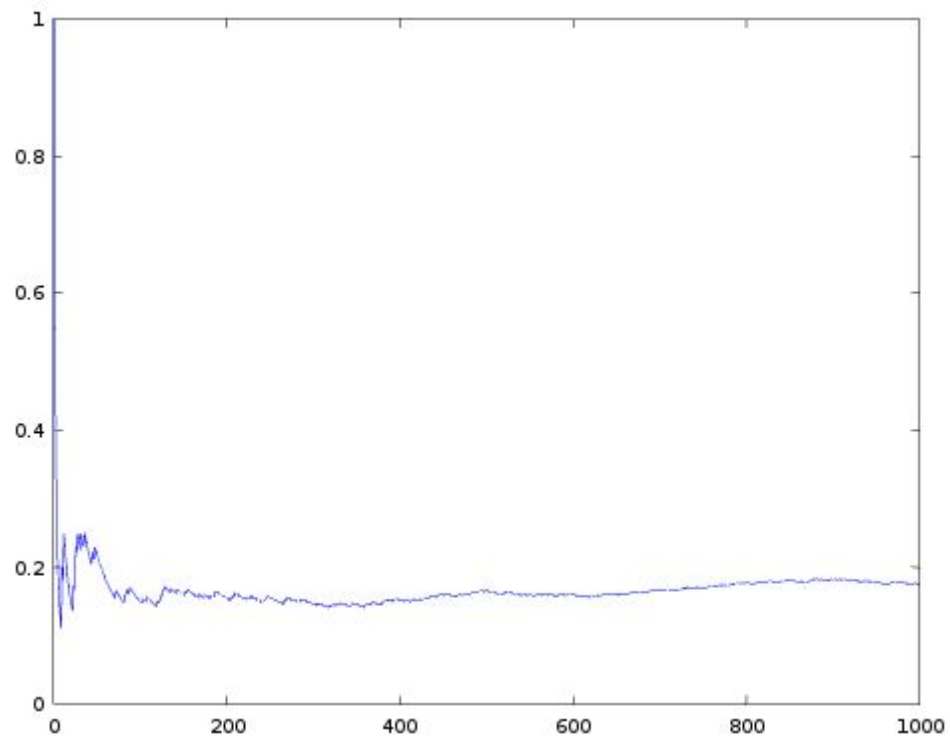
**P[2]= 0.231000**



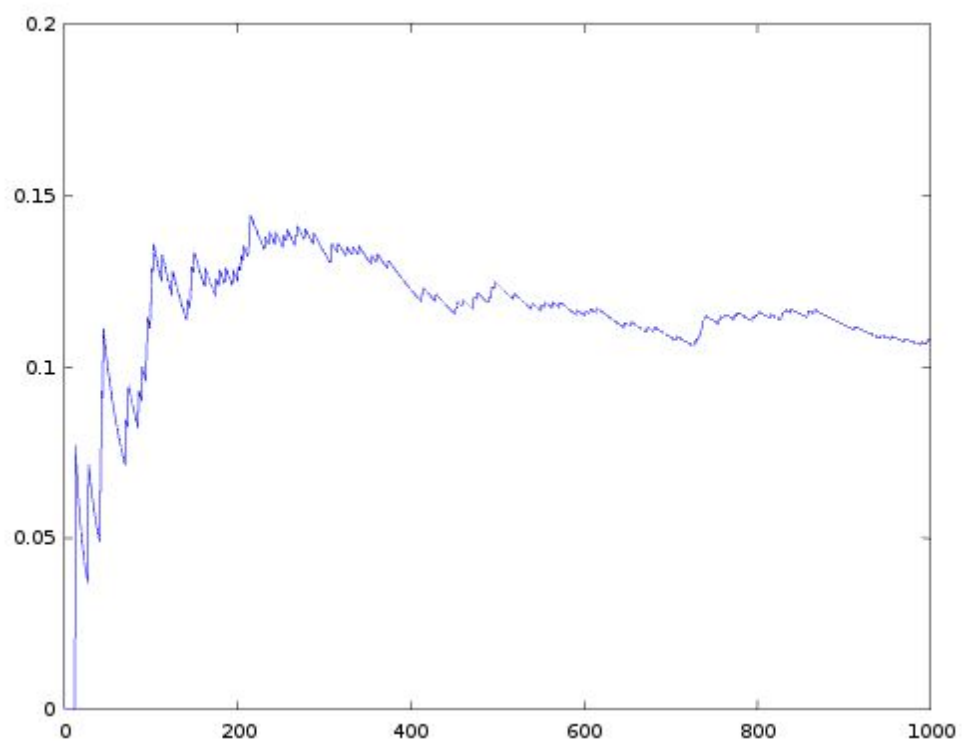
**P[3]= 0.226000**



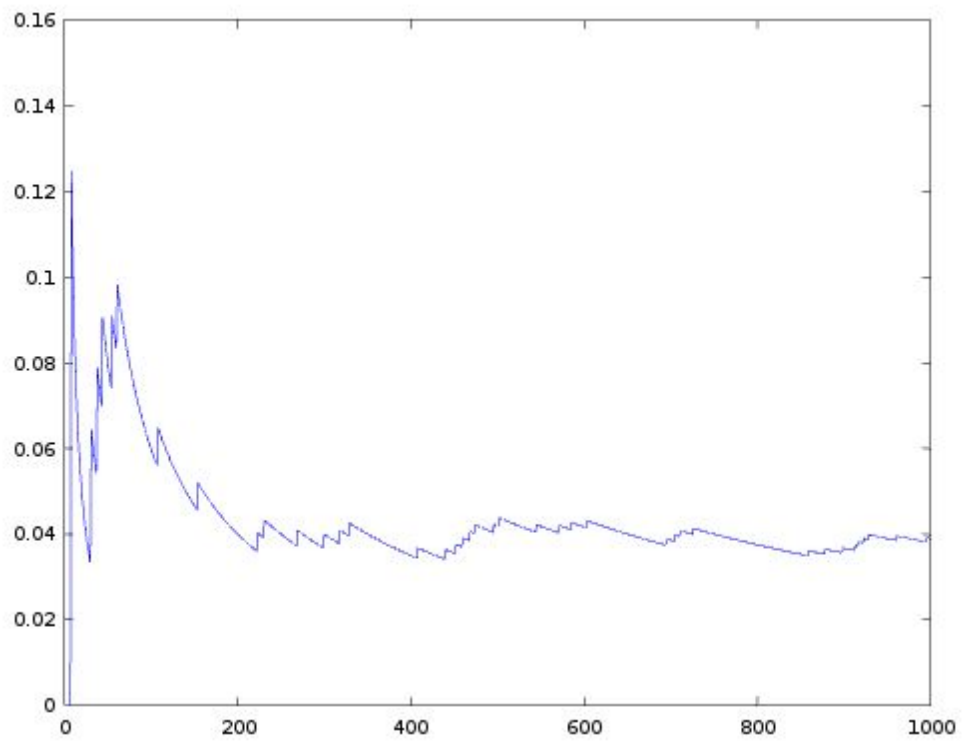
**P[4]= 0.163000**



**P[5]= 0.110000**



$P[6] = 0.036000$



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