# Documentation: Assignment 8

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Q 1 Use the following Monte Carlo estimator to approximate the expected value

$$I = E(exp(\sqrt{U}))$$

#### Code: R

```
1 for (i in 2:5) {
      sample<-runif(10^i)</pre>
      sample<-exp(sample^(0.5))
      mean<-mean(sample)
 5
      variance <-var (sample)
 6
      alpha<-.05
7
      value<-1-alpha/2
8
      left<-mean-(variance^.5)*(qnorm(value,0,1))/(10^(i/2))
      right <-mean+(variance^.5) * (qnorm(value,0,1))/(10^(i/2))
      cat("95\% confidence interval for M = ",10^i," is (",left,",",right,") .\n")
10
11 }
```

## Output:

```
95% confidence interval for M=100 is ( 1.922472 , 2.111564 ) . 
95% confidence interval for M=1000 is ( 1.983088 , 2.036677 ) . 
95% confidence interval for M=10000 is ( 1.988161 , 2.005463 ) . 
95% confidence interval for M=1e+05 is ( 1.997964 , 2.00342 ) .
```

Q 2 Repeat the above exercise using antithetic variates via the following estimator and calculate the percentage of variance reduction:

#### Code: R

```
for(i in 2:5){
     sample<-runif(10^i)</pre>
2
3
     sample1<-runif(10^i)</pre>
4
     sample1 < -exp(sample^{(0.5)})
5
     sample<-(exp(sample^(0.5))+exp((1-sample)^(0.5)))/2
     mean <-mean (sample)
6
7
     mean1<-mean(sample1)</pre>
8
     variance <-var (sample)
9
     variance1<-var(sample1)</pre>
10
     alpha < -.05
11
     value<-1-alpha/2
12
     left <-mean1-(variance1 ^ . 5) * (qnorm (value, 0, 1)) / (10 ^ (i/2))
     right < -mean1 + (variance1^.5) * (qnorm(value, 0, 1)) / (10^(i/2))
13
     14
15
     cat("Variance Reduction Percentage: ",(variance1/2-variance)*100/(variance1/2),"\
         n")
16 }
```

#### **Output:**

```
95% confidence interval for M = 100 is ( 1.911808 , 2.084074 ) .  
Variance Reduction Percentage: 98.96747  
95% confidence interval for M = 1000 is ( 1.963686 , 2.019227 ) .  
Variance Reduction Percentage: 99.01007  
95% confidence interval for M = 10000 is ( 1.992793 , 2.010024 ) .  
Variance Reduction Percentage: 98.89845  
95% confidence interval for M = 1e+05 is ( 1.996319 , 2.001781 ) .  
Variance Reduction Percentage: 98.88595
```

Q 3 Use  $\sqrt{U}$  to construct control variate estimate and repeat the above exercise. Calculate the percentage of variance reduction

#### Code: R

```
for(i in 2:5){
 2
      u<-runif(10^i)
 3
      sample<-exp(u^(0.5))
 4
      y < -u^{\cdot}.5
 5
      mean_y < -mean(y)
      variance_y < -var(y)
 7
      mean <-mean (sample)
8
      variance <-var (sample)
 9
      alpha<-.05
10
      value<-1-alpha/2
11
      c<-(-cov(sample,y))/variance_y
      variance_control_variates<-var(sample+c*(y-mean_y))
12
      left <-mean-(variance^.5) * (qnorm(value,0,1))/(10^(i/2))
13
      right < -mean + (variance^{.5}) * (qnorm(value, 0, 1)) / (10^{(i/2)})
14
      cat("95\% \text{ confidence interval for } M = ",10^i," \text{ is } (",left,",",right,") . \n")
15
16
      cat("Variance Reduction Percentage: ",(variance - variance_control_variates)*100/
           (variance),"\n")
17
```

### Output:

```
95% confidence interval for M = 100 is ( 1.897786, 2.072987). Variance Reduction Percentage: 98.67375
95% confidence interval for M = 1000 is ( 1.952612, 2.008801). Variance Reduction Percentage: 98.61719
95% confidence interval for M = 10000 is ( 1.98517, 2.002491). Variance Reduction Percentage: 98.62091
95% confidence interval for M = 1e+05 is ( 1.995684, 2.001159). Variance Reduction Percentage: 98.59625
```