

**Project # 05****Task 1: --**

The purpose of this task is to introduce you to the term ***Sampling Distribution*** of a statistic. We consider a random sample of  $n$  independent  $x_1, x_1, \dots, x_n$  observations drawn from a large population with (population) mean  $E(X) = \mu$  and (population) variance  $V(X) = \sigma^2$ .

Usually, these two (population) parameters  $\mu$  and  $\sigma^2$  are unknown to us and we use the  $n$  observations in the sample to ***estimate*** these parameters. A natural ***estimator*** for the population mean  $\mu$  is the sample mean

$$\bar{x}_n = \frac{1}{n} \sum_{i=1}^n x_i$$

and a natural ***estimator*** of the population variance  $\sigma^2$  is the sample variance

$$S_n^2 = \frac{1}{n-1} \sum_{i=1}^n (x_i - \bar{x}_n)^2.$$

However, since the values of these two statistics  $\bar{x}_n$ , and  $S_n^2$  depend upon the observed in values in the sample, these sample statistics are actually, also random variables. The distribution of their values (varying from one sample to another) is called ***Sampling Distribution***.

A. You will now use R to generate (simulate), the sampling distribution of the statistic  $\bar{x}_n$  (the sample average) when sampling from the Exponential distribution.

- Generate  $M = 10000$  different random samples, each with  $n = 16$  observations, from the Exponential distribution,  $X \sim \text{Exp}(\lambda = 0.1)$ , which has mean  $\mu = 10$  and a standard deviation  $\sigma = 10$ );

a) Create a table to record the  $M \times n$  sample values

- `M<-10000`
- `n<-16`
- `XSamples<-matrix(rep(0,n*M), M, n)`

b) Generate a different random sample in each row of the matrix

- `for(j in 1:M){XSamples[j, ]<- rexp(n, rate=0.1)}`

c) Calculate the sample mean of each sample (row)

➤ `Xbars<-apply(XSamples, 1, mean)`

d) The question however is what are the mean and the standard deviation of this (sampling) distribution? Get some summary statistics about this distribution.

➤ `mean(Xbars)`

➤ `var(Xbars)`

➤ `sd(Xbars)`

➤ `summary(Xbars)`

e) Let us use denote by  $\mu_{\bar{x}}$  and  $\sigma_{\bar{x}}$  the men and the standard deviation of the sampling distribution of  $\bar{x}_n$ , by part e) above, for a sample of size  $n = 16$ ;

$\mu_{\bar{x}} \approx \underline{\hspace{2cm}}$  and  $\sigma_{\bar{x}} \approx \underline{\hspace{2cm}}$

f) To study the overall shape of this **sampling distribution** of  $\bar{x}_n$ , obtain the histogram of all these  $M = 10000$  sample averages  $\bar{x}_n$  you simulated in each one of the previous step. For example, when  $\lambda = 0.1$ , and  $n = 16$

➤ `hist(Xbars, nclass=30, freq=F, main="Sampling Distribution of Xbar when n=16 and lambda=0.1")`

g) From this histogram you can see that this sampling distribution is relatively symmetric, almost ‘bell-shaped’. Add ‘an approximated’ density curve to the histogram above.

➤ `dens<-density(Xbars)`

➤ `lines(dens$x, dens$y, col=4)`

h) Add to the histogram the density curve of the Normal distribution with mean  $\mu \equiv \mu_{\bar{x}}$  and standard deviation  $\sigma \equiv \sigma_{\bar{x}}$

➤ `start<-mean(Xbars)-4*sd(Xbars)`

➤ `end<-mean(Xbars)+4*sd(Xbars)`

➤ `xx<-seq(start, end, length=200)`

➤ `lines(xx, dnorm(xx, mean(Xbars), sd(Xbars), col=2, lwd=2)`

➤

<b>Complete and Submit the next page</b>
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**Results of Project 4** NAME: \_\_\_\_\_

- i) Repeat a)-h) above for  $n = 32, 64, 128$ , and  $\lambda = 0.1, 1$ , obtain the 6 histogram plots (nicely labeled and graphed) and summarize the results in the table below.

Sampling Distribution of  $\bar{x}_n$  when sampling from the Exponential Distribution  $Exp(\lambda)$ 

$\lambda =$	$\mu =$	$\sigma =$	$n =$	$\mu_{\bar{x}} =$	$\sigma_{\bar{x}} =$
0.1	10	10	32		
			64		
			128		
1	1	1	32		
			64		
			128		

Can you conclude that Sampling Distribution of  $\bar{x}_n$  is approximately the

$$N(\mu_{\bar{x}}, \sigma_{\bar{x}}^2) \text{ distribution with } \mu_{\bar{x}} = \mu \text{ and } \sigma_{\bar{x}} = \frac{\sigma}{\sqrt{n}}$$

Answer: \_\_\_\_\_